

ATOM-ANCHORED LLMs SPEAK CHEMISTRY: A RETROSYNTHESIS DEMONSTRATION

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Paper under double-blind review

ABSTRACT

Applications of machine learning in chemistry are often limited by the scarcity and expense of labeled data, restricting traditional supervised methods. In this work, we introduce a framework for molecular reasoning using general-purpose Large Language Models (LLMs) that operates without requiring labeled training data. Our method anchors chain-of-thought reasoning to the molecular structure by using unique atomic identifiers. First, the LLM performs a zero-shot task to identify relevant fragments and their associated chemical labels or transformation classes. In an optional second step, this position-aware information is used in a few-shot task with provided class examples to predict the chemical transformation. We apply our framework to single-step retrosynthesis, a task where LLMs have previously underperformed. Across academic benchmarks and expert-validated drug discovery molecules, our work enables LLMs to achieve high success rates in identifying chemically plausible reaction sites ($\geq 90\%$), named reaction classes ($\geq 40\%$), and final reactants ($\geq 74\%$). Ultimately, our work establishes a general blueprint for applying LLMs to challenges where molecular reasoning and molecular transformations are key, positioning atom-anchored LLMs as a powerful solution for data-scarce chemistry domains.

1 INTRODUCTION

General-purpose large language models (LLMs) have advanced rapidly in recent years, finding increasing application in the domain of chemistry. A prominent example of this trend is the use of LLMs like GPT-4 Achiam et al. (2023) as high-level reasoning agents that leverage specialized chemistry tools to automate complex tasks Boiko et al. (2023); M. Bran et al. (2024). In this paradigm, the LLM orchestrates tool calls that encapsulate chemical logic and subsequently reasons over the tool outputs.

Beyond the use of general-purpose models, prevailing approaches either train specialized chemistry LLMs or adapt general-purpose LLMs to the chemical domain, where molecular data is represented in the Simplified Molecular Input Line Entry System (SMILES) format Weininger (1988); Weininger et al. (1989), a chemical notation for representing chemical graph structures as computer-readable strings. Examples of specialized chemistry LLMs include models that are solely pre-trained on SMILES data and then either fine-tuned for a specific downstream task (e.g., Ross et al. (2022); Irwin et al. (2022)) or used to extract molecular embeddings for downstream tasks (e.g., Ross et al. (2022); Sadeghi et al. (2024); Masood et al. (2025)). Alternatively, general-purpose LLMs are adapted to the chemical domain through methods such as supervised fine-tuning (SFT) Kim et al. (2024); Cavanagh et al. (2024), preference optimization (PO) Cavanagh et al. (2024), or the direct extraction of task-specific embeddings from general-purpose LLMs Sadeghi et al. (2024). Finally, recent work adapts Chain-of-Thought (CoT) Wei et al. (2023) chemistry reasoning models following the Deepseek-R1 Guo et al. (2025) paradigm, e.g., Ether0 Narayanan et al. (2025) fine-tunes Mistral-Small-24B-Instruct-Mis using SFT on Deepseek-R1 reasoning traces and PO on chemistry tasks.

However, a central challenge in chemical machine learning is the scarcity and high cost of labeled data. This presents a significant limitation, as the aforementioned approaches all rely on labeled data for model training. Nevertheless, recent studies have shown that general-purpose LLMs are capable of reasoning over chemical structures, yet this capability is often exercised indirectly. For instance,

general-purpose LLMs have been used to enrich SMILES with text descriptions to fine-tune smaller models Qian et al. (2023), address diverse chemistry tasks via zero-shot and few-shot prompting with varying success Guo et al. (2023), and solve chemical mathematical calculations by generating and refining code-based solutions Ouyang et al. (2024). A final category of applications addresses synthesis planning, the task of identifying viable synthetic routes by deconstructing a target molecule into smaller precursors using reactions until a set of commercially available starting materials is found Segler et al. (2018); Corey & Cheng (1989). In this context, LLMs can reason about chemical structures to guide and evaluate the synthesis planning process itself based on a desired provided route outcome prompt, without directly manipulating the structures Bran et al. (2025). As LLMs tend to struggle with generating high-quality reaction predictions directly, they can be paired with an evolutionary algorithm to reason over and evolve a population of full synthesis routes Wang et al. (2025). To ensure chemical validity, this process uses a database of known reactions and molecule routes, which are queried via a nearest-neighbor search in an embedding space to identify structurally similar precedents for chemical grounding.

In this work, we build on these insights to introduce a framework that enables general-purpose LLMs to successfully reason directly over molecular structures. Our method works by anchoring the reasoning process to a molecule’s atom-maps, which are unique identifiers for each atom in a molecular SMILES. This approach mirrors a chemist’s workflow, **operates without labeled training data or task-specific model training**, and consists of two stages. First, in a zero-shot task, the model performs a chemical analysis on the chemical structure to identify the atom-maps of relevant fragments for the task and assigns structural labels for these fragments solely based on chemical reasoning. Second, in an optional few-shot task, it transforms the chemical structure based on these identified fragments, guided by examples from a specific chemical transformation class (e.g., a particular reaction or other defined chemical transformation).

We apply this framework to single-step retrosynthesis, where the goal is to identify, given a product molecule, a set of plausible reactant molecules (precursors) that can form the product in a single reaction step Torren-Peraire et al. (2024). Formally, the goal is to learn a function $f(P) \rightarrow [R_1, R_2, \dots, R_n]$ that maps a product molecule P to a ranked list of plausible reactant sets, $[R_1, R_2, \dots, R_n]$, where each R_i is a set of one or more reactant molecules, $\{r_1, r_2, \dots\}$, proposed to synthesize P . In this task, prior research shows that general-purpose LLMs are not competitive with specialized models as they underperform their specialized counterparts by more than 40 percentage points in top-1 accuracy Guo et al. (2023) or solve only one out of five test examples correctly Li et al. (2025). Our approach marks a shift from conventional supervised methods, which either (1) directly map products to reactants using Transformers Irwin et al. (2022); Tetko et al. (2020), Graph Neural Networks Chen & Jung (2021); Zhong et al. (2023), Markov Bridges Igashov et al. (2024), or fine-tuned LLMs Yang et al. (2024); Nguyen-Van et al. (2024), or (2) use a two-step, disconnection-aware paradigm where a model first learns to identify a bond disconnection site and second applies a transformation afterward. Our approach evolves the second paradigm. Whereas these supervised methods apply a learned mapping by selecting a site either automatically Thakkar et al. (2023); Kreutter & Reymond (2023) or with human guidance Thakkar et al. (2023); Westerlund et al. (2025), our work introduces explicit chemical reasoning as the core mechanism for both steps, leading to the following key contributions:

1. We introduce a novel reasoning framework that enables LLMs to zero-shot analyze and few-shot transform molecular structures without task-specific training by anchoring their reasoning process directly to the molecule’s SMILES atom maps, thereby eliminating the need for labeled training data or task-specific model training.
2. We demonstrate the framework’s effectiveness in single-step retrosynthesis on both academic benchmarks and expert-validated real drug discovery molecules, where it successfully identifies strategic disconnections, executes the corresponding transformation to predict reactant structures, and provides a chemically-grounded, explainable rationale for its predictions.
3. We establish a general blueprint for applying LLMs to challenges requiring molecular reasoning and molecular transformations, positioning atom-anchored LLMs as a powerful, data-efficient alternative to supervised learning in low-data chemistry regimes.

2 METHODS

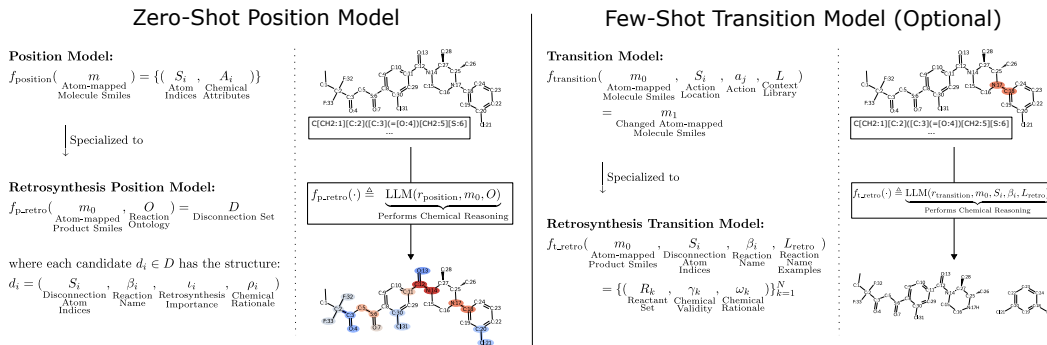


Figure 1: Adaptation of our general framework to the task of retrosynthesis. First, the Zero-Shot Position Model ($f_{\text{position_retro}}$ or $f_{\text{p_retro}}$, guided by r_{position}) analyzes an atom-mapped product m_0 together with the reaction ontology O to identify and rank disconnection candidates ($S_i, \beta_i, \gamma_i, \rho_i$). Second, the (optional) Few-Shot Transition Model ($f_{\text{transition_retro}}$ or $f_{\text{t_retro}}$, guided by $r_{\text{transition}}$ and a library L_{retro} of β_i reaction examples) applies the selected reaction β_i at the site S_i to generate plausible reactant molecules (R_k) with validity assessment (γ_k) and chemical rationale (ω_k).

2.1 FRAMEWORK

Conventional drug discovery models learn a direct mapping $f: \mathcal{X} \rightarrow \mathcal{Y}$, treating molecular representations $x \in \mathcal{X}$ as abstract data points to predict properties $y \in \mathcal{Y}$. This paradigm disregards the underlying chemical knowledge that could govern the relationship r between a molecule’s structure and its properties. In contrast, our approach circumvents this data-driven mapping by leveraging the emergent reasoning capabilities of a pre-trained LLM. Guided by a natural language prompt, the LLM performs a detailed chemical analysis with its reasoning explicitly anchored to the molecule’s SMILES atom maps, ensuring a precise linkage to specific structural locations. This structurally-grounded analysis enables the direct inference of chemical properties, eliminating the need for task-specific fine-tuning. Our approach operates in two stages:

- 1. Zero-Shot Structural Analysis and Property Prediction (Position Model):** Guided by a natural language prompt r_{position} that encodes domain knowledge about the task, the LLM analyzes an atom-mapped molecule SMILES m to identify relevant substructures. Based on this prompt-guided reasoning, which is explicitly linked to atom map indices, the position model $f_{\text{position}}(m)$ predicts a set of properties $P = \{p_1, \dots, p_n\}$. Each prediction p_i is a tuple $p_i = (S_i, A_i)$, where $S_i \subseteq V(m)$ is a set of atom indices from the molecule m (the structural label), and $A_i = (a_1, a_2, \dots, a_k)$ is an ordered tuple of inferred chemical attributes relevant to the task (e.g., "toxic," "reaction"). Each individual attribute a_i in this tuple can be a passive descriptor or an actionable transformation.
- 2. Prompt-Guided Molecular Transformation (Transition Model):** In an optional second phase, predictions $p_i = (S_i, A_i)$ containing an actionable transformation in their attribute tuple A_i are executed. For each general chemical task, a transformation function $f_{\text{transition}}$ is defined by a second natural language prompt $r_{\text{transition}}$. This transition function executes an actionable attribute $a_j \in A_i$ by applying $f_{\text{transition}}$ to an initial molecule m_0 at the location S_i to yield a new molecule m_1 , such that $m_1 = f_{\text{transition}}(m_0, S_i, a_j, L)$. Here, L is a context library providing examples or any relevant information for the established chemical operations identified by the actionable attribute a_i from the tuple A_i . This is feasible because many chemical transformations are discrete, well-established operations, allowing in-context learning to ensure chemical validity.

2.2 A POSITION MODEL FOR RETROSYNTHESIS

The Position Model emulates a human chemist’s analytical workflow to identify and rank potential disconnection sites in a product molecule. Formally, given an atom-mapped product molecule m , the

Position Model is a function $f_{\text{position.retro}}(m)$ that predicts a set of potential retrosynthetic disconnection candidates, $D = \{d_1, d_2, \dots, d_N\}$. Each candidate $d_i = (S_i, \beta_i, \iota_i, \rho_i)$, which instantiates the general property prediction $p_i = (S_i, A_i)$ for retrosynthesis, is generated by the function:

$$D = \{(S_i, \beta_i, \iota_i, \rho_i)\}_{i=1}^N = f_{\text{position.retro}}(m_0, O)$$

This function maps a set of inputs:

- m_0 : The atom-mapped target product molecule canonicalized SMILES.
- O : A reaction ontology containing reaction names corresponding to a library of executable transformations L , providing a bridge to the optional transformation phase.

to a set of N distinct tuples:

- $S_i \subseteq V(m)$ is the structural label: a set of atom indices defining the disconnection point.
- β_i is the predicted reaction name: a chemical attribute identifying a suitable transformation (e.g., "Suzuki Coupling"). To make this actionable, we ground predictions using the reaction ontology (O), but do not strictly constrain them, allowing the suggestion of reactions outside of O (which are flagged).
- $\iota_i \in \mathbb{R}$ is the retrosynthesis importance: a score ranking the strategic value of the disconnection, which can be used to prioritize the most promising reactions (e.g., major ring-forming reactions, core scaffold construction).
- ρ_i is the chemical rationale: a text-based justification tied to primary strategic goals of retrosynthesis (e.g., structural simplification, reaction robustness, and stereochemical control).

The entire reasoning process of $f_{\text{position.retro}}$ is defined by a natural language prompt r_{position} (see Prompt 1). Crucially, r_{position} does not contain explicit transformation rules (e.g., SMARTS patterns) or any other reaction-specific rules. Instead, it instructs the LLM to emulate a chemist’s analytical workflow. Reframing the retrosynthesis task necessitates a shift in evaluation, moving beyond classical top-n performance based on product-reactant replication. Our evaluation instead measures the model’s ability to correctly identify the ground-truth disconnection site and reaction type, for which the following metrics are defined:

1. Partial Match Accuracy: An indicator metric that is true if any predicted disconnection $S_i \in D$ has a non-empty intersection with the ground truth S_{gt} .
2. Best Match Jaccard: The highest Jaccard similarity between any predicted structural label $S_i \in D$ and the ground truth set S_{gt} .
3. Exact Match Accuracy: A stricter metric that is true if the best-matching predicted disconnection site (by Jaccard score) is identical to the ground truth S_{gt} .
4. Conditional Reaction Accuracy: Conditional on a partial match and the highest Jaccard similarity in D , this metric evaluates the reaction name(s) β_i from the disconnection candidate(s) d_i . The metric is 1 if any of these β_i match the ground truth reaction name, β_{gt} .

2.3 A TRANSITION MODEL FOR RETROSYNTHESIS

To complete the retrosynthesis workflow, we define the Transition Model as $f_{\text{transition.retro}}$. This model uses a disconnection candidate d_i and a target product m_0 to generate a set of plausible reactants R . To simulate a chemist’s literature lookup for a reaction, the reaction name $\beta_i \in O$ is used to sample up to five reaction examples from a training dataset to create the task-specific, in-context library L_{retro} . The one-to-many Transition Model is then defined as:

$$\{(R_k, \gamma_k, \omega_k)\}_{k=1}^N = f_{\text{transition.retro}}(m_0, S_i, \beta_i, L_{\text{retro}})$$

This function maps a single set of inputs:

- m_0 : The atom-mapped target product molecule canonicalized SMILES.
- S_i : The set of disconnection point atom indices.

- β_i : The reaction name, serving as the actionable attribute a_j .
- L_{retro} : The context library, containing examples of the reaction β_i .

to a set of N distinct tuples:

- R_k : The k -th predicted set of reactant molecules $\{r_1, r_2, \dots, r_n\}$.
- γ_k : The specific chemical validity assessment (stability, chemoselectivity, stereochemical consistency) for the transformation leading to R_k .
- ω_k : The specific chemical rationale that justifies the validity of the k -th outcome.

The transition function $f_{\text{transition_retro}}$ is defined by prompt $r_{\text{transition}}$ (see Prompt 2), which emulates a chemist’s reasoning and avoids explicit reaction rules. Beyond reactant prediction, the model can also generalize transformations by abstracting a reaction template R_t , which is flagged accordingly. This template can handle complex cases, such as multiple atoms being viable for reaction side or added reagents, thereby preventing exhaustive iteration. We evaluate performance by comparing the predicted reactant sets, $R_{\text{pred}} = \{R_1, \dots, R_N\}$, against the ground-truth reactants, R_{gt} . As multiple reactant sets can be chemically valid, our goal is to assess the model’s ability to recover the known, ground-truth transformation without ranking. The following metrics are calculated per-prediction and averaged across the dataset.

1. Template Accuracy: measures if any predicted reactant template set $R_t \in R_{\text{pred}}$ correctly identifies the core structure of the ground-truth reactants R_{gt} . A prediction is considered a match if for every ground-truth reactant $r_{\text{gt}} \in R_{\text{gt}}$ there is a corresponding predicted reactant template $r_t \in R_t$ sharing at least 75% of its atoms and having a direct substructure match.
2. Reactant Accuracy: measures if any predicted reactant set R_k is an exact, non-template match for the ground-truth set R_{gt} .
3. Combined Accuracy: measures if a prediction meets either the Template or Reactant Accuracy criterion.

2.4 EXPERIMENTAL SETUP

We evaluate the Position ($f_{\text{position_retro}}$) and Transition ($f_{\text{transition_retro}}$) models across a diverse set of LLMs to assess the scaling of reasoning capabilities. Our selection includes various open-source models (Qwen3-2507 4B, 30B, 235B Yang et al. (2025), DeepSeek-R1-0528 Guo et al. (2025)), several closed-source models (Gemini 2.5 Flash/Pro Comanici et al. (2025), Claude Sonnet 4 Anthropic (2025), GPT5 OpenAI (2025)), and a chemistry-specialized model, Ether0 Narayanan et al. (2025). For efficiency, the largest open-source models were quantized for inference on an 8x H100 DGX node and used default inference parameters (see Table 2).

We use two public reaction datasets: USPTO50k Lowe (2012); Schneider et al. (2016) and PaRoutes Genheden & Bjerrum (2022). For USPTO50k ($n \approx 5 \times 10^4$), we use an adjusted version that corrects a known atom-mapping bias Somnath et al. (2021). For PaRoutes ($n \approx 1 \times 10^6$), we use the provided data splits Torren-Peraire et al. (2024). For all datasets, we preprocess the data to generate structural labels (S_i), reaction names (β_i) and reaction ontology (O). The labels (S_i) define the reaction center by annotating atoms of bonds that are broken, formed, or changed in type from the product’s perspective. We prioritize changes in connectivity (bonds breaking or forming) over bond type changes, where the atom structure itself remains unchanged, unless no connectivity change occurs. The reaction names (β_i) and their reaction classes are extracted using the open-source rxn-insight package Dobbelaere et al. (2024), allowing the release of our labeled data. The ontology (O) is constructed from unique reaction names (β_i) in the respective training data. To mitigate the skewed distribution of reaction names in the USPTO50k test set ($n = 5 \times 10^3$) and prevent redundant evaluation, we create a subsampled version, USPTO50k-LLM (see Figure 5). This 541-point evaluation set contains up to five examples per unique reaction name, preserving the original proportion of unclassified reactions. Unless specified otherwise, we use this set with a reaction ontology ($n = 136$) derived from the USPTO50k training data.

3 RESULTS

3.1 POSITION MODEL

Our analysis of structural chemical reasoning shows performance scales with model size, with large closed-source models such as the top-performing Gemini 2.5 Pro required for the best results (see Figure 2). We evaluated models on four tasks of increasing difficulty: partial position match, maximizing Jaccard overlap, exact position match, and correct reaction prediction given a partial match. A consistent pattern emerged, where performance increased with the size of the model. For instance, partial match scores jumped from 73% for 4B models to 87% for 235B+ models. This trend held across all tasks, with the performance gap becoming most stark on the reaction prediction task, where smaller models scored just 4%. In contrast, only the largest proprietary models achieved a moderate success rate of 40-47%, showing a trade-off between higher accuracy and lower prediction efficiency (i.e., more predictions per success; see Table 4). While performance depends on model size, disconnection prediction success is effectively decoupled from molecular size (see Figure 7).

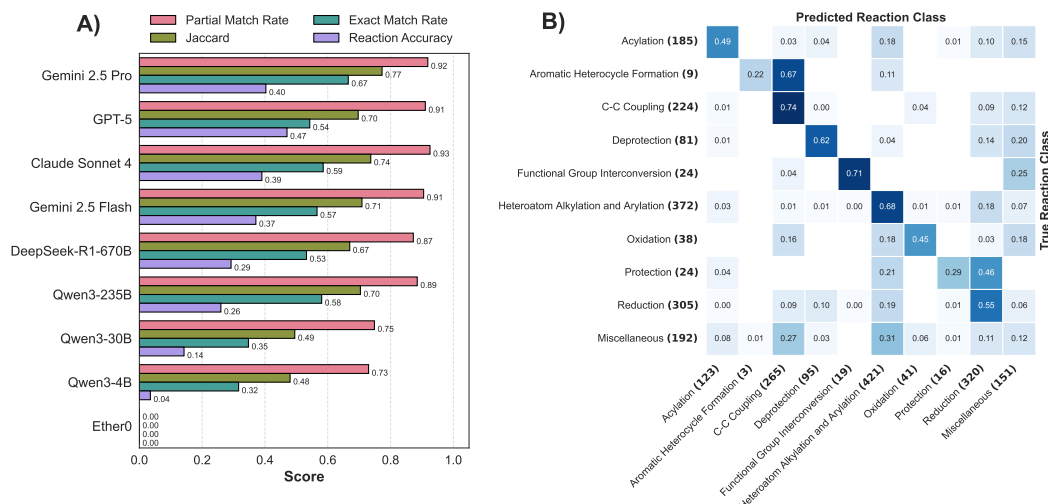


Figure 2: **A)** Position model performance on USPTO-LLM. The plot compares various foundation models on the task of reaction position prediction, measured by four evaluation metrics: achieving a partial positional match, maximizing the Jaccard metric, identifying the exact position, and predicting the correct reaction (conditional on a partial match). **B)** Confusion matrix of predicted versus ground-truth reaction classes for the Gemini 2.5 Pro model on USPTO-LLM. The analysis is conditional, including only predictions where the model successfully identified at least a partial positional match. For this visualization, reactions outside the defined reaction ontology were excluded. The matrix was generated using the original class-to-name mappings from the ground-truth data, with any unassigned reactions grouped into the 'Miscellaneous' category.

Three models warrant a specific discussion. First, the Ether0 model, a Mistral-24B variant fine-tuned for chemistry, fails to produce any valid predictions, generating neither valid outputs nor chemically valid positions, unlike other models that fail only occasionally (see Table 4). This total failure suggests that its specialized training, which utilizes chemistry reasoning traces and GRPO on chemical tasks, hindered generalizability to our problem. Second, an ablation of Qwen-235B-Instruct reveals a trade-off with its thinking counterpart. Despite a comparable partial match score, the instruct model showed poor prediction efficiency, generating far more candidate positions, and was only half as effective at identifying the correct reaction (see Table 4), highlighting the importance of CoT reasoning. Interestingly, this pattern does not appear for Gemini 2.5 Flash, where its thinking and non-thinking versions perform comparably with high reaction accuracy and low prediction efficiency.

Our problem involves a one-to-many relationship in which a chemical position can have multiple valid reactions. To evaluate one of the best performing models, Gemini 2.5 Pro, we mapped its predictions to broader reaction classes using the reaction class mapping from rxn-insight on the ground truth data (see Figure 2). The model often suggests alternative reactions from the correct class rather

than predicting a reaction from a different class. However, some exceptions represented chemically plausible alternative strategies: for 'Aromatic Heterocycle Formation', the model often predicted 'C-C couplings', and for 'Protection' reactions, it suggested 'Reductions'. The 'Heteroatom Alkylation and Arylation' class was a notable outlier, being proposed for most other categories except 'FGI' and 'C-C couplings'. This predictive pattern of staying within-class and these specific exceptions also holds at the individual reaction-name level (see Figure 6).

3.2 TRANSITION MODEL

We evaluated various LLMs on their ability to predict ground-truth transformations using the reaction’s position, name, and up to five examples (see Figure 3). Model performance scales logarithmically with size before plateauing at the scale of Deepseek-R1. Gemini 2.5 Pro is the top performer, excelling both at direct reactant prediction ("Reactant"; see example Figure 13) and in combination with a reaction template ("Combined"). This template generation ("Template"; see example Figure 14), which is a proxy for chemical understanding, is strongest in proprietary models, such as GPT-5 and Gemini 2.5 Pro (44% accuracy). In contrast, Deepseek-R1 performs worse than its smaller open-source peers in template prediction, while Ether0 fails again at this task.

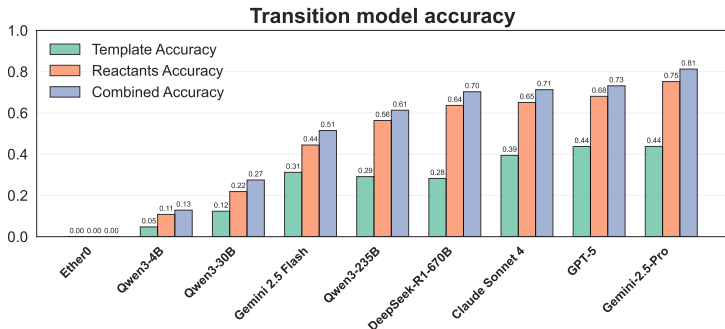
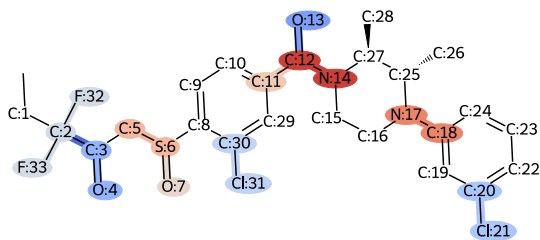


Figure 3: Transition Model Performance on USPTO-LLM. The plot evaluates various LLMs on their ability to predict chemical transformations. Accuracy is measured using three metrics: direct reactant prediction ('Reactants'), valid template generation ('Template'), and a combined approach where either is considered a success ('Combined').

In a first ablation study, our results reveal the critical importance of a defined reaction name to act as a *chemical anchor* (see Figure 8). Performance dropped by approx. 50% for unknown reactions in a zero-shot setting (no examples provided) compared to known ones in a few-shot setting (up to five examples). The decline was particularly severe for the prediction of direct reactants, with accuracy falling from approximately 75% to 30%. In a second ablation study on Gemini 2.5 Pro, we further isolate the contributions of prompt detail versus few-shot examples on overall ("combined") performance (see Figure 9). Although the model achieved (52%) baseline accuracy from a minimal prompt, and the detailed prompts offered some improvement through the reaction template (59%), the inclusion of examples was the dominant factor (69%); a simple prompt with examples was much more effective than a detailed prompt without them. The best performance required both (81%). Finally, CoT reasoning improves reactant and combined accuracy, but it underperforms non-reasoning models on reaction template prediction, at the cost of lower prediction efficiency (see Qwen3-235B in Table 5).

With performance again independent of molecular size (see Figure 10), analyzing LLM failure modes reveals two distinct error types. First, reaction class-specific performance variations among the top-performing models indicate that no single model is universally superior, suggesting solutions such as multi-model ensembles or best-of-n sampling (see Figure 11). Second, all models consistently fail on a small set of reaction classes with few data points (e.g., Wohl-Ziegler bromination). This systemic failure likely stems from data deficiencies, such as incorrect labeling and poor examples that make the task ill-posed, rather than fundamental mechanistic reasoning challenges for current LLM architectures.

4 APPLICATION

**Priority 1: C:12 N:14****Reaction:** Carboxylic acid to amide conversion**Importance:** 4 - **Ontology:** True

Rationale: Identified via Inter-Fragment Analysis, this is a very high-impact, convergent disconnection linking the chiral piperazine amine and the aryl carboxylic acid core, drastically simplifying the molecule (Goals a, c). The forward reaction (amide coupling) is robust and high-yielding (Goal b). No major chemoselectivity issues are expected with modern coupling reagents.

Figure 4: Zero-shot position model prediction for compound LEI-515 Jiang et al. (2023) using the PaRoutes reaction ontology highlighting reaction priority 1. See Table 6 for all priorities (1-14).

While LLMs demonstrated strong performance on USPTO50k, such academic tests risk data contamination for models pre-trained on vast data corpora. To conduct a more rigorous, real-world validation, we evaluated our approach on five molecules that were previously synthesized and published in high-impact journals (see Figure 12), for which we were able to discuss the experimental procedures with the respective lab chemists. Although this small sample size prevents broad statistical generalization, the case study provides a crucial assessment of the model’s practical capabilities and limitations. For this evaluation, we used one of our top-performing LLMs (Gemini 2.5 Pro) with the PaRoutes reaction ontology (n=335) and annotated atom-maps by sequentially counting the atoms in a canonicalized SMILES. Our position model first proposed potential disconnection points, which the respective lab chemist of the molecule then curated for chemical relevance and to avoid redundancy for the transition model evaluation (an example for LEI-515 is provided in Table 6). This process yielded 63 distinct position predictions for assessment and 19 selected positions with a total of 98 transitions. Afterwards, the chemist assessed these predictions against predefined questions, and we calculated accuracy as the percentage of correct model responses (see Table 1).

Table 1: Questions for chemists with regard to the Position model (P) and Transition Model (T). n indicates here the overall number of data points and accuracy (Acc.), as well as the percentage of correct predictions. Actionable refers here to non-template and not to chemically invalid predicted reactant sets from the model. We provide a full overview in the appendix (see Table 8 & 9)

Question	n	Acc.
P1: Disconnection position chemically plausible?	63	90.5
P2: Reaction correct for the proposed disconnection position?	63	85.7
P3: Chemical reasoning correct for the position and reaction?	63	73.0
P4: Given all the information, could this reaction realistically work in the lab?	63	77.8
P5: Specific reaction successfully performed in the lab for the molecule?	63	25.4
P6: Strategically important disconnection predictions missing for the molecule?	5	80.0
T1: Given a predicted reaction template, does it capture the underlying reaction?	16	81.3
T2: Given a predicted reaction template, is the chemical reasoning correct?	16	87.5
T3: Among the reactant predictions, is there at least one chemically correct set?	19	89.5
T4: Given the correct set of reactants, is the chemical reasoning also correct?	19	89.5
T5: Given the reaction was used in the lab, are the predicted reactants the same?	15	73.3
T6: Given that the reactants are flagged 'chemically invalid', is the reasoning correct?	7	100
T7: What % of all the actionable suggested reactants are chemically correct?	98	74.5

The case study results were highly encouraging. The model’s suggested disconnection points (90.5%) and associated reaction names (85.7%) were overwhelmingly judged as chemically plausible, with the latter often providing non-obvious alternatives to our expert chemists. While the accuracy for chemical reasoning was lower (73.0%), a majority of all suggestions (77.8%) were

deemed applicable in a laboratory setting. Notably, the model rediscovered 25.4% of the experimentally validated disconnections. This figure is lower because the model often proposes multiple valid reactions for a single position, where only one would be used in practice. However, the system has limitations. For four of the five molecules evaluated, the model missed disconnections anticipated by our chemists. It might, for example, propose a feasible reaction (e.g., Buchwald-Hartwig coupling) where an expert would prefer an alternative (e.g., an S_NAr reaction). Our analysis indicates that errors typically originate from the LLM’s misinterpretation of the molecular structure (e.g., the misidentified Cl position in Table 6, position 10). This initial error then propagates through the prediction, ultimately leading to an incorrect suggestion for the position, reaction, or reasoning. Conversely, a key strength of the position model is its ability to provide a comprehensive set of plausible disconnections for an entire synthetic route, not just a single retrosynthetic step. Our chemists considered these predictions valid if the proposed disconnection could occur at any stage of the synthesis route. Importantly, the position model demonstrates the capacity to suggest advanced chemical concepts, such as stereoselective reactions (see Table 7, positions 5 and 6).

The transition model also demonstrated strong performance. It achieved 81.3% accuracy for predicting reaction templates and 87.5% for the associated reasoning, although chemists noted it worked mainly for standard reactions and is less reliable for complex ones (see Figure 14). In 89.5% of cases, the model generated at least one chemically valid reactant set with sound reasoning (see Figure 13), a reasoning quality judged comparable to that of a master’s or PhD-level chemist. Furthermore, it successfully identified 73.3% of reactants previously conducted in the lab. A key strength was its perfect (100%) accuracy in identifying non-viable reactions (see Figure 15), correctly explaining why a proposed reaction would fail (e.g., identifying that a specific atom cannot exist at a given position). This highlights its role as a filter, as it sometimes corrected position model suggestions by proposing more intuitive reactions or filtering out disconnections that were invalid without prerequisite synthesis steps. The model achieved a 74.5% overall accuracy in predicting reactants after excluding predictions that were reaction template-based or flagged as chemically invalid. Failures typically occurred in one of two ways: the model either failed to return any valid reactant set (accounting for 15/29 failures in our evaluation), or it failed due to incorrect SMILES parsing (see Figure 16), even when the underlying chemical reasoning was correct.

5 CONCLUSION

We introduce a molecular reasoning framework that leverages the chemical knowledge in general-purpose LLMs to address data scarcity in computational chemistry without requiring labeled training data or task-specific model training. Our framework grounds chain-of-thought reasoning to the molecular structure by using atom maps in molecular SMILES as chemical anchors. It operates in two stages: a zero-shot position model identifies relevant molecular fragments and their associated chemical labels or transformations, and an optional position-aware few-shot transition model executes chemical transformations based on selected class examples. Applied to single-step retrosynthesis without task-specific training, our method effectively identifies chemically valid and strategically sound disconnection positions, their corresponding reaction classes, and reactant structures for both academic and expert-validated real-world drug molecules, while providing a chemically grounded, explainable rationale for each prediction. Here, atom-anchors allow LLMs to analyze the molecular structure in depth, identify functional groups, and transfer chemical reaction knowledge from the pre-trained LLM to the molecular structure without task-specific fine-tuning (see Section 4 for a representative Deepseek-R1 reasoning trace for LEI-515, annotated by expert chemists).

Beyond scaling to larger molecule sizes in the USPTO benchmark and demonstrating robust performance on real-world drug molecules, our approach showed further generalization capabilities. Notably, in additional exploratory evaluations of complex and larger drug-like modalities such as molecular glues, our position model identifies strategic disconnections consistent with the originally reported synthesis (see Figure 17 for TRAP-1 Zhu et al. (2024)), and for macrocycles, it correctly predicts strategic ring-closing reactions (see Figure 18 for MCL-1 compound 25 Tarr et al. (2025)). Furthermore, we observe that the atom-anchored reasoning traces and chemical rationale are not strictly limited to retrosynthesis as the LLMs reason over adjacent tasks like forward synthesis (see Section 4 for the Deepseek-R1 reasoning trace of LEI-515) and reagent prediction (e.g., Gemini 2.5 Pro flags the MCL-1 disconnection 3 as unfavorable because of "hazardous reagents", see Table 11).

For multi-step synthesis planning, the position model analyzes *all* strategic disconnections in the molecule holistically (see Table 6 for LEI-515, Table 10 for TRAP-1, and Table 11 for MCL-1). This output effectively provides a strategic synthesis plan for all possible disconnections in a molecule. Although we do not ask LLMs to provide an ordering for creating a synthesis route, they exhibit inherent multi-step logic. For example, Deepseek-R1 explicitly reasons over multiple reaction steps (see Section 4). These holistic multi-step predictions have two important consequences: First, the generated positions constrain the search space for a synthesis planning algorithm (e.g., Hassen et al. (2025)), streamlining the identification of an optimal reaction sequence Westerlund et al. (2025); Kreutter & Reymond (2023). Second, these predictions highlight vectors for molecular modification, proving invaluable for guiding and accelerating medicinal chemistry campaigns by providing a strategic blueprint for replacing molecular cores or side-chains, while using a user-defined reaction ontology for robotic or parallel chemistry (e.g., Dombrowski et al. (2022)).

From a practical standpoint, it is important to contrast the costs and real-world value our approach provides in comparison to contemporary approaches. While methods like the single-step retrosynthesis model in AiZynthFinder Saigiridharan et al. (2024) run locally with negligible cost, our approach requires one LLM call per position model to identify all possible disconnections for a molecule, and then one call per transition model evaluation for each disconnection. With Gemini 2.5 Pro, these individual calls cost on average \$0.07 each (see Table 3). However, traditional single-step models output a list of disconnection reactions without an underlying chemical reasoning process. These are essentially "raw reaction ideas" that require significant human time to validate and offer no control over either the selected reaction or its position. Thus, the free local inference is offset by the high labor cost of an expert-level chemist needed to filter and rationalize these predictions. In comparison, our LLM framework performs selected reactions at a specified molecular position while providing expert-level chemical rationale, a process that is parallelizable at scale beyond singular structures and requires minimal human intervention.

By treating the outputs of our position model as the result of a zero-shot data labeling process, our framework demonstrates that LLMs can generate realistic synthetic datasets in data-scarce chemistry domains. This is achieved by mapping high-level chemical concepts, such as reactions, directly from the intrinsic chemistry knowledge of an LLM to molecular structures, which could enable future LLM-based applications, such as the generation of novel, synthetically feasible candidates in de novo drug design. Ultimately, our methodology provides a general blueprint for applying LLMs to challenges where molecular reasoning and molecular transformations are key, establishing atom-anchored LLMs as a powerful and data-efficient addition to the modern drug discovery toolbox.

LARGE LANGUAGE MODELS

Large Language Models (LLMs) were used throughout the creation of this manuscript to improve spelling mistakes, grammar, and the overall reading flow. All LLM suggestions were profusely checked for correctness and refined by the authors of this work. The LLM was not used for any research-related tasks.

REPRODUCIBILITY STATEMENT

The code for *AAL-Chem* can be found on an anonymized repository at <https://github.com/AAL-Chem/AAL-Chem>. The datasets and raw LLM response files can be found in the `DATA/` directory. Figures and tables used in this manuscript can be reproduced via Jupyter notebooks included in the `NOTEBOOKS/` directory.

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A APPENDIX

A.1 EXPERIMENTAL SETUP

Table 2: A summary of the Large Language Models (LLMs) evaluated in this work. The table specifies whether the model is open-source, its status as a reasoning-optimized ("Thinking") variant, and its thinking budget allocation (in number of tokens) for closed-source models along with other parameters.

Source	Model Name	Thinking model	Open-Source	Model quantization	Max output length	Thinking budget
Yang et al. (2025)	Qwen3-4B-Thinking-2507	yes	yes		32768	-
Narayanan et al. (2025)	Ether0 (24B)	yes	yes		32768	-
Yang et al. (2025)	Qwen3-30B-A3B-Thinking-2507	yes	yes	8bit	32768	-
Yang et al. (2025)	Qwen3-235B-A22B-Instruct-2507-FP8	no	yes	8bit	32768	-
Yang et al. (2025)	Qwen3-235B-A22B-Thinking-2507-FP8	yes	yes	8bit	32768	-
Guo et al. (2025)	RedHat-DeepSeek-R1-0528-w4a16 (670B)	yes	yes	4bit	32768	-
Comanici et al. (2025)	Gemini 2.5 Flash	yes	no	API	65536	30000
Comanici et al. (2025)	Gemini 2.5 Pro	yes	no	API	65536	30000
Anthropic (2025)	Claude Sonnet 4	yes	no	API	64000	30000
OpenAI (2025)	GPT5	yes	no	API	128000	'High'

Table 3: Cost per model call derived from official provider API pricing. Variations in input/output token counts are attributed to differences in tokenizer architectures and model verbosity. Costs for open-source models are excluded, as they rely on variable hardware configurations for inference.

Model	Task	Molecules	Avg. Input Tokens	Avg. Output Tokens	Avg. Cost Mol.
Gemini 2.5 Pro	Position	541	9202.7	5917.3	0.071\$
GPT5	Position	538	4244.64	6952.1	0.075\$
Claude Sonnet 4	Position	538	4926.1	9123.0	0.152\$
Gemini 2.5 Flash	Position	539	11604.9	6572.2	0.020\$
RedHat-DeepSeek-R1-0528-w4a16 (670B)	Position	541	4183.1	12232.0	-
Qwen3-235B-A22B-Thinking-2507-FP8	Position	541	4365.0	16518.0	-
Qwen3-30B-A3B-Thinking-2507	Position	541	4365.0	13287.8	-
Qwen3-4B-Thinking-2507	Position	541	4365.0	13410.4	-
Ether0	Position	541	4229.3	739.5	-
Gemini 2.5 Pro	Transition	512	9301.1	6226.9	0.074\$
GPT5	Transition	510	3766.2	14288.6	0.148\$
Claude Sonnet 4	Transition	515	4059.6	5056.5	0.103\$
Gemini 2.5 Flash	Transition	513	10327.8	4579.15	0.015\$
RedHat-DeepSeek-R1-0528-w4a16 (670B)	Transition	528	4408.7	10847.9	-
Qwen3-235B-A22B-Thinking-2507-FP8	Transition	537	4435.5	17550.0	-
Qwen3-30B-A3B-Thinking-2507	Transition	535	4435.5	15002.7	-
Qwen3-4B-Thinking-2507	Transition	529	4435.5	15311.0	-
Ether0	Transition	541	4542.6	5512.3	-

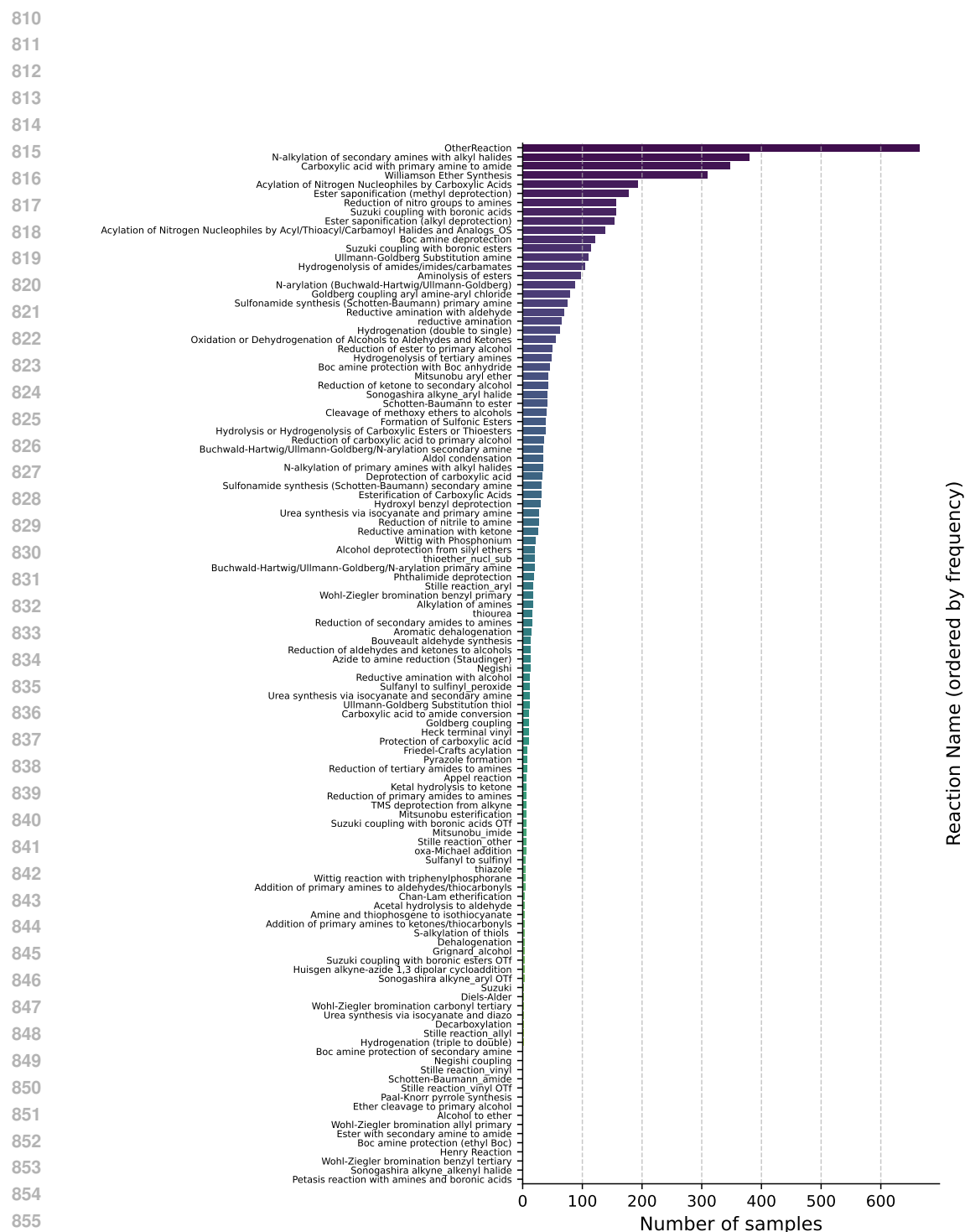


Figure 5: Distribution of reaction names in the USPTO-50k test set. From this dataset, we created a balanced subsample (USPTO-LLM) for evaluation by selecting up to five examples per named reaction class, while maintaining the original proportion of the 'otherReaction' class.

A.2 POSITION MODEL

Table 4: A comprehensive comparison of various models based on several key performance metrics. The table highlights the average number of predictions, partial and exact match percentages, reaction accuracy, and the total number of successes and failures for each model. The best performance in each column is highlighted in bold.

Model	Avg. number of predictions	Partial match (%)	Exact match (%)	Reaction acc. (%)	Total predictions	Failed predictions
Ether0	0.0	0.0	0.0	0.0	0	541
Qwen3-4B	4.0	73.01	31.61	3.51	541	0
Qwen3-30B	3.8	74.86	34.75	14.23	541	0
Gemini 2.5 Flash	15.3	90.54	56.59	37.11	539	2
Gemini 2.5 Flash (thinking)	16.3	91.84	61.6	35.81	539	2
Qwen3-235B-thinking	5.9	88.5	58.07	25.97	539	2
Qwen3-235B-instruct	9.6	86.67	49.44	13.33	540	1
DeepSeek-R1-670B	7.3	87.25	53.23	29.21	541	0
Claude Sonnet 4	10.0	92.57	58.55	39.03	538	3
GPT-5	15.1	91.08	54.28	47.03	538	3
Gemini 2.5 Pro	11.1	91.87	66.54	40.3	541	0

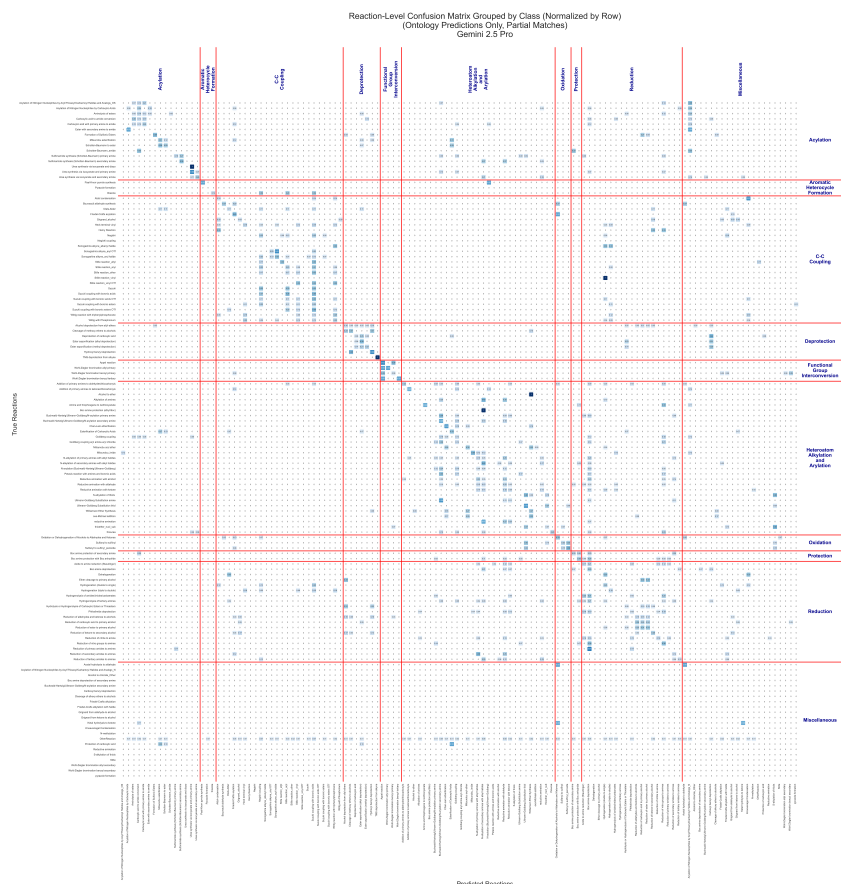


Figure 6: Confusion matrix of predicted versus ground-truth reaction names for the Gemini 2.5 Pro model. The analysis is conditional, including only predictions where the model successfully identified at least a partial positional match. For this visualization, reactions outside the defined reaction ontology were excluded. The matrix was generated using the original class-to-name mappings from the ground-truth data, with any unassigned reactions grouped into the 'Miscellaneous' category.

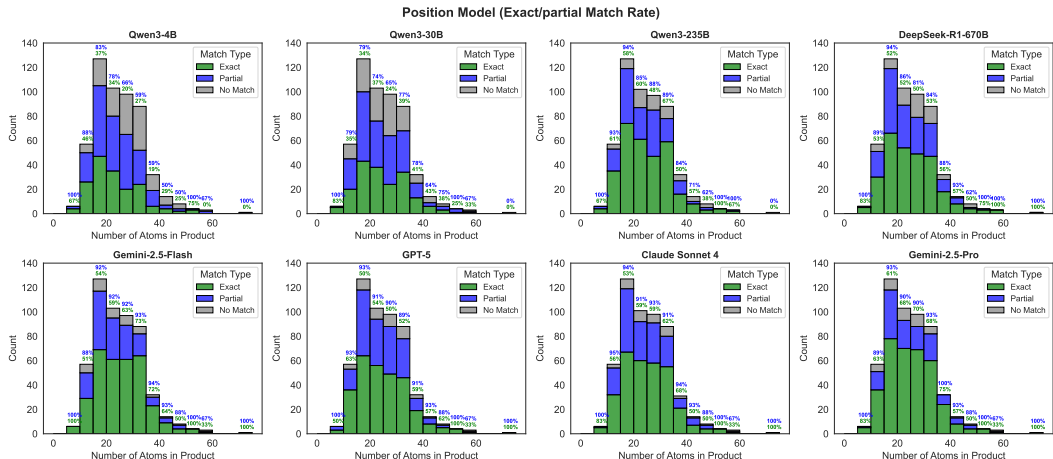


Figure 7: Impact of molecule size on position model performance. The figure displays exact and partial match accuracy for predicted disconnection positions, stratified by the number of atoms (bin size = 5) across all tested LLMs.

A.3 TRANSITION MODEL

This section covers additional results on the transition model (reactant prediction).

Table 5: A comparison of model performance on the transition task (reactant prediction). This table presents the total successful predictions, along with accuracy scores for reactants, templates, and the combined category. The best performance in each column is highlighted in bold.

Model	Avg. number of predictions	Reactants accuracy	Template accuracy	Combined accuracy	Total predictions	Failed predictions
Ether0	0.0	0.0	0.0	0.0	0.0	541
Qwen3-4B	3.0	0.11	0.05	0.13	529	12
Qwen3-30B	3.6	0.22	0.12	0.27	535	6
Gemini 2.5 Flash	4.4	0.44	0.31	0.51	513	28
Qwen3-235B-thinking	4.4	0.56	0.29	0.61	522	19
Qwen3-235B-instruct	6.6	0.40	0.39	0.48	537	4
DeepSeek-R1-670B	4.4	0.64	0.28	0.70	528	13
Claude Sonnet 4	5.0	0.65	0.39	0.71	515	26
GPT-5	10.4	0.68	0.44	0.73	510	31
Gemini 2.5 Pro	5.7	0.75	0.44	0.81	512	29

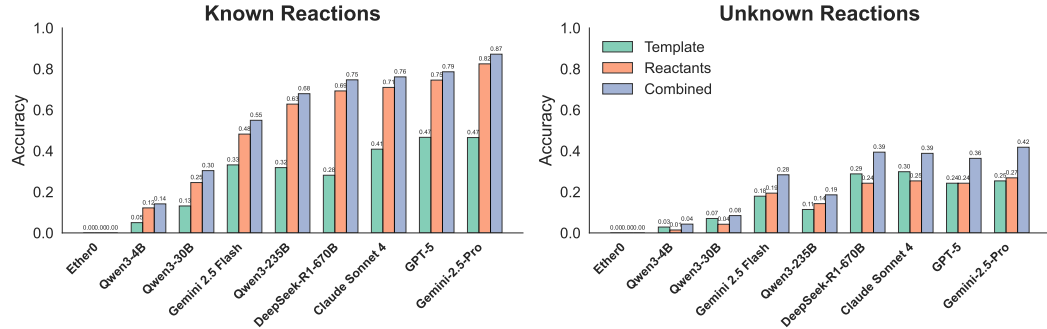


Figure 8: Performance difference between known and unknown reaction names. For unknown reactions, no equivalent name reaction examples within the *USPTO50k* training dataset are provided, illustrating the importance of the reaction name as a chemical anchor for retrieving reaction examples and chemical reasoning.

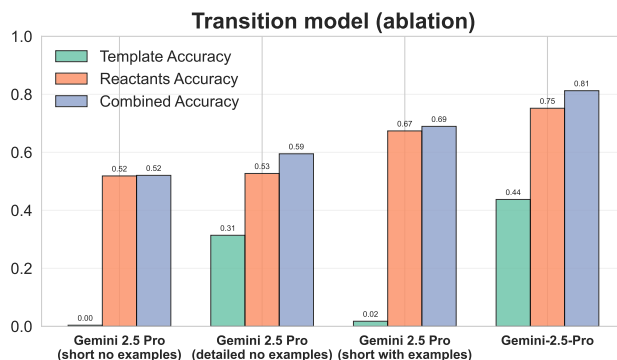


Figure 9: An ablation study on the impact of prompt instruction detail and the inclusion of in-context examples on the performance of the Gemini 2.5 Pro transition model. We evaluate four settings: 1) a simple prompt without examples (see Prompt 3); 2) a detailed prompt without examples (see Prompt 2); 3) a simple prompt with examples; and 4) a detailed prompt with examples.

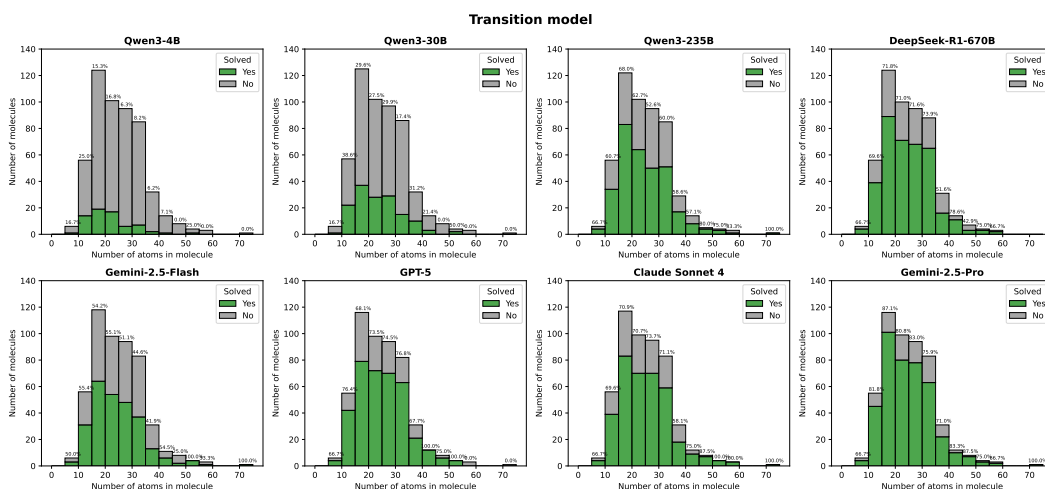


Figure 10: Impact of molecule size on transition model performance. The figure displays Reactant Accuracy, stratified by the number of atoms (bin size = 5) across all evaluated LLMs.

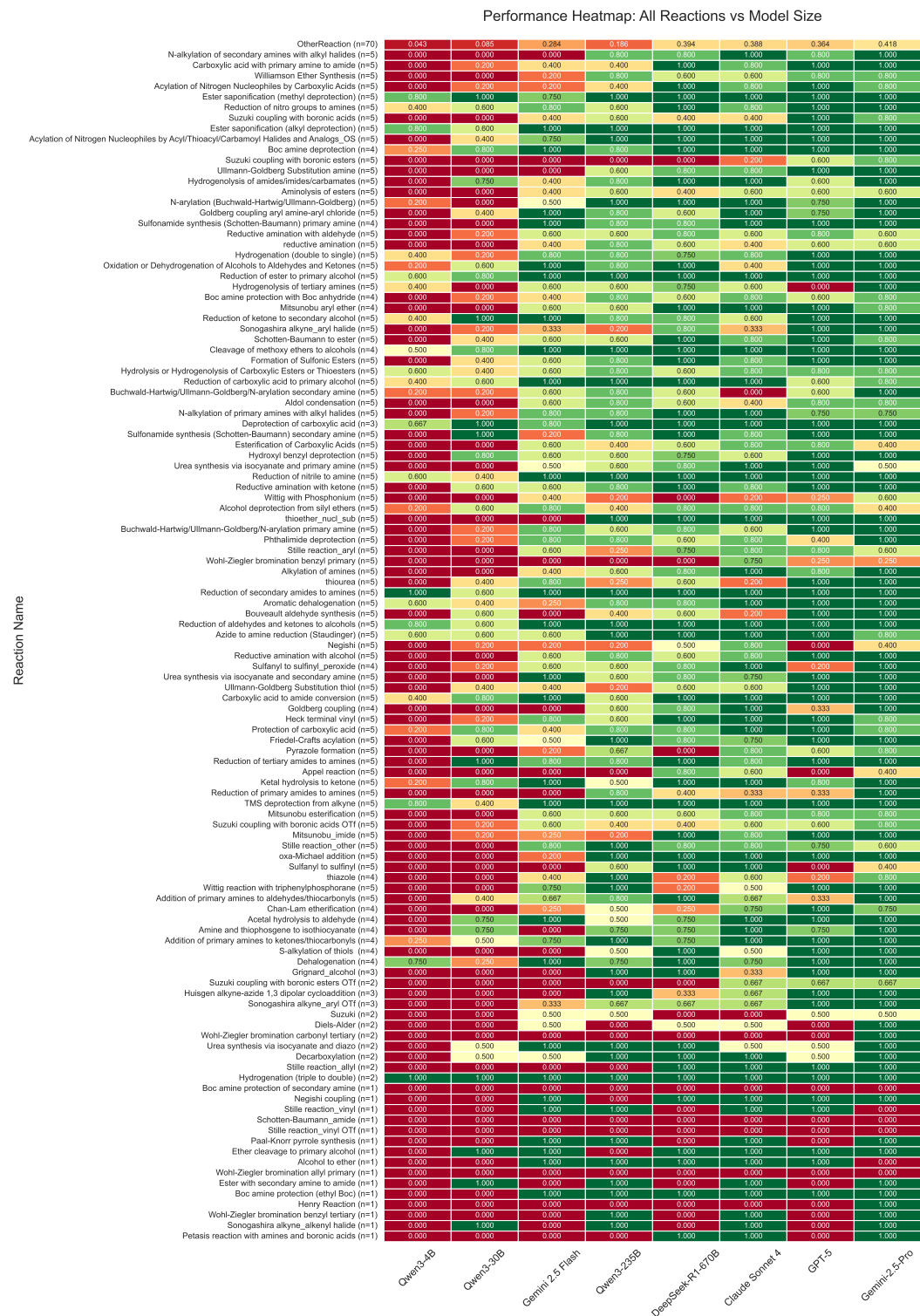


Figure 11: Confusion matrix highlighting the performance of different Transition Models on respective reaction name classes using either template or reactant accuracy. The reactions are sorted by the number of reaction examples available in the set (high-to-low).

A.4 APPLICATION EXAMPLES

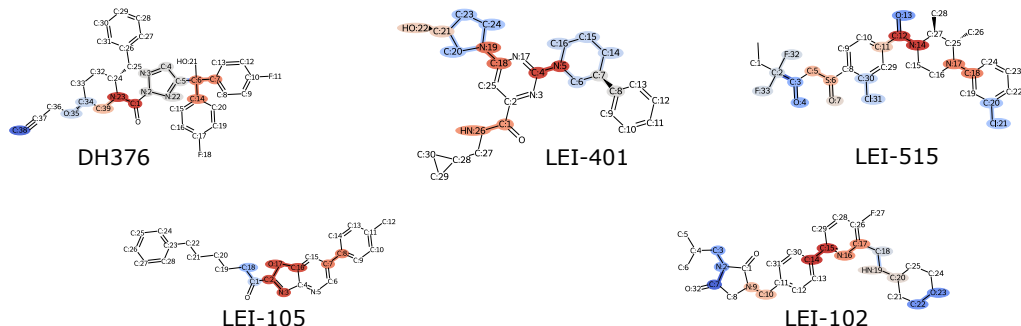


Figure 12: Five real-world drug discovery molecules used in our case study: DH376 Deng et al. (2017), LEI-102 Li et al. (2023), LEI-105 Baggelaar et al. (2015), LEI-401 Mock et al. (2020), LEI-515 Jiang et al. (2023)

Table 6: Predicted Disconnection Sites for LEI-515 Jiang et al. (2023). Header descriptions are as follows: **Prio.**: Priority Ranking of the Disconnections; **Position**: The position where the disconnection is; **Reaction**: The forward reaction; **Ontology**: If the reaction is in the reaction ontology for which examples are available; **Imp.**: Retrosynthesis Importance, alignment with retrosynthesis goals; **Rationale**: The chemical rationale.

Prio.	Position	Reaction	Ontology	Imp.	Rationale
1	C:12 N:14	Carboxylic acid to amide conversion	Yes	4	Identified via Inter-Fragment Analysis, this is a very high-impact, convergent disconnection linking the chiral piperazine amine and the aryl carboxylic acid core, drastically simplifying the molecule (Goals a, c). The forward reaction (amide coupling) is robust and high-yielding (Goal b). No major chemoselectivity issues are expected with modern coupling reagents.
2	C:12 N:14	Acylation of Nitrogen Nucleophiles by Acyl/Thioacyl/Carbamoyl Halides and Analogs_N	Yes	4	Identified via Inter-Fragment Analysis, this is a very high-impact, convergent disconnection that simplifies the molecule into two key fragments (Goals a, c). Activation of the carboxylic acid as an acyl chloride is a classic, robust method for amide formation (Goal b), though it may require protection of other nucleophilic sites.
3	N:17 c:18	Buchwald-Hartwig/Ullmann-Goldberg/N-arylation secondary amine	Yes	4	Identified via Inter-Fragment Analysis, this key convergent C-N bond formation builds the N-arylpiperazine motif (Goal c). The forward reaction, a Buchwald-Hartwig amination, is a powerful and reliable method for this transformation, simplifying the chiral amine precursor (Goals a, b). Potential for competitive reaction at N:14 necessitates a protecting group strategy.

	Prio.	Position	Reaction	Ontology	Imp.	Rationale
1134	4	N:17 c:18	N-arylation	Yes	4	Identified via Inter-Fragment Analysis,
1135			(Buchwald-			this strategic disconnection simplifies
1136			Hartwig/Ullmann-			the chiral piperazine component by re-
1137			Goldberg)			moving the aryl group (Goal a). The
1138						forward N-arylation is a powerful and
1139						reliable reaction for constructing this
1140						key bond (Goals b, c). Regioselectivity
1141						between the two piperazine nitrogens
1142						is a key issue that must be controlled,
1143	5	C:5 S:6	S-alkylation of thiols	Yes	3	likely with a protecting group on N:14.
1144						Identified via Strategic Bond Analysis.
1145						This disconnects the beta-keto sulfox-
1146						ide side chain from the aryl core (Goal
1147						c). The forward synthesis involves S-
1148						alkylation of the corresponding thio-
1149						phenol with an alpha-halo ketone pre-
1150						cursor, followed by oxidation. This is a
1151						robust way to build this key C-S bond,
1152	6	c:11 C:12	Grignard with CO2	Yes	3	but the electrophile itself requires sepa-
1153			to carboxylic acid			rate synthesis (Goals a, b).
1154						Identified via FGI Analysis. Strategic
1155						C-C bond formation to install the car-
1156						boxyl group on the central aromatic ring
1157						(Goal c). The forward synthesis via car-
1158						boxylation of an organometallic (e.g.,
1159						Grignard) from an aryl halide is classic
1160						and reliable (Goals a, b). Chemoselec-
1161	7	S:6 O:7	Sulfanyl	Yes	2	tivity is a concern, as the formation of
1162			sulfinyl_H2O2			the organometallic must be compatible
1163						with the sulfide/sulfoxide group.
1164						Identified via FGI Analysis. Standard
1165						FGI to install the sulfoxide from a
1166						more stable and easier to handle sulfide
1167	8	C:2 F:32 F:33	Fluorination	Yes	2	precursor. The oxidation can be per-
1168						formed late-stage, but requires careful
1169						control of conditions to prevent over-
1170						oxidation to the sulfone, which presents
1171						a chemoselectivity challenge (Goal b).
1172						Identified via FGI Analysis. This dis-
1173						connection corresponds to a forward
1174						reaction installing the difluoro moiety.
1175	9	c:30 Cl:31	Aromatic chlorina-	Yes	2	Electrophilic fluorination of the beta-
1176			tion			keto sulfoxide enolate is a viable route
1177						(Goal c). Chemoselectivity could be
1178						an issue due to multiple acidic protons
1179						(at C:5) and potential for mono- vs di-
1180						fluorination, requiring kinetic control.
1181						Identified via FGI Analysis. This FGI
1182						installs the chloro substituent via elec-
1183						trophilic aromatic substitution (Goal
1184						c). The regioselectivity of the chlo-
1185						ration would be directed by the ex-
1186						isting sulfoxide/sulfide and carboxy-
1187						late/amide groups. Predicting and con-
						trolling the outcome relative to other
						open positions on the ring requires care-
						ful consideration of the combined di-
						recting effects.

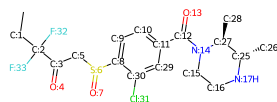
	Prio.	Position	Reaction	Ontology	Imp.	Rationale
1188	10	c:20 Cl:21	Aromatic chlorination	Yes	2	Identified via FGI Analysis. This FGI installs the chloro substituent on the N-aryl ring via electrophilic aromatic substitution (Goal c). The reaction would be strongly directed by the activating amine substituent, likely leading to the observed para-chlorination, making this a reliable and predictable transformation (Goal b).
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1195						
1196	11	C:3 O:4	Oxidation or Dehydrogenation of Alcohols to Aldehydes and Ketones	Yes	2	Identified via FGI analysis. Standard FGI to form the ketone from a secondary alcohol precursor. While many mild oxidation reagents are available, the presence of the easily oxidizable sulfoxide (or its sulfide precursor) on the same molecule presents a major chemoselectivity challenge that must be carefully managed (Goal b).
1197						
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1204	12	C:12 O:13 N:14	Nitrile to amide	Yes	2	Identified via FGI analysis. This transforms the amide into a nitrile precursor, offering an alternative synthetic route to the central aromatic core (Goal a). A nitrile can be introduced via methods like the Sandmeyer reaction. The forward reaction, partial hydrolysis of the nitrile to the amide, can be challenging to stop without proceeding to the carboxylic acid.
1205						
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1211						
1212	13	N:14	Boc amine deprotection	Yes	1	Identified via Protecting Group Analysis. This is a tactical deprotection step. A protecting group like Boc on N:14 would be crucial in a forward synthesis to ensure regioselective N-arylation at N:17. This step reveals the nucleophilic amine for the final amide coupling and is a common, practical consideration (Goal d).
1213						
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1220	14	C:2 C:3	Enolate Acylation	No	3	Identified via Strategic Bond Analysis. This strategic C-C bond disconnection breaks down the beta-keto side chain (Goal a). The forward reaction, likely an enolate acylation, is a powerful method for ketone synthesis (Goal c). However, generating and controlling the reactivity and stability of the required difluoroenolate precursor could be challenging.
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Table 7: Predicted Disconnection Sites for LEI-401 Mock et al. (2020). Header descriptions are as follows: **Prio.**: Priority Ranking of the Disconnections; **Position**: The position where the disconnection is; **Reaction**: The forward reaction; **Ontology**: If the reaction is in the reaction ontology for which examples are available; **Imp.**: Retrosynthesis Importance, alignment with retrosynthesis goals; **Rationale**: The chemical rationale.

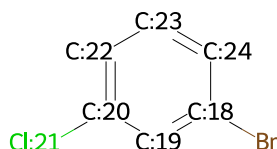
Prio.	Position	Reaction	Ontology	Imp.	Rationale
1	C:4 N:5	Buchwald-Hartwig/Ullmann-Goldberg/N-arylation secondary amine	Yes	4	Identified from Inter-Fragment Analysis (C), this is a very high importance disconnection that convergently couples the phenylpiperidine fragment to the central imidazole core. This modern cross-coupling reaction is robust and strategically sound for scaffold construction (goal c). The synthesis would require a di-halogenated imidazole, and chemoselectivity between the two coupling sites would need to be controlled, possibly via differential reactivity of the halides (e.g., Br vs. I).
2	C:18 N:19	Buchwald-Hartwig/Ullmann-Goldberg/N-arylation secondary amine	Yes	4	Identified from Inter-Fragment Analysis (C), this is a key convergent disconnection of the hydroxypiperidine fragment. A C-N cross-coupling is a powerful method for building the core scaffold (goal c). The free hydroxyl group on the piperidine fragment might require protection to prevent interference with the palladium catalyst, a potential chemoselectivity issue.
3	C:1 N:26	Carboxylic acid to amide conversion	Yes	3	Identified via Strategic Bond Analysis (D), this amide bond disconnection is a classic, high-importance step. The forward reaction is a robust and high-yielding amide coupling, simplifying the molecule to a carboxylic acid precursor and commercially available cyclopropylmethylamine (goals a, b). The secondary amines on the piperidine rings are significantly less nucleophilic, so chemoselectivity should be high.
4	C:1 N:26	Acylation of Nitrogen Nucleophiles by Acyl/Thioacyl/Carbamoyl Halides and Analogs_N	Yes	3	Identified via Strategic Bond Analysis (D), this is an alternative high-importance disconnection for the amide bond via a more reactive acyl chloride. This reaction is often very fast and high-yielding (goal b), though it requires an extra step to prepare the acyl chloride from the acid. Chemoselectivity is generally excellent.
5	C:21 O:22	Reduction of ketone to secondary alcohol	Yes	3	Identified from Stereochemical Analysis (F) and FGI Analysis (H), this disconnection allows for the creation of the C21 stereocenter. The forward asymmetric reduction of a ketone precursor is a powerful strategy for stereochemical control (goal e) and is a robust reaction (goal b). This approach offers excellent control over the final product's stereochemistry.

	Prio.	Position	Reaction	Ontology	Imp.	Rationale
1296	6	C:7 C:8	Suzuki coupling with boronic acids	Yes	2	Identified via Strategic Bond Analysis (D), this C-C bond disconnection breaks down a key fragment. However, since chiral 3-phenylpiperidine is accessible, this is less strategic than connecting the whole fragment to the core. A Suzuki coupling would be a reliable method (goal b) but adds steps compared to using the intact piperidine.
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1304	7	N:5 C:6 C:7 C:14 C:15 C:16	Arene hydrogenation	Yes	2	Identified via FGI Analysis (H.i), this disconnection simplifies the 3-phenylpiperidine starting material to 3-phenylpyridine. The forward hydrogenation of a pyridine derivative is a common way to access piperidines (goal a). Asymmetric hydrogenation conditions could potentially be employed to set the C7 stereocenter (goal e).
1305						
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1310						
1311						
1312						
1313	8	N:19 C:20 C:21 C:23 C:24	Arene hydrogenation	Yes	2	Identified via FGI Analysis (H.i), this disconnection simplifies the 3-hydroxypiperidine fragment to 3-hydroxypyridine. While this simplifies the starting material (goal a), controlling the subsequent reduction of the ketone (formed from the hydroxyl) and setting the stereocenter would be a separate, critical step.
1314						
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1321	9	O:22	Alcohol deprotection from silyl ethers	Yes	1	Identified from Protecting Group Analysis (I), this represents a tactical deprotection step. The alcohol would likely need to be protected as a silyl ether during steps involving strong bases or organometallic reagents to avoid side reactions. This step addresses chemoselectivity but is of lower strategic importance.
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1327						
1328	10	N:5	Boc amine deprotection	Yes	1	Identified from Protecting Group Analysis (I), this is a tactical deprotection. The secondary amine of the piperidine may require Boc protection to prevent it from interfering in other reactions, such as the second C-N coupling. This step manages chemoselectivity and is of lower strategic importance.
1329						
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1334						
1335	11	N:19	Boc amine deprotection	Yes	1	Identified from Protecting Group Analysis (I), this is another tactical deprotection step. Protecting this secondary amine could be crucial for achieving selectivity during a stepwise C-N coupling sequence on the imidazole core. It is a key step for controlling chemoselectivity.
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- **Forward Reaction:** Buchwald-Hartwig/Ullmann-Goldberg/N-arylation secondary amine
- **Is Chemically Valid:** True
- **Is Template-based:** False
- **Reasoning:** This option is highly plausible. The reactants are stable. The greater reactivity of the C-Br bond versus the C-Cl bonds allows for high chemoselectivity under typical Buchwald-Hartwig conditions. The reaction does not affect the existing stereocenters.
- **Reactant 1:** C[C@H]1[C@H]2[C@H]3[C@H]4[C@H]5[C@H]6[C@H]7[C@H]8[C@H]9[C@H]10[C@H]11[C@H]12[C@H]13[C@H]14[C@H]15[C@H]16[NH]17[C@@H]25[C@H]326[C@@H]27[C@H]28[C@H]29[C@H]30[C@H]31[C@H]32[C@H]33



• **Reactant 2:** Br[C:18]1[C:H:19][C:20]([C:1:21])[C:H:22][C:H:23][C:H:24]1



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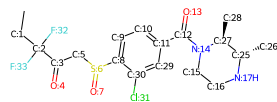
• **Forward Reaction:** Buchwald-Hartwig/Ullmann-Goldberg/N-arylation secondary amine

• **Is Chemically Valid:** True

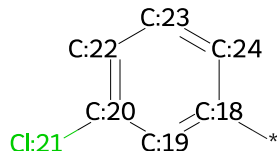
• **Is Template-based:** True

• **Reasoning:** This is the general template for an N-arylation reaction. The aryl partner is an activated aryl ring where the wildcard atom [*] represents a suitable leaving group from the class , such as F, Cl, Br, I, OTf, OTs.

Reactant 1: [C]H2[1:2][C:2][C:3][C=:0:4][CH2:5][S:6][C=:0:7][C:8]1[C#N:9][CH:10][C:11][C:12][C=:0:13][N:14]12[CH2:15][CH2:16][NH:17][C#N:25][C(=O):26]1[C@@H:27]2[C@H:28]27[C#N:29]1[C:30]1[Cl:31]1[(F:32)]1[F:33]



- **Reactant 2:** *[c:18]1[cH:19][c:20]([Cl:21])[cH:22][cH:23][cH:24]1



1403

Transition 1

- **Forward Reaction:** Boc amine deprotection
- **Is Chemically Valid:** False
- **Is Template-based:** False
- **Reasoning:** This permutation is invalid. The specified reaction center, N:14, is a tertiary amide nitrogen within the product structure, not a primary or secondary amine. The forward reaction 'Boc amine deprotection' implies the product is a free amine and the reactant is a Boc-protected amine (a neutral carbamate). Applying the retrosynthetic protection step to a tertiary amide nitrogen is not a standard or plausible transformation. It would generate a highly reactive and unstable N-acyl quaternary ammonium salt, which is not a viable precursor for a deprotection reaction. The specified reaction name is inconsistent with the provided product structure at the indicated reaction center.
- **Reactant 1:** C[CH2:1][C:2]([C:3](=[O:4])[CH2:5][S:6](=[O:7])[c:8]1[ch:9][ch:10][c:11]([C:12](=[O:13])[N+:14]2(C(=O)OC(C)C)[CH2:15][CH2:16][N:17]([c:18]3[ch:19][c:20]([C1:21])[ch:22][ch:23][ch:24]3)[C@@H:25]([CH3:26])[C@@H:27]2[CH3:28])[ch:29][c:30]1[C1:31])([F:32])[F:33]

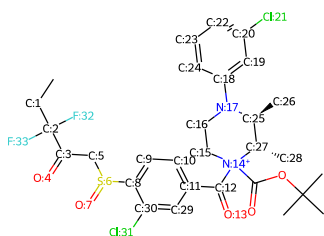
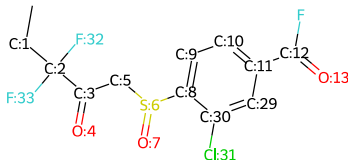


Figure 15: Correctly flagged chemically invalid prediction for LEI-515 Jiang et al. (2023) by the Transition Model (position priority 13, transition prediction 1).

Transition 4

- **Forward Reaction:** Carboxylic acid to amide conversion
- **Is Chemically Valid:** True
- **Is Template-based:** False
- **Reasoning:** This permutation is valid and represents a modern approach to amide synthesis. Acyl fluorides offer a good balance of reactivity and stability, often being more chemoselective and causing less racemization at adjacent stereocenters than the corresponding chlorides. An external base is typically used.
- **Reactant 1:** [CH3:28][C@@H:27]1[N:14](H)[CH2:15][CH2:16][N:17]([c:18]2[ch:19][c:20]([C1:21])[ch:22][ch:23][ch:24]2)[C@@H:25]1[CH3:26] (Could not visualize)
- **Reactant 2:** C[CH2:1][C:2]([C:3](=[O:4])[CH2:5][S:6](=[O:7])[c:8]1[ch:9][ch:10][c:11]([C:12](=[O:13])F)[ch:29][c:30]1[C1:31])([F:32])[F:33]



Reactant 2

Figure 16: Syntactically invalid SMILES prediction for LEI-515 Jiang et al. (2023) by the Transition model (position priority 1, transition prediction 4).

A.5 APPLICATION QUESTIONNAIRE

Table 8: Full list of questions for the expert validation study. These are the complete, verbatim questions presented to chemists to benchmark the performance of our framework. The evaluation was split into two parts: assessing the disconnection sites proposed by the Position (P) model and the final reactant structures generated by the Transition (T) model.

Q.	Description
P1	Is the suggested disconnection position chemically plausible (i.e., not violating fundamental principles)?
P2	Is the suggested reaction name a correct label for the proposed disconnection position?
P3	Is the provided chemical reasoning for the suggested disconnection (position and reaction name) scientifically sound?
P4	Considering all the provided information, could this suggested step realistically work in a laboratory setting?
P5	Has this specific transformation actually been performed successfully in practice for the molecule?
P6	Are there any strategically important disconnections that are obviously missing from this prediction?
T1	Given the transition prediction includes a reaction template, does the reaction template capture the overall chemical transformation of the reaction?
T2	Given the transition prediction includes a reaction template, does the chemical reasoning for the reaction template align with the underlying reaction?
T3	Among the reactant predictions, is there at least one that provides a chemically correct set of reactants to form the target product?
T4	If the model predicts a chemically correct set of reactants, is the model’s chemical reasoning for that specific set of reactants correct?
T5	If the reaction was conducted in the lab, does the model correctly predict the set of reactants that were used in the lab?
T6	If the model flags one of its own predictions as ‘chemically invalid’, is its reasoning for that assessment correct?
T7	How many reactants are predicted as chemically valid and are not reaction templates are correct?

Table 9: Detailed response data.

ID	P1	P2	P3	P4	P5	P6	T1	T2	T3	T4	T5	T6	T7
DH376 Deng et al. (2017)	12/13	11/13	8/13	11/13	5/13	1	4/4	4/4	4/4	4/4	3/4	2/2	23/31
LEI-102 Li et al. (2023)	14/16	12/16	12/16	14/16	2/16	1	3/3	3/3	4/4	4/4	4/4	3/3	18/18
LEI-105 Bagelaar et al. (2015)	8/9	8/9	8/9	5/9	2/9	1	2/2	2/2	2/2	2/2	1/1	-	11/11
LEI-401 Mock et al. (2020)	11/11	11/11	7/11	11/11	2/11	0	2/3	3/3	3/3	3/3	2/2	1/1	10/15
LEI-515 Jiang et al. (2023)	12/14	12/14	11/14	8/14	5/14	1	2/4	2/4	4/6	4/6	1/4	1/1	11/23
Acc.	90.5	85.7	73.0	77.8	25.4	80.0	81.3	87.5	89.5	89.5	73.3	1	74.5

A.6 PROMPTS

A.6.1 POSITION MODEL

```

1  **Persona:**
2  You are an expert chemist specializing in retrosynthetic analysis.
3
4  **Primary Goal:**
5  Your primary goal is to perform a comprehensive retrosynthetic analysis on a given molecule. You will identify
6  all strategically viable disconnection points, rank them according to the provided framework, and
7  format the entire output as a single, valid JSON object.
8
9  **Input Schema:**
10 - product_smiles: The atom-mapped SMILES string of the product molecule.
11 - reaction_ontology: The provided JSON object containing the reaction ontology.
12
13 **Internal Analysis Pipeline:**
14 To generate the final JSON object, you will internally execute the following data transformation pipeline. The
15 output of each step serves as the direct input for the next, ensuring a dependent, step-by-step
16 analysis.
17
18 1. **Step 1: Identify All Candidate Transformations**
19 Process steps A - L sequentially. For each step, you must perform a complete and independent analysis to
20 identify all transformations that fit its description. A finding in one step does not exclude
21 findings in others.
22 * **Input:** The 'product_smiles'.
23 * **Process:**
24   * A) **Symmetry Analysis:** First, assess the molecule for any elements of symmetry. If symmetrical
25     fragments exist, identify transformations that could form the molecule by coupling two identical
26     precursors.
27   * B) **Fragment Partitioning:** Mentally partition the molecule into its major constituent fragments.
28     The goal is to find disconnections that lead to a **convergent synthesis**.
29   * C) **Inter-Fragment Analysis:** Identify the bonds that **connect these major fragments**. These are
30     candidates for strategic coupling reactions.
31   * D) **Strategic Bond Analysis:** Within the identified fragments, specifically look for bonds that
32     are adjacent to functional groups, making them chemically activated and strategic targets for
33     disconnection (e.g., bonds alpha/beta to carbonyls, bonds within key functional groups like
34     amides and esters).
35   * E) **Intra-Fragment Analysis:** Within each major fragment, identify bonds that could be
36     strategically formed via an **intramolecular (ring-closing) reaction**.
37   * F) **Stereochemical Analysis:** Identify all stereocenters. For each one, consider transformations
38     that could set that stereocenter (e.g., asymmetric reactions, chiral pool approach).
39   * G) **Rearrangement Analysis:** Look for structural motifs that could be efficiently formed via a
40     powerful **skeletal rearrangement**.
41   * H) **FGI Analysis:** For each functional group in the molecule, systematically identify all possible
42     functional groups that are candidates for standard Functional Group Interconversions. This
43     analysis **must** include, but is not limited to:
44     * **i. Oxidation/Reduction:** Identify all groups that could be retrosynthetically derived from a
45       different oxidation state.
46     * **ii. Non-Redox FGIs:** Identify all non-redox interconversions. This involves analyzing polar
47       carbon-heteroatom bonds within functional groups that are classically disconnected via
48       substitution or hydrolysis-type mechanisms.
49   * I) **Protecting Group Analysis:** Analyze for protecting group strategies by proposing protections
50     for sensitive functional groups or deprotections for existing, recognizable protecting groups.
51     Note that a retrosynthetic protection is a forward deprotection reaction and vice versa.
52   * J) **Multi-Bond / Multi-Component Analysis:** Analyze the product for structural motifs that could
53     be formed via reactions that form multiple bonds in one step, such as **cycloadditions** (ring-
54     forming reactions between unsaturated systems) or **multi-component reactions** (where 3+
55     reactants combine in a single operation).
56   * K) **Radical Mechanism Analysis:** K) Radical Mechanism Analysis: Analyze the molecule for
57     transformations whose mechanism is best described as proceeding via radical (uncharged, open-
58     shell) intermediates. This involves identifying bonds whose formation or cleavage is
59     characteristic of single-electron processes (homolysis), as distinct from the two-electron
60     processes of polar (ionic) reactions.
61   * L) **Novel or Uncategorized Strategies:** If you identify a powerful, chemically sound
62     transformation that does not clearly fit into categories A-K, classify it here.
63 * **Output (Internal):** A list of formatted transformation strings representing all identified
64 transformations. Each string must adhere to the format specified for the "disconnection" key in
65 the Constraints & Formatting Rules. You MUST return all found disconnections. You are not allowed to
66 leave any found and valid disconnection out.
67
68 2. **Step 2: Assign Candidate Reactions**
69 * **Input:** The list of transformation strings from Step 1.
70 * **Process:** For each transformation, determine all appropriate forward reaction names. A single
71 transformation may have multiple corresponding reactions.
72 * **Output (Internal):** A list of objects, where each object contains a transformation and a list of its
73 assigned 'forwardReaction' names.
74 * **Example:** { "disconnection": "C:4-C:7", "reactions": ["Suzuki-Miyaura_coupling", "Stille_coupling"] }
75
76 3. **Step 3: Expand and Evaluate Pairs**
77 * **Input:** The list of objects from Step 2.
78 * **Process:** Expand the input into a flat list by creating a **new, separate entry for each reaction**
79 associated with a transformation. Then, for each of these new entries, apply the Retrosynthetic
80 Analysis Framework to assign a 'Retrosynthesis Importance' value and write a concise 'rationale'.
81 * **Output (Internal):** A flat list of fully populated objects, where each object represents one unique
82 transformation-reaction pair.
83
84 4. **Step 4: Final Formatting and Priority Assignment**
85 * **Input:** The flat list of objects from Step 3.

```



```

1566
1567 47 * Process: For each object, format it according to the 'Constraints & Formatting Rules'. Then,
1568 calculate a 'Priority' number for each entry by ranking them based on two criteria: 1. 'isInOntology' ('true' before 'false'), and 2. 'Retrosynthesis_Importance' (descending). Assign
1569 48 the resulting rank ('1, 2, 3...') to the 'Priority' key.
1570 49
1571 50 Constraints & Formatting Rules:
1572 51 * The final output MUST be a single JSON object. Do not include any text, explanations, or markdown
1573 52 formatting before or after the JSON.
1574 53 * If no valid disconnections are identified after the full analysis, the output must be a valid JSON object
1575 54 with an empty 'disconnections' list (i.e., '{"disconnections": []}').
1576 55 * The root key of the object must be 'disconnections', containing a list of disconnection objects.
1577 * Each object in the list must contain the following keys:
1578 * "disconnection": A string representing the complete reaction center as viewed from the product
1579 molecule. It must list all non-hydrogen atoms in the product that are directly involved in the
1580 transformation from the reactants. This includes atoms that change their connectivity, atoms whose
1581 bonds change order (e.g., a C=C in the reactant becomes a C-C in the product), or atoms that are the
1582 site of a stereochemical change. However, for transformations that require adding a new group to
1583 the molecule (such as a retrosynthetic protection), you must list the attachment points in the
1584 product where the new group is added. The atoms must be separated by spaces.
1585 * Example (Bond Cleavage / Deprotection): "C:5_N:7" (These two atoms are bonded in the product
1586 but were on separate reactant molecules).
1587 * Example (Cycloaddition): "C:1_C:2_C:3_C:4_C:5_C:6" (These six atoms in the product form a new
1588 ring that was not present in the reactants).
1589 * Example (Functional Group Interconversion - FGI): "C:8_C:9" (Represents a transformation on
1590 the bond between these atoms, such as reducing a double bond to a single bond) or "N:1_O:2_O:3"
1591 (Represents replacing one functional group, like an amine, with its precursor, like a nitro
1592 group).
1593 * Example (Protection): "N:26" (Represents a transformation at a single or multiple atoms, such
1594 as adding a protecting group to an amine nitrogen. For transformations that add a group, this
1595 string identifies the single (or multiple) attachment points in the product where the
1596 transformation occurs).
1597 * Example (Stereochemical Change): "C:25" (This atom in the product has a specific
1598 stereochemistry that was set during the reaction).
1599 * "Reaction": A list representing all reactions of a specific disconnection point. Each individual
1600 reaction has:
1601 * "forwardReaction": A string for the reaction name. If the reaction is from the ontology, use its
1602 exact 'id'. If you determine that no ontology entry is a good fit and a different reaction is
1603 more appropriate (the 'OtherReaction' case), you must use your own standard, descriptive name
1604 for that reaction (e.g., 'Intramolecular_Friedel-Crafts').
1605 * "isInOntology": A boolean ('true' or 'false') indicating if the "forwardReaction" name was found
1606 in the provided 'reaction_ontology' JSON.
1607 * "forwardReactionClass": The broader reaction class of the "forwardReaction" selected from:
1608 'Reduction', 'Acylation', 'Heteroatom_Alkylation_and_Arylation', 'Functional_Group_Addition',
1609 'Protection', 'C-C_Coupling', 'Deprotection', 'Functional_Group_Interconversion', 'Aromatic_
1610 Heterocycle_Formation', 'Oxidation'. In case of no matching class pick 'Miscellaneous'.
1611 * "Retrosynthesis_Importance": A numerical value from 4 to 1, corresponding to the ranking rationale
1612 (4 = Very High, 1 = Lower).
1613 * "Priority": A sequential integer ('1, 2, 3...') representing the calculated priority of the
1614 disconnection.
1615 * "rationale": A concise string explaining the strategic value. It must justify the importance level
1616 by referencing the strategic goals (a, b, c, d, e), explicitly state which analysis from Step
1617 1 led to this disconnection (e.g., 'Convergent_disconnection...'), and comment on any
1618 potential chemoselectivity issues, the need for protecting groups, or thermodynamic vs. kinetic
1619 control considerations.
1620
1621 JSON Output Example:
1622 {
1623   "disconnections": [
1624     {
1625       "disconnection": "C:1_C:2",
1626       "reactions": [
1627         {
1628           "forwardReaction": "Forward_reaction_name",
1629           "isInOntology": true,
1630           "forwardReactionClass": "Broader_reaction_class",
1631           "Retrosynthesis_Importance": 4,
1632           "Priority": 1,
1633           "rationale": "string"
1634         },
1635         // more reactions for the same disconnection point
1636       ]
1637     },
1638     // more disconnection points
1639   ]
1640 }
1641
1642 Retrosynthetic Analysis Framework
1643
1644 Primary Strategic Goals: Analyze the molecule according to the following framework. Note: You must
1645 identify and report reactions on all strategic goal levels. The strategic goals are for the rationale in
1646 the final output, not for filtering. Do not omit lesser strategic reactions like protecting group
1647 removals.
1648
1649 a) Structural Simplification: Lead to readily available or simpler starting materials.
1650
1651 b) Reaction Robustness: Involve robust, high-yielding, and reliable forward reactions.
1652
1653 c) Strategic Construction: Strategically build the core scaffold or install key functionalities
1654 efficiently.
1655
1656 d) Practicality & Efficiency: Prioritize reactions with good atom economy that avoid notoriously
1657 toxic or expensive reagents and are known to be scalable.
1658
1659 e) Stereochemical Control: For chiral molecules, the plan must address how each stereocenter will be
1660 controlled.
1661
1662 Ranking Rationale (for assigning Importance value): Analyze the molecule according to the following
1663 framework. Note: You must identify and report reactions from all relevant importance levels. The

```

```

1620 importance score is for prioritization in the final output, not for filtering. Do not omit lower-
1621 importance findings like protecting group removals.
1622 97 * **Importance 4 (Very High):** Major ring-forming reactions, disconnections that reveal symmetry, or
1623 those that convergently connect major fragments. Includes powerful skeletal rearrangements that
1624 build the core.
1625 98 * **Importance 3 (High):** Reliable attachment of key functional groups or substituents to an existing
1626 core. Includes the strategic installation of a key stereocenter via an asymmetric reaction.
1627 99 * **Importance 2 (Medium):** Standard functional group interconversions (FGIs) or formation of less
1628 complex C-C or C-X bonds. Includes less critical rearrangements or stereochemical modifications.
1629 00 * **Importance 1 (Lower):** Disconnections of simple, easily accessible fragments or those related to
1630 reagent synthesis (e.g., protecting groups).
1631 01 ####
1632 102
1633 103 **Reaction Ontology:**
1634 104
1635 105 <reaction_ontology>
1636 106
1637 107 ### Molecule for Analysis
1638 108
1639 109 **Product SMILES:**
1640 110
1641 111 <canonicalized_product>
1642 112
1643 113 ####
1644 114
1645 115 Remember to return all possible reactions. You can identify more than one reaction for a specific position.

```

Listing 1: Position Model Prompt.

A.6.2 TRANSITION MODEL

Note: This prompt is slightly altered for visualization purposes.

```

1642 1 **Persona:**
1643 2 You are an expert chemist specializing in synthetic reaction modeling.
1644 3
1645 4 **Primary Goal:**
1646 5 Given a product molecule, a specified reaction center, and a reaction type, your task is to generate all
1647 chemically reasonable reactant molecules that would form the product. When a reaction name is provided,
1648 you will model that specific transformation. When it is not, you will suggest and model all plausible
1649 reactions for the given transformation. You will then validate each option based on practical chemical
1650 principles. The entire output must be a single, valid JSON object.
1651 6
1652 7 **Input Schema:**
1653 8 * 'reaction_center_atoms': A string identifying the **approximate location** of the transformation, using atom
1654 mappings. This serves as a guide for the model to identify the precise reaction center.
1655 9 * **Example (Bond Cleavage):** 'C:5_N:7'
1656 10 * **Example (Ring Formation/Cycloaddition):** 'c:1_c:2_c:3_c:4_c:5_c:6'
1657 11 * **Example (FGI):** 'C:8_C:9'
1658 12 * **Example (Protection):** 'N:26'
1659 13 * **Example (Stereochemical Change):** 'C:25'
1660 14 * 'product_smiles': The atom-mapped SMILES string of the product molecule.
1661 15 * 'forward_reaction_name' (optional): The name of a specific forward reaction to be modeled.
1662 16 * 'retrosynthesis_reaction_examples' (optional): A list of retrosynthesis reaction SMILES strings to use as a
1663 blueprint.
1664 17
1665 18 **Internal Analysis Pipeline:**
1666 19 To generate the final JSON object, you will internally execute the following data transformation pipeline.
1667 This is a strict, one-way sequence from Step 1 to the final output. The steps must be executed exactly
1668 once in order, without looping back to a previous step. The output of each step serves as the direct
1669 input for the next.
1670 20
1671 21 1. **Step 1: Determine Reaction(s) to Model**
1672 22 * **Input:** The 'forward_reaction_name' (optional) and 'reaction_center_atoms' from the user.
1673 23 * **Process:** If a 'forward_reaction_name' is provided, use it as the sole reaction. If not, analyze the
1674 'reaction_center_atoms' to generate a list of potential 'forward_reaction_name's.
1675 24 * **Output (Internal):** A list of reaction names to be modeled.
1676 25
1677 26 2. **Step 2: Refine Reaction Center**
1678 27 * **Input:** The list of 'forward_reaction_name's (Step 1), the users 'reaction_center_atoms', and any '
1679 retrosynthesis_reaction_examples'.
1680 28 * **Process:** For each 'forward_reaction_name', use your expert chemical knowledge and the provided
1681 examples to determine the **precise and complete reaction center**. The users input is a guide for
1682 the location, but you must refine it by adding or removing atoms to match the true mechanism of the
1683 reaction.
1684 29 * **Output (Internal):** A mapping of each 'forward_reaction_name' to its 'precise_reaction_center_atoms'
1685 string.
1686 30
1687 31 3. **Step 3: Extract Atom-Level Reaction Template**
1688 32 * **Input:** The list of 'forward_reaction_name's from Step 1, the **precise reaction center** from step
1689 2, and the user-provided 'retrosynthesis_reaction_examples'.
1690 33 * **Process:** For each 'forward_reaction_name', analyze its corresponding valid example(s). Your primary
1691 goal is to extract the **structural pattern** and **JSON format** of the transformation from these
1692 examples. By analyzing the transformation from the product to the reactant side, extract a formal,
1693 atom-level retrosynthetic rule (the "template"). If a specific chemical detail in an examples '
1694 modification_smarts' seems inconsistent with the 'forward_reaction_name', prioritize deriving the
1695 correct chemical group based on your expert knowledge, while strictly adhering to the JSON structure
1696 taught by the example. If no valid examples are provided, derive the template from your general
1697 chemical knowledge.

```

```

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1735 94
1736 95
1737 96
1738 97
1739 98
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1742 101
1743 102
1744 103
1745 104

```

```

* **Output (Internal):** A mapping of each reaction name to its extracted reaction template. The template
  must be a single JSON object following this structure:
  ```json
 // Template Structure: A self-contained rule object
 {
 "precise_reaction_center_atoms": "<space_separated_list_of_atom_maps>",
 "modifications": [
 {
 "target_atom_map": "<map_number_of_atom_to_modify>",
 "modification_smarts": "<SMILES_or_SMARTS_of_the_complete_functional_group_on_this_atom_in_the_reactant>"
 }
]
 }
 // ... one object for each atom that is modified ...
]
  ```

* **Example 1 (Intermolecular Disconnection):** This pattern covers reactions where one product is
  formed from two reactant molecules.
  ```json
 {
 "precise_reaction_center_atoms": "C:1_C:7",
 "modifications": [
 { "target_atom_map": "1", "modification_smarts": "[c:1][X]" },
 { "target_atom_map": "7", "modification_smarts": "[c:7][Y]" }
]
 }
  ```

* **Example 2 (Intramolecular Cyclization):** This pattern covers reactions where a new ring is formed
  within a single precursor molecule.
  ```json
 {
 "precise_reaction_center_atoms": "C:1_C:6",
 "modifications": [
 { "target_atom_map": "1", "modification_smarts": "[C:1]X" },
 { "target_atom_map": "6", "modification_smarts": "[C:6]Y" }
]
 }
  ```

* **Example 3 (Functional Group Interconversion - FGI):** This pattern covers reactions where a functional
  group is transformed into another on a single molecule.
  ```json
 {
 "precise_reaction_center_atoms": "C:1_O:2",
 "modifications": [
 { "target_atom_map": "1", "modification_smarts": "[C:1]=[O:2]" }
]
 }
  ```

* **Example 4 (Multi-Component Reaction - MCR):** This pattern covers reactions where one product is
  formed from three or more reactant molecules.
  ```json
 {
 "precise_reaction_center_atoms": "A:1_B:2_C:3",
 "modifications": [
 { "target_atom_map": "1", "modification_smarts": "[A]X" },
 { "target_atom_map": "2", "modification_smarts": "[B]Y" },
 { "target_atom_map": "3", "modification_smarts": "[C]Z" }
]
 }
  ```

4. **Step 4: Generate Precursor Molecule(s)**
  * **Input:** The 'product_smiles' and 'precise_reaction_center_atoms'.
  * **Process:** Based on the number of fragments implied by the transformation type (e.g., two for an
    intermolecular disconnection, one for an FGI, three for a 3-component MCR), generate the
    corresponding core precursor molecule(s). This is done by cleaving the necessary bonds in the
    product or, for 1-to-1 transformations, identifying the single precursor scaffold.
  * **Output (Internal):** The distinct molecular fragment(s) with atom mapping preserved.

5. **Step 5: Apply Reaction Template to Generate Reactant Permutations**
  * **Input:** The precursor(s) (Step 4) and the reaction templates (Step 3).
  * **Process:** For each reactions template, apply the extracted retrosynthetic template to the precursor(s)
    . The 'precise_reaction_center_atoms' provided by the user defines the locality of the
    transformation. You must use your chemical expertise to apply the template correctly to the atoms in
    and around this specified location, ensuring the final transformation is chemically consistent
    with the templates logic. This process must include generating all possible permutations of the
    reactive groups. This directive must be interpreted with absolute completeness in two ways:
    1. **Fragment-Role Permutations:** For a disconnection into multiple fragments with distinct reactive
      groups, you must generate reactant sets for all possible assignments of those groups to the
      fragments.
    2. **Intra-Group Class Permutations:** If a generated reactive group belongs to a general chemical
      class (e.g., an "organohalide," "leaving_group," or "protecting_group"), you are required to
      generate an exhaustive list of separate options for all chemically distinct members of that
      class known to be compatible with the reaction.
  The model is explicitly forbidden from filtering this list based on commonality, synthetic
  efficiency, or perceived viability. If a variant is chemically possible, it must be included in
  the output.

```

```

1728
1729 * **Output (Internal):** A list of all potential reactant options generated from this exhaustive process,
1730 each associated with a 'forward_reaction_name'. No chemically possible permutations may be omitted.
1731 Please dont provide reagents as reactants.
1732
1733 6. **Step 6: Validate and Justify Each Option**
1734 * **Input:** The list of potential reactant options from Step 5.
1735 * **Process:** For each generated option, perform a rigorous chemical validation.
1736   * A) **Stability:** Are the proposed reactants chemically stable?
1737   * B) **Chemoselectivity:** Would the reaction be selective? Are there other functional groups that
1738       would interfere?
1739   * C) **Stereochemical Consistency:** Is the transformation stereochemically sound? Does it correctly
1740       account for the creation or modification of stereocenters in the product?
1741   * D) **Plausibility:** Is the reaction electronically and sterically plausible for this specific pair?
1742 * **Output (Internal):** The same list of options, but now each object contains an 'is_valid' boolean and
1743 a detailed 'reasoning' string that explicitly addresses these validation points.
1744
1745 ### **Step 7: Final Formatting and Grouping**
1746 * **Input:** The validated and justified flat list of *real chemical options* from Step 6.
1747 * **Process:**
1748   1. **Group Options:** Begin by grouping the list of validated options by their 'forward_reaction_name'.
1749   2. **Extract Wildcard Reaction Class** Looking at the validated options and their reaction names, you
1750       must deduct a general reaction class template if possible using the '<CLASS:..>' tag. It signals
1751       that a member of this chemical class (e.g. '<CLASS:AmineProtectingGroup>') should be used instead of
1752       an explicit molecular structure.
1753   3. **Generate General Template Entry (if applicable):** For each extracted general reaction class
1754       template, you **should** create one additional, special permutation object derived from the two
1755       provided general reaction classes. This object serves as the general, machine-readable
1756       representation for the entire transformation class and should be placed at the **beginning** of the
1757       'reactant_permutations' list. The two possible options for this general reaction class template are:
1758   * For a **Defined Chemical Class** (e.g., '<CLASS:Halogen>'), where the reactants share a specific
1759       generalizable atoms across all precursor molecule(s) from Step 6, introduce the a SMARTS pattern
1760       (e.g., '[A,B,C]') as a replacement for these generalizable atoms. If possible, create a joined
1761       template covering generalizable atoms on all possible reactants instead of creating multiple
1762       templates.
1763   * For a **Wildcard Addition Class** (e.g., '<CLASS:ProtectingGroup>'), where the specific reagent
1764       added in the retrosynthetic step is a strategic choice from a broad and variable unknown set,
1765       the added group is represented by a generic wildcard atom ('[*]'). This string is generated by
1766       taking the appropriate precursor molecule(s) from Step 6 and creating a new bond between the
1767       wildcard atom ('[*]') and the product that generalizes the explicit reactant options.
1768   * This special permutation object must have the following structure:
1769     * 'reactants': A list containing the single, atom-mapped SMILES string with the general
1770       representation.
1771     * 'is_valid': 'true'.
1772     * 'is_template': 'true'. Indicating that this result is a wildcard template.
1773     * 'reasoning': A string that explicitly identifies this as the general template and names the
1774       chemical class in the format '<Class:XYZ>'.
1775   4. **Assemble Final List:** For each unique reaction, create a single object containing the '
1776       forward_reaction_name' and its final 'reactant_permutations' list. This list will now contain the
1777       general template entry at the top (if applicable), followed by all the validated, specific examples
1778       from Step 6.
1779   5. **Finalize and Clean:** Assemble these grouped objects into the final 'reaction_analysis' list
1780       according to the 'Output Schema'. Keep the original atom mapping of the product where possible and
1781       do not introduce new atom maps on the reactant side, but use unmapped atoms.
1782 * **Output:** The final, single JSON object.
1783
1784 **Output Schema Strict JSON Only:**
1785 ```json
1786 {
1787   "product": "<SMILES>",
1788   "reaction_analysis": [
1789     {
1790       "forward_reaction_name": "Name_of_Reaction_1_(e.g.,_Suzuki-Miyaura_coupling)",
1791       "reactant_permutations": [
1792         {
1793           "reactants": ["<SMILES_1A>", "<SMILES_1B>"],
1794           "is_valid": true,
1795           "is_template": false,
1796           "reasoning": "This_permutation_is_valid._The_reactants_are_stable_and_the_reaction_is_chemoselective"
1797         },
1798         {
1799           "reactants": ["<SMILES_2A>", "<SMILES_2B>"],
1800           "is_valid": false,
1801           "is_template": false,
1802           "reasoning": "This_permutation_is_invalid_due_to_severe_steric_hindrance_at_the_reaction_site."
1803         }
1804       ]
1805     }
1806   ]
1807 }
1808 // ... one object for each unique reaction suggested in Step 1 ...
1809 ]
1810 }
1811
1812 ** Input **
1813
1814 "reaction_center_atoms": <REACTION_POSITION>
1815 "forward_reaction_name": <REACTION_NAME>
1816 "product_smiles": <PRODUCT_SMILES>
1817 "retrosynthesis_reaction_examples": <TRAIN_REACTION_EXAMPLES>

```

Listing 2: Transition Model Prompt.

```

1782
1783 1 Task:
1784 2 Given a product molecule, a reaction center, and an optional reaction name, your task is to generate all
1785 3 chemically reasonable reactant molecules that would form the product. The entire output must be a single
1786 4 , valid JSON object following the specified schema.
1787 5
1788 6 Instructions:
1789 7
1790 8 Identify the reaction(s) to model based on the inputs.
1791 9
1792 10 For each reaction, determine the retrosynthetic disconnection.
1793 11
1794 12 Generate all possible reactant permutations, including variations for chemical classes (e.g., all halogens
1795 13 for an organohalide). Do not filter out any chemically possible options.
1796 14
1797 15 For each permutation, validate its chemical feasibility (stability, selectivity, etc.) and provide a brief
1798 16 justification.
1799 17
1800 18 Group the results by forward_reaction_name in the final JSON output.
1801 19
1802 20 Input Schema:
1803 21
1804 22 reaction_center_atoms: A string identifying the approximate location of the transformation, using atom
1805 23 mappings.
1806 24
1807 25 Example (Bond Cleavage): "C:5_N:7"
1808 26
1809 27 Example (Ring Formation/Cycloaddition): "c:1_c:2_c:3_c:4_c:5_c:6"
1810 28
1811 29 Example (FGI): "C:8_C:9"
1812 30
1813 31 Example (Protection): "N:26"
1814 32
1815 33 Example (Stereochemical Change): "C:25"
1816 34
1817 35 product_smiles: The atom-mapped SMILES string of the product molecule.
1818 36
1819 37 forward_reaction_name (optional): The name of a specific forward reaction to be modeled.
1820 38
1821 39 retrosynthesis_reaction_examples (optional): A list of retrosynthesis reaction SMILES strings to use as a
1822 40 blueprint.
1823 41
1824 42 Output Schema Strict JSON Only:
1825 43
1826 44 {
1827 45   "product": "<SMILES>",
1828 46   "reaction_analysis": [
1829 47     {
1830 48       "forward_reaction_name": "Name_of_Reaction_1_(e.g.,_Suzuki-Miyaura_coupling)",
1831 49       "reactant_permutations": [
1832 50         {
1833 51           "reactants": ["<SMILES_1A>", "<SMILES_1B>"],
1834 52           "is_valid": true,
1835 53           "is_template": false,
1836 54           "reasoning": "This_permutation_is_valid._The_reactants_are_stable_and_the_reaction_is_chemoselective"
1837 55         },
1838 56         {
1839 57           "reactants": ["<SMILES_2A>", "<SMILES_2B>"],
1840 58           "is_valid": false,
1841 59           "is_template": false,
1842 60           "reasoning": "This_permutation_is_invalid_due_to_severe_steric_hindrance_at_the_reaction_site."
1843 61         }
1844 62       ]
1845 63     }
1846 64   ]
1847 65   // ... one object for each unique reaction suggested ...
1848 66 }
1849 67
1850 68 ** Input **
1851 69
1852 70 "reaction_center_atoms": <REACTION_POSITION>
1853 71 "forward_reaction_name": <REACTION_NAME>
1854 72 "product_smiles": <PRODUCT_SMILES>
1855 73 "retrosynthesis_reaction_examples": <TRAIN_REACTION_EXAMPLES>

```

Listing 3: Ablation Study Short Transition Model Prompt.

Table 10 – continued from previous page

| Prio. | Position | Reaction | Ontology | Imp. | Rationale |
|-------|-----------|---|----------|------|---|
| 4 | C:16 N:17 | Reductive amination with aldehyde | Yes | 3 | A high-importance disconnection linking the complex poly-amine linker to the carbazole-based E3 ligase binder. This reductive amination, identified via Inter-Fragment Analysis (C), is a robust and efficient method for forming C-N bonds (b, c). The aldehyde precursor on the linker would need to be synthesized or unmasked just prior to the coupling. |
| 5 | C:16 N:17 | N-alkylation of primary amines with alkyl halides | Yes | 3 | Alternative high-importance strategy to connect the linker and ligase binder via nucleophilic substitution. Identified through Inter-Fragment Analysis (C), this approach offers a reliable C-N bond formation (b, c). However, it may face challenges with over-alkylation and requires an activated halide precursor, making reductive amination often preferable for complex substrates. |
| 6 | C:28 N:29 | Buchwald-Hartwig/Ullmann-Goldberg/N-arylation primary amine | Yes | 3 | A key disconnection of an aryl-amine bond, attaching the sidechain to the phosphine oxide-bearing ring. This Buchwald-Hartwig amination, identified via Inter-Fragment Analysis (C), is a powerful tool for constructing this bond (b, c). The reaction requires careful optimization of catalyst, ligand, and base to avoid side reactions with other functional groups. |
| 7 | C:48 N:13 | Carboxylic acid to amide conversion | Yes | 3 | A strategic amide bond disconnection within the linker structure. Derived from Strategic Bond Analysis (D), this step breaks the linker into two smaller, more manageable fragments, facilitating a modular and convergent assembly (a, c). Standard peptide coupling conditions are expected to be effective. |
| 8 | C:11 N:10 | Carboxylic acid to amide conversion | Yes | 3 | A key amide bond disconnection that partitions the complex linker. This approach, from Strategic Bond Analysis (D), allows for a stepwise, controlled assembly of the linker from smaller building blocks (a, c). The presence of multiple amine nucleophiles necessitates an orthogonal protecting group strategy for a successful synthesis. |
| 9 | C:53 N:2 | N-alkylation of secondary amines with alkyl halides | Yes | 3 | An alternative high-importance strategy for linking the warhead to the linker. Identified via Strategic Bond Analysis (D), this disconnection leads to an activated alkyl halide on the warhead and the free amine of the linker. This C-N bond formation (c) could be viable if the amide connection proves difficult, but requires careful control to prevent side reactions. |

Continued on next page

Table 10 – continued from previous page

| Prio. | Position | Reaction | Ontology | Imp. | Rationale |
|-------|-----------|-------------------------------------|----------|------|--|
| 10 | N:17 | Reduction of nitro groups to amines | Yes | 2 | A standard Functional Group Interconversion (FGI) step, deriving the key aniline nitrogen from a nitro group precursor. Identified via FGI Analysis (H), this is a robust transformation (b). The nitro group serves as a masked amine and can influence the reactivity of the aromatic ring during earlier synthetic steps before being reduced for linker attachment. |
| 11 | N:29 | Reduction of nitro groups to amines | Yes | 2 | A common Functional Group Interconversion (FGI) identified via FGI Analysis (H), where the aniline is derived from reduction of a nitro group. This is a very reliable reaction that allows the use of nitro-group chemistry (e.g., directing effects in EAS) earlier in the synthesis of the phosphine oxide-bearing fragment (a, b). |
| 12 | N:5 | Boc amine deprotection | Yes | 1 | A necessary deprotection step to reveal a reactive amine within the linker for subsequent elaboration. Identified via Protecting Group Analysis (I), this step is crucial for the sequential, controlled construction of the linker (c). While of lower strategic importance for bond formation, it is of high practical importance for the overall synthetic route's success. |
| 13 | C:68 N:76 | Intramolecular Imine Formation | No | 4 | This represents the key intramolecular ring-closing step to form the seven-membered diazepine ring of the warhead. Derived from Intra-Fragment Analysis (E), this disconnection breaks the core scaffold down to a more flexible linear precursor, which simplifies installation of the chiral center C:54 (a, c, e). This is a thermodynamically driven condensation. |
| 14 | C:33 P:34 | Palladium-catalyzed P-C coupling | No | 3 | High importance disconnection of the aryl C-P bond, which installs the key dimethylphosphine oxide group. This disconnection, from Inter-Fragment Analysis (C), simplifies the aromatic precursor to a simple aryl halide or triflate (a). The forward reaction is a reliable palladium-catalyzed coupling of an aryl halide with a P(V) species like H-P(O)Me ₂ (b, c). |
| 15 | P:34 O:37 | Phosphine Oxidation | No | 2 | A Functional Group Interconversion (FGI) where the phosphine oxide is formed by oxidation of the corresponding tertiary phosphine. This step, from FGI Analysis (H), is often performed late in the synthesis as the precursor phosphine can act as a ligand and be poisoned in preceding metal-catalyzed coupling steps (c). The oxidation itself is typically straightforward and high-yielding. |

A.7.2 MCL-1 COMPOUND 25 - MACROCYCLE

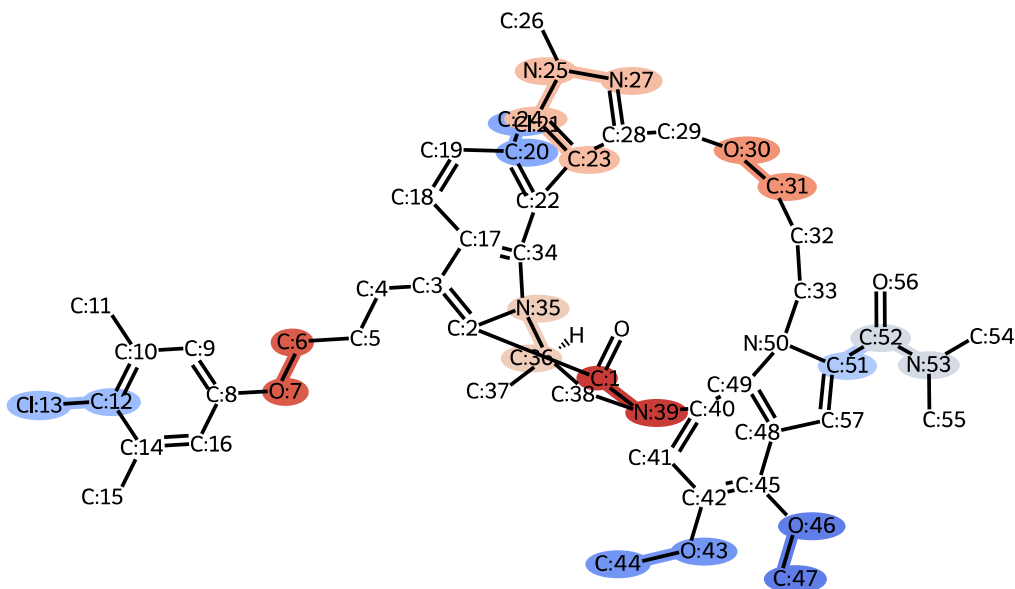


Figure 18: Position model prediction for MCL-1 compound 25 Tarr et al. (2025) Macrocycle using Gemini 2.5 Pro and PaRoutes reaction ontology

Table 11: Predicted Disconnection Sites for MCL-1 compound 25 Tarr et al. (2025) using Gemini 2.5 Pro and PaRoutes reaction ontology. Header descriptions are as follows: **Prio.:** Priority Ranking of the Disconnections; **Position:** The position where the disconnection is; **Reaction:** The forward reaction; **Ontology:** If the reaction is in the reaction ontology for which examples are available; **Imp.:** Retrosynthesis Importance, alignment with retrosynthesis goals; **Rationale:** The chemical rationale.

| Prio. | Pos. | Reaction | Ont. | Imp. | Rationale |
|-------|----------|-------------------------------------|------|------|--|
| 1 | C:1 N:39 | Carboxylic acid to amide conversion | Yes | 4 | Very high importance disconnection forming the central seven-membered diazepinone ring via a reliable intramolecular lactamization. (Analysis E) This is a key strategic step for constructing the core scaffold (c). The reaction is robust, but requires high-dilution conditions to prevent intermolecular polymerization (d). |
| 2 | C:6 O:7 | Williamson Ether Synthesis | Yes | 4 | Very high importance disconnection that convergently couples the complex core scaffold to a simpler, readily available 4-chloro-2,5-dimethylphenol fragment. (Analysis C) This approach greatly simplifies the overall synthesis (a). Potential chemoselectivity issues between N- and O-alkylation on the precursor must be addressed by careful choice of base and conditions. |

Continued on next page

Table 11 – continued from previous page

| Prio. | Pos. | Reaction | Ont. | Imp. | Rationale |
|-------|---------------------|---|------|------|--|
| 3 | C:6 O:7 | Mitsunobu aryl ether | Yes | 4 | An alternative very high importance convergent disconnection linking the core to the phenol side chain. (Analysis C) The Mitsunobu reaction proceeds under mild conditions but suffers from poor atom economy and uses hazardous reagents, impacting its practicality for large-scale synthesis (d). |
| 4 | C:31 O:30 | Williamson Ether Synthesis | Yes | 4 | Very high importance disconnection that convergently assembles the molecule by coupling the indole core with the pyrazole-containing side chain. (Analysis C) This is a robust and strategic C-O bond formation (b, c) that breaks the molecule into two large, more manageable synthons (a). |
| 5 | C:31 O:30 | Mitsunobu aryl ether | Yes | 4 | An alternative very high importance disconnection for coupling the indole and pyrazole fragments. (Analysis C) This offers a mild route for the ether formation but is less atom-economical than the Williamson synthesis, which is a key consideration for efficiency (d). |
| 6 | c:23 n:27 n:25 c:24 | Pyrazole formation | Yes | 4 | Very high importance multi-bond disconnection that constructs the pyrazole ring in a single, powerful step from acyclic precursors. (Analysis J) This is a classic, high-yielding heterocycle synthesis (b) that dramatically simplifies one of the key fragments (a, c). |
| 7 | N:35 C:36 | Reductive amination with ketone | Yes | 3 | High importance disconnection that simplifies the core scaffold by opening the diazepinone ring. (Analysis D) This strategy creates a linear precursor and provides a direct pathway to install the C:36 stereocenter via an asymmetric variant of the forward reaction (c, e). |
| 8 | C:36 | Reductive amination with ketone | Yes | 3 | High importance transformation focused on creating the molecule's sole stereocenter. (Analysis F) An asymmetric reductive amination or the reduction of the corresponding imine is a powerful strategy for establishing the required stereochemistry with high control (e). |
| 9 | C:52 N:53 | Carboxylic acid to amide conversion | Yes | 3 | High importance disconnection for the installation of the terminal dimethylamide group. (Analysis H) This is a robust and extremely common transformation (b), coupling a carboxylic acid precursor with dimethylamine, both of which are simple starting materials (a). |
| 10 | C:52 N:53 | Acylation of Nitrogen Nucleophiles by Acyl/Thioacyl/Carbamoyl Halides and Analogs.N | Yes | 3 | An alternative high importance disconnection for forming the dimethylamide. (Analysis H) Using an activated acyl chloride precursor is a highly reliable and efficient method for this acylation, representing a key functional group installation (c, d). |

Continued on next page

Table 11 – continued from previous page

| Prio. | Pos. | Reaction | Ont. | Imp. | Rationale |
|-------|------------|--------------------------|------|------|--|
| 11 | c:51 C:52 | Friedel-Crafts acylation | Yes | 3 | High importance disconnection creating a key C-C bond by attaching the amide sidechain to the indole core. (Analysis D) This strategy relies on the electrophilic substitution of an electron-rich indole system (c). Regiocontrol could be challenging and may require specific reaction conditions or a pre-functionalized indole. |
| 12 | c:12 Cl:13 | Aromatic chlorination | Yes | 2 | Medium importance disconnection for a standard functional group interconversion. (Analysis H) The chlorine atom can be installed via electrophilic aromatic substitution. This is a reliable reaction (b), though regioselectivity would be dictated by other substituents on the ring. |
| 13 | c:20 Cl:21 | Aromatic chlorination | Yes | 2 | Medium importance FGI for installing the second chlorine atom. (Analysis H) This transformation would likely occur on an advanced intermediate, and control of regioselectivity would be crucial for the success of this step (c). |
| 14 | O:43 C:44 | O-methylation | Yes | 2 | Medium importance disconnection representing a standard functional group interconversion. (Analysis H) Installation of the methoxy group via methylation of a phenol precursor provides synthetic flexibility and starts from a simpler material (a). It is a robust reaction (b). |
| 15 | O:46 C:47 | O-methylation | Yes | 2 | Medium importance FGI for the second methoxy group. (Analysis H) Methylating a di-phenol precursor is a common strategy. If sequential methylation is needed, a protecting group strategy would be required to ensure chemoselectivity. |
| 16 | N:39 | Boc amine deprotection | Yes | 1 | Lower importance disconnection related to a tactical protecting group strategy. (Analysis I) This implies the use of a Boc group on the amide nitrogen to prevent unwanted side reactions during synthesis. Its removal is a necessary but not a core strategic bond-forming step (d). |

A.8 DEEPSEEK-R1 POSITION MODEL REASONING TRACE

Note: This reasoning trace using the PaRoutes reaction ontology has been slightly altered for visualization purposes. Deepseek-R1 was utilized for this demonstration because it provides full raw reasoning traces, whereas Gemini 2.5 Pro outputs only summaries. Therefore, this trace serves as an illustrative example of our "atom anchor" molecular reasoning framework rather than a benchmark of maximum model performance. Additionally, the text includes explanatory notes on the reasoning process and expert commentary by a chemist regarding chemical validity.

```
#DeepSeek-R1 Reasoning Trace for LEI-515 with explanations & chemist comments
```

```
> Input Smiles: ``C[CH2:1][C:2]([C:3](=[O:4])[CH2:5][S:6](=[O:7])[c:8]1[cH:9][cH:10][c:11]([C:12](=[O:13])[N:14]2[CH2:15][CH2:16][N:17]([c:18]3[cH:19][c:20]([Cl:21])[cH:22][cH:23][cH:24]3)[C@@H:25]([CH3:26])[C@@H:27]2[CH3:28])[cH:29][c:30]1[Cl:31])([F:32])[F:33]``
```

We are given the product SMILES string with atom mapping. We need to perform retrosynthetic analysis step-by-step as described.

Step 1: Identify All Candidate Transformations (A to L)

Lets break down the molecule:

Explanation 1: This section provides a detailed breakdown of the mapped SMILES string. The purpose is to accurately parse the molecules architecture, identifying all key functional groups, ring systems, and their precise connectivity before proceeding to the strategic analysis.

The molecule has the following features:

- A central carbon (C:2) attached to:
 - A ethyl group (C:1 is methyl, attached to CH2:1? Actually, the SMILES starts with C[CH2:1] meaning atom 1 is CH2, attached to a methyl (C) and then to C:2). So its a propyl group? Actually, the SMILES: C[CH2:1][C:2]... means that atom 1 is CH2 (carbon with two Hs) attached to a methyl (C) and to C:2. So the group is -CH2CH3? But note: the methyl is not mapped. So the group is ethyl? Actually, the SMILES: C[CH2:1] means a carbon (unmapped) attached to CH2:1. So the group is -CH2-CH3? But the atom mapping: [CH2:1] is atom 1, and the preceding C is unmapped. So the group is ethyl: -CH2-CH3, but the methyl is not mapped.

Chemist: The model rightfully points out that C:0 is not mapped!

Let me write the molecule in a more readable way:

The SMILES:

```

'''C[CH2:1][C:2]([C:3](=[O:4])[CH2:5][S:6](=[O:7])[c:8]1[cH:9][cH:10][c:11]([C:12](=[O:13])[N:14]2[CH2:15][CH2:16][N:17]([c:18]3[cH:19][c:20]([Cl:21])[cH:22][cH:23][cH:24]3)[C@@H:25]([CH3:26])[C@@H:27]2[CH3:28])[cH:29][c:30]1[Cl:31])([F:32])[F:33])'''

```

We can see:

- The molecule has a central carbon (C:2) that is tertiary, attached to:
 1. A group: -CH2-CH3 (atoms: unmapped C and CH2:1)
 2. Two fluorines (F:32 and F:33)
 3. A chain: -C(=O)-CH2-S(=O)-aryl

Chemist: Due to how the input SMILES was structured, C:2 is given the role as central carbon which is debatable, but understandable from a SMILES linguistic point of view

The chain:

- C:3 is carbonyl carbon, attached to O:4 (double bond) and then CH2:5
- CH2:5 attached to S:6, which has double bond to O:7 and attached to aryl ring (c:8)

The aryl ring (c:8) is substituted at positions:

- c:8 attached to c:9 (CH), c:10 (CH), c:11 (C), c:29 (CH), c:30 (C) and then back to c:8? Actually, its a benzene ring: c:8, c:9, c:10, c:11, c:29, c:30, and then c:30 attached to Cl:31 and back to c:8? Actually, the SMILES: [c:8]1[cH:9][cH:10][c:11](...)[cH:29][c:30]1[Cl:31] -> so its a benzene ring with substituents at c:11 and c:30? Actually, c:11 has a substituent: [C:12](=[O:13])[N:14]2[CH2:15][CH2:16][N:17](...)[C@@H:25]([CH3:26])[C@@H:27]2[CH3:28]

So the substituent at c:11 is: -C(=O)-N< (where the nitrogen is part of a piperazine-like ring? Actually, N:14 is attached to C:12 (carbonyl) and then to CH2:15 and CH2:16, then N:17. Then N:17 is attached to an aryl group (c:18) and to C:25 (which is chiral) and then to C:27 (which is also chiral) and then back to N:14? Wait, the ring is: N:14 - CH2:15 - CH2:16 - N:17 - C@@H:25 (CH3:26) - C@@H:27 (CH3:28) - N:14? That would be a 6-membered ring? But note: the atom after N:17 is [C@@H:25] and then [C@@H:27]2, so the ring is: N:14 - C:15 - C:16 - N:17 - C:25 - C:27 - and then back to N:14? But the atom mapping at the end: [C@@H:27]2[CH3:28] and then the ring is closed by the 2 at the end? Actually, the ring closure is at N:14 and C:27? Because the ring is defined by the number 2: [N:14]2 ... [C@@H:27]2. So the ring is: N:14 - CH2:15 - CH2:16 - N:17 - C:25 - C:27 - and then back to N:14? That would be a 6-membered ring? But note: C:25 and C:27 are both chiral carbons.

Chemist: The model correctly identifies the ring shapes in the molecule, meanwhile correctly flagging C25 and C26 as chiral

Additionally, N:17 is attached to an aryl group: [c:18]3[cH:19][c:20]([Cl:21])[cH:22][cH:23][cH:24]3 -> a chlorophenyl group.

So the molecule has:

- A central fluorinated carbon (C:2) with two F atoms and two carbon chains: one ethyl and one chain leading to a sulfonyl group attached to a chlorophenyl ring (with two chlorines? Actually, the ring has Cl:31 at c:30 and Cl:21 at c:20? So its a dichlorophenyl? Actually, the ring at c:8 has two chlorines: Cl:31 at c:30 and Cl:21 at c:20? But note: the ring c:8 is attached to S:6, and then the substituents: at c:11 we have the carbonyl-piperazine part, and at c:30 we have Cl:31. Also, the ring c:18 (attached to N:17) has Cl:21 at c:20.

Chemist: The model has a little bit of confusion if both chlorides are at the same ring or on different positions. The model provides no conclusion.

Now, lets analyze step by step:

Explanation 2: This section systematically applies the 12 core principles of retrosynthetic analysis (A-L) to the parsed molecular structure. The goal is to identify all strategically viable disconnections, including inter-fragment (convergent) and intra-fragment (linear) bonds, as well as key functional group interconversions (FGIs).

A) Symmetry Analysis: The molecule does not appear to have any symmetry.

B) Fragment Partitioning: We can partition the molecule into:

- The ethyl group (C:1 and the unmapped methyl)
- The central fluorinated carbon (C:2) with two fluorines
- The chain: -C(=O)-CH2-SO2-aryl (where the aryl is substituted with a carbonyl-piperazine group and two chlorines)

2214
2215⁶⁰ But note: the chain is complex and includes a piperazine ring and another aryl group. So we might break at the
2216⁶¹ sulfonyl group because sulfonyl groups are often formed by oxidation of thiols or by coupling reactions
2217⁶² .
2218⁶³ **# Chemist: First (wrongful) mention of sulfoxide. Should be sulfoxide (sulfoxide: S=O, Sulfonyl: S(=O)=O)**
2219⁶⁴ C) Inter-Fragment Analysis: The bonds connecting major fragments:
2220⁶⁵ - The bond between C:2 and C:3 (the carbonyl carbon) -> disconnection here would give an alkyl halide (from
2221⁶⁶ C:2) and a nucleophile (from C:3). But note C:3 is carbonyl carbon, so it might be an acyl halide?
2222⁶⁷ But then we have an ester? Actually, the group attached to C:2 is C:3=O, so its a ketone? But wait: C
2223⁶⁸ :2 is attached to C:3 with a single bond? Then C:3 is attached to O:4 with a double bond? So its a
2224⁶⁹ ketone: -C(O)-CH2-SO2-aryl.
2225⁷⁰ **# Chemist: Obviously, it is a ketone, intriguing that it takes so long to confirm this.**
2226⁷¹ So the central carbon (C:2) is a tertiary carbon with two fluorines and two alkyl groups: ethyl and the ketone
2227⁷² chain.
2228⁷³ D) Strategic Bond Analysis: Within fragments, look for bonds adjacent to functional groups.
2229⁷⁴ - The bond between C:3 and C:5: C:3 is carbonyl carbon, so the bond C3-C5 is alpha to the carbonyl.
2230⁷⁵ Disconnection here would be an enolate alkylation? But note: C:5 is CH2, so its a methylene group.
2231⁷⁶ Disconnection at C3-C5 would give a nucleophile at C:5 (as an anion) and an electrophile at C:3 (as
2232⁷⁷ an acyl halide?).
2233⁷⁸ **# Chemist: Really cool to see the model to reason like this. Its all correct!**
2234⁷⁹ - The sulfonyl group: S:6 is attached to C:5 and to the aryl ring (c:8). The bond S:6 - c:8 is a sulfonyl-
2235⁸⁰ aryl bond. This bond can be disconnected via a sulfonylation reaction (aryl sulfonyl chloride + amine
2236⁸¹ ? but here its attached to a methylene, not an amine). Actually, the group attached to S:6 is CH2 (C
2237⁸² :5) and the aryl ring. So its an alkyl-arylsulfone. This bond can be formed by nucleophilic
2238⁸³ substitution: the aryl sulfonyl chloride and a carbanion? Or by coupling? Alternatively, we can
2239⁸⁴ disconnect the sulfonyl group as a whole: the bond S=O might be formed by oxidation of a sulfide.
2240⁸⁵ **# Chemist: This is true of both sulfoxide and sulfone, so the analysis doesnt actually suffer much from the
2241⁸⁶ misinterpretation**
2242⁸⁷ E) Intra-Fragment Analysis: Within major fragments, identify bonds for intramolecular reactions.
2243⁸⁸ - The piperazine ring (N:14, C:15, C:16, N:17, C:25, C:27) is already formed. But note: the ring is closed.
2244⁸⁹ There might not be an intramolecular reaction in the product. However, we can consider that the ring
2245⁹⁰ was formed by an intramolecular amination? But its already formed.
2246⁹¹ F) Stereochemical Analysis: The molecule has two chiral centers: C:25 and C:27. Both are part of the
2247⁹² piperazine ring. We need to set the stereochemistry. Possible transformations: asymmetric synthesis,
2248⁹³ chiral pool, or resolution.
2249⁹⁴ G) Rearrangement Analysis: No obvious rearrangement motifs.
2250⁹⁵ H) FGI Analysis: Functional groups present:
2251⁹⁶ - Ketone: C:3=O
2252⁹⁷ - Sulfonyl: S:6(=O)-aryl
2253⁹⁸ - Amide: C:12=O attached to N:14 (so its an amide)
2254⁹⁹ - Tertiary amine: N:17 (attached to aryl and two carbons)
2255¹⁰⁰ - Aryl chlorides (c:20-Cl:21 and c:30-Cl:31)
2256¹⁰¹ - Fluorines on C:2
2257¹⁰² **# Chemist: Complete, correct.**
2258¹⁰³ i. Oxidation/Reduction:
2259¹⁰⁴ - The ketone (C:3) could be derived from an alcohol (by oxidation) or from an alkyne (by hydration).
2260¹⁰⁵ - The sulfonyl group could be derived from a sulfide (by oxidation).
2261¹⁰⁶ - The amide (C:12) could be derived from a carboxylic acid or ester.
2262¹⁰⁷ ii. Non-Redox FGIs:
2263¹⁰⁸ - The amide (C:12) could be formed from a carboxylic acid and an amine.
2264¹⁰⁹ - The sulfonyl group: the bond S:6-C:5 could be disconnected if we consider the sulfonyl as a whole, but
2265¹¹⁰ thats not FGI. For FGI, we might consider the sulfonyl group as a whole, but note: the sulfonyl
2266¹¹¹ group is attached to two groups: the aryl and the alkyl. So we can disconnect at the S-C bonds?
2267¹¹² But that would be a disconnection, not FGI. FGI would be, for example, converting the sulfonyl
2268¹¹³ group to a thiol? Not common. Alternatively, we might consider the sulfonyl group as a functional
2269¹¹⁴ group that can be interconverted? Typically, sulfonyl groups are formed by oxidation.
2270¹¹⁵ I) Protecting Group Analysis: The molecule does not have obvious protecting groups. The fluorines and
2271¹¹⁶ chlorines are likely part of the final structure.
2272¹¹⁷ J) Multi-Bond / Multi-Component Analysis:
2273¹¹⁸ - The piperazine ring might be formed by a cyclization? But its already formed. Alternatively, the entire
2274¹¹⁹ molecule might be assembled by a multi-component reaction? Not obvious.
2275¹²⁰ **# Chemist: There are hints that the model is trying to reason forward in the synthesis, not always grasping
2276¹²¹ that it is trying to break down the product in a retrosynthetic analysis**
2277¹²² K) Radical Mechanism Analysis: No obvious radical disconnections.
2278¹²³ L) Novel Strategies: None apparent.
2279¹²⁴ Now, lets list candidate disconnections:
2280¹²⁵ **# Explanation 3: This section consolidates the findings from the 12-principle analysis (A-L). It presents a
2281¹²⁶ final, itemized list of the most promising candidate transformations (both bond disconnections and FGIs)
2282¹²⁷ . Each transformation string listed here will be carried forward for detailed reaction assignment and
2283¹²⁸ evaluation.**

2268
2269¹²¹
2270¹²² 1. Disconnection at the bond between C:2 and C:3 (the ketone carbon). This would disconnect the molecule into
2271¹²³ two parts:
2272 - Part A: the fluorinated alkyl part: C[CH2:1][C:2](F)(F) -> but note: C:2 is attached to two fluorines and
2273 ethyl. So it would be 1,1-difluoro-1-ethyl? Actually, C:2 is attached to CH2:1 (which is ethyl group
2274 : -CH2CH3) and two fluorines. So the fragment would be [CH3-CH2-C(F2)-]? But note: C:2 is a carbon
2275 with two fluorines and two groups: ethyl and the ketone chain. Disconnecting at C2-C3 would leave C:2
2276 with a halogen? So we would have an alkyl halide: Br-C(F2)-CH2CH3? And the other fragment would be
2277 the ketone chain without the attachment to C:2? But wait: after disconnection, the fragment
2278 containing C:3 would have a carbonyl and then CH2-SO2-aryl. So it would be an enolate equivalent?
2279 Actually, we can do a disconnection of the ketone at the bond between C:2 and C:3: this is a
2280 disconnection of a ketone that is substituted by an alkyl group (ethyl) and a functionalized alkyl
2281 chain. The standard disconnection is to an alkyl halide and an enolate. So the transformation would
2282 be alkylation of an enolate.
2283
2284 The disconnection: breaking C:2-C:3. The atoms involved: C:2 and C:3.
2285¹²⁴
2286¹²⁵ 2. Disconnection at the sulfonyl group:
2287¹²⁶ a) Disconnect the S-C:5 bond. This would give two fragments:
2288¹²⁷ - The alkyl part: ...C:3(=O)-CH2:5-X (where X is leaving group? but we are disconnecting, so the alkyl
2289¹²⁸ part would be an electrophile: halide?)
2290¹²⁹ - The aryl sulfonyl part: [S:6](=O)(=O)[c:8]... (so an aryl sulfonyl anion? or aryl sulfonyl chloride?
2291¹³⁰ Actually, in retrosynthesis, we disconnect to aryl sulfonyl chloride and the alkyl halide. The
2292 forward reaction is a nucleophilic substitution: ArSO2- + R-X -> ArSO2R. But note: the alkyl
2293 group is activated? Its a methylene group adjacent to a ketone? So it might be acidic? We can
2294 form the carbanion and then do a nucleophilic substitution? Alternatively, we can use the alkyl
2295 halide and aryl sulfinate? But the standard way is to form the sulfone from a sulfide and then
2296 oxidize? Or directly by coupling?
2297¹³¹ The disconnection: breaking S:6-C:5. Atoms: S:6 and C:5.
2298¹³²
2299¹³³ b) Alternatively, we can disconnect the sulfonyl group by considering it was formed by oxidation of a
2300¹³⁴ sulfide. So we can do a functional group interconversion: sulfonyl to sulfide. Then disconnect the
2301 sulfide: the bond S:6-C:5 and S:6-c:8? That would be two disconnections. But note: FGI is not a
2302 disconnection per se. We are asked for disconnection points. So we might consider the oxidation as a
2303 transformation? But the disconnection would be the same as above? Or we can do a disconnection at the
2304 sulfide level?
2305¹³⁵ Actually, if we do FGI: sulfonyl to sulfide, then we have the sulfide: C:5-S:6-c:8. Then we can disconnect
2306¹³⁶ the sulfide bond: for example, S:6-C:5: then we get aryl thiol and alkyl halide? So the disconnection
2307 would be at S:6-C:5 for the sulfide, and then we have to do an oxidation to sulfonyl. But the
2308 disconnection point is still S:6-C:5.
2309¹³⁷ 3. Disconnection at the amide bond: C:12-N:14. This would give a carboxylic acid (from C:12) and the amine (from N:14). The amine is part of the piperazine ring. The transformation is amide formation.
2310¹³⁸ Disconnection: breaking C:12-N:14. Atoms: C:12 and N:14.
2311¹³⁹ 4. Disconnection at the bond between the piperazine ring and the aryl group attached to N:17. The bond is N:17-c:18. This is an N-aryl bond. Disconnection would give an amine (the piperazine) and an aryl halide? So the transformation is N-arylation.
2312¹⁴⁰ Disconnection: breaking N:17-c:18. Atoms: N:17 and c:18 (specifically, the carbon of the aryl ring that is attached? We can use the atom mapping: c:18 is the carbon attached to N:17? So atoms: N:17 and c:18.
2313¹⁴¹ 5. Disconnection at the ketone in the chain: C:3=O. We can disconnect the ketone by converting it to an alkyne? Or by other methods? But note: the ketone is between two alkyl groups: one is the fluorinated alkyl (from C:2) and the other is the methylene (C:5). So we can disconnect the ketone to the alkyl halide (from the fluorinated side) and the carboxylic acid (from the methylene side) via a Friedel-Crafts acylation? But note: the methylene side is not aromatic. Alternatively, we can do a disconnection at the ketone by converting it to an ester and then do a Grignard? But that would be two steps. We already considered disconnection at C2-C3.
2314¹⁴² Alternatively, we can disconnect the ketone by a Grignard reaction: the bond between C:3 and the group attached to it? But note: C:3 is attached to C:2 (from one side) and to C:5 (from the other). So we can disconnect at C:3-C:5? Then we would have an acyl group (attached to C:2) and a methyl group? But that doesn't match. The standard ketone disconnection is at the bond between the carbonyl carbon and one of the adjacent carbons? We already disconnected at C2-C3. The other bond is C3-C5. Disconnecting at C3-C5 would give two fragments:
2315¹⁴³ - Fragment A: ...C:2-C:3=O (so an aldehyde? Actually, if we disconnect C3-C5, then C:3 becomes an aldehyde: O=CH-C:2? But note: C:2 is attached to two fluorines and ethyl, so it would be an aldehyde: O=CH-CF2-CH2CH3?
2316¹⁴⁴ - Fragment B: CH2:5-SO2-aryl.
2317¹⁴⁵ Then the forward reaction would be a nucleophilic addition of the fragment B carbanion to the aldehyde? But that would give an alcohol, not a ketone. So we need to oxidize? Alternatively, we can do a Wittig? But that would give an alkene, then we need to hydrogenate?
2318¹⁴⁶ So the direct disconnection at C3-C5 is not straightforward. Therefore, we stick to the disconnection at C2-C3.
2319¹⁴⁷ 6. Disconnection at the ethyl group: the bond between C:1 and C:2? But note: the ethyl group is attached to C:2. Disconnecting at C:1-C:2 would give two fragments:
2320¹⁴⁸ - Fragment A: CH3-CH2:1 (so ethane? but we need a synthon: ethyl anion or ethyl cation)
2321¹⁴⁹ - Fragment B: the rest of the molecule attached to C:2 (which is CF2- with the ketone chain).
2322¹⁵⁰ But note: C:2 is tertiary and has two fluorines. So we can have an alkyl halide: F2C(ketone chain)-Br? and then react with ethyl magnesium bromide? That would be a Grignard reaction.
2323¹⁵¹ # Chemist: This is chemically not correct. Every 1st year student should know the grignard will react with the ketone, not the bromide.
2324¹⁵²
2325¹⁵³
2326¹⁵⁴
2327¹⁵⁵
2328¹⁵⁶
2329¹⁵⁷
2330¹⁵⁸
2331¹⁵⁹
2332¹⁶⁰
2333¹⁶¹
2334¹⁶²
2335¹⁶³

Disconnection: breaking C:1-C:2. Atoms: C:1 and C:2.

7. Stereochemical disconnections: We have two chiral centers at C:25 and C:27. We can consider transformations that set the stereochemistry. For example, asymmetric hydrogenation of a double bond? Or using a chiral auxiliary? But note: the ring is already formed. So we might consider that the ring was formed by a stereoselective reaction? Or we can use a chiral pool starting material?

However, we dont have a direct disconnection at the chiral centers. We can consider the ring formation: the bond between N:14 and C:27? or between N:17 and C:25? But that would break the ring. Alternatively, we can form the ring by an intramolecular reaction? For example, the bond between N:17 and C:25? But note: the ring is already formed.

Actually, the ring closure could be done by an intramolecular nucleophilic substitution? For example, if we have a diamine with halide at C:25? Then the amine N:17 attacks C:25? But note: the ring is six-membered. Alternatively, we can form the ring by reductive amination?

But note: the ring is already formed in the product. So we can disconnect the ring at one of the bonds? For example, break the bond between C:15 and C:16? Then we would have a diamine and a dihalide? But that is not convergent. Alternatively, break the bond between N:14 and C:15? Then we have an amine and a halide?

However, we are not required to break the ring if it is readily available. But we can consider disconnections at the ring bonds.

Lets break the ring at the bond between N:14 and C:27? Actually, the ring is: N:14 - C:15 - C:16 - N:17 - C:25 - C:27 - N:14. So breaking the bond between N:14 and C:27 would give an open chain: HO-C:27 - C:25 - N:17 - C:16 - C:15 - N:14?

But note: the bond we break is N:14-C:27? Then the fragment would be:
 Fragment A: ...C:12(=O)-N:14 (so the amide) and then the open chain: N:14-H and C:27-OH?
 Fragment B: the rest of the ring?

This doesnt seem straightforward. Alternatively, we can break the bond between C:25 and C:27? Then we get two fragments:
 Fragment A: ...N:17 - C:25 (which would be an amine? because N:17 is attached to C:25? Actually, if we break C:25-C:27, then C:25 becomes a carbonyl? and C:27 becomes a carbonyl? Not necessarily.

Alternatively, we can break the bond between N:17 and C:25? Then we get:
 Fragment A: ...N:17 (which is now NH) and Fragment B: C:25 - C:27 (which would be a carbonyl compound ?).

Then the forward reaction would be reductive amination? Because N:17 is secondary amine? Actually, N:17 is tertiary in the product? Because it is attached to the aryl group? So its tertiary. Therefore, we cannot break that bond without breaking the aryl bond?

Given the complexity, we might leave the ring intact and use a commercially available chiral piperazine?

Chemist: It took a little while, but this is a wise choice

So we wont disconnect the ring for now.

8. Functional group interconversion:
 - The ketone (C:3) could be reduced to an alcohol? But that would be a step backward.
 - The sulfonyl group could be reduced to sulfide? But again, backward.
 - The amide (C:12) could be hydrolyzed to carboxylic acid? Then we would have to form the amide again?

Instead, we can consider FGI for the synthesis of the sulfonyl group: we can have a sulfide and then oxidize. So we add a transformation: oxidation of sulfide to sulfonyl. The disconnection would be the same as the sulfide disconnection?

But note: for the sulfonyl disconnection, we can do:
 Step 1: FGI: sulfonyl to sulfide -> then the sulfide is disconnected to aryl thiol and alkyl halide? Then the alkyl halide fragment is ...C:3(=O)-CH2:5-Br?

So the disconnection for the sulfide would be at S:6-C:5? Then we have two fragments:
 Fragment A: the aryl thiol (with the aryl ring c:8 and substituents)
 Fragment B: the alkyl halide: Br-CH2-C(=O)-C:2(F)(F)CH2CH3?

Then the forward reaction is nucleophilic substitution: thiolate + alkyl halide -> sulfide. Then oxidation to sulfonyl.

So we can have two transformations:
 a) Nucleophilic substitution: disconnection at S:6-C:5 (for the sulfide)
 b) Oxidation: disconnection of the S=O bonds? But thats not a disconnection of a bond? We dont disconnect bonds for oxidation. We just note that we need to oxidize.

However, the problem asks for disconnection points. For the oxidation, we dont break a bond? We change the functional group. So the disconnection for the oxidation step would be the same atoms? Or we dont list it as a disconnection?

Chemist: From here on, it spends some time thinking about how it should interpret the assignment and what a correct answer should look like

The instructions say: for FGI, we list the atoms involved in the transformation. For example, for oxidation of sulfide to sulfonyl, we might list the sulfur atom? But the example says for FGI: '"N:1,O:2,O:3"' for replacing an amine with a nitro group. So for oxidation of sulfide, we would list the sulfur atom? But note: the oxidation doesnt break any bonds? It adds oxygen.

Alternatively, we can consider the oxidation as a transformation that doesnt break bonds? So we dont disconnect? But the instructions for FGI say: "identify_all_possible_functional_groups_that_are_candidates_for_standard_Functional_Group_Interconversions". And then in the disconnection string, for FGI we list the atoms that change.

Example: for reducing a double bond to single bond: `"C:8_C:9"`. So for oxidation of sulfide to sulfonyl, we would list the sulfur atom? Because the sulfur changes from S to S(=O)₂? So the disconnection string would be `"S:6"`?

Similarly, for reducing the ketone to alcohol? Then we would list C:3? But note: the ketone carbon is C:3. So `"C:3"`?

But note: the instructions also say: `"for transformations that require adding a new group to the molecule, (such as a retrosynthetic protection), you must list the attachment points"`. Oxidation adds oxygen atoms? So we list the sulfur?

However, in the example for protection: `"N:26"` for adding a protecting group to nitrogen. So for oxidation, we list the atom that is oxidized?

Therefore, we can have:
 FGI: oxidation of sulfide to sulfonyl: disconnection string `"S:6"`
 FGI: reduction of ketone to alcohol: `"C:3"`

But note: these are not disconnections? They are functional group interconversions that don't break bonds? So they are not disconnections?

However, the instructions in Step 1 (H) say: `"For each functional group in the molecule, systematically identify all possible functional groups that are candidates for standard Functional Group Interconversions"`. And then we output a transformation string.

So we must include these FGI transformations?

But note: the primary goal is disconnection points? And the transformation string for FGI might be a single atom?

So we will include:
 Transformation for FGI (oxidation): `"S:6"`
 Transformation for FGI (reduction): `"C:3"` (if we reduce the ketone, then we have to form the ketone later? So it's an option)

However, reducing the ketone might not be strategic because then we lose the activation for the methylene group?

We might also consider FGI for the amide: we can hydrolyze the amide to carboxylic acid? Then disconnection at the amide bond would be the carboxylic acid and amine? But then we have to form the amide again? So the disconnection at the amide bond is already considered (point 3).

Alternatively, we can have FGI: convert the amide to nitrile? Then disconnect? But that is less common.

So for FGI, we have:
 - Oxidation of sulfide: `"S:6"`
 - Reduction of ketone: `"C:3"`
 - Oxidation of alcohol to ketone? But we don't have an alcohol?
 - Reduction of amide? Then we get an amine? But the amide is tertiary? Actually, the amide is secondary: C:12(=O)-N:14 (and N:14 is attached to two carbons: the ring). So it's a tertiary amide? Actually, N:14 is attached to C:12 (carbonyl) and two carbons (C:15 and C:27). So it's a tertiary amide? But tertiary amides are harder to reduce?

So we'll stick to the ones above.

9. Protection: The molecule does not have obvious protecting groups? But we might need to protect the amine during synthesis? However, in the product there is no protection. So we don't have a deprotection step?

But note: the amide nitrogen (N:14) is part of the ring? So it's not free. The other amine (N:17) is tertiary? So no protection needed?

However, during the synthesis of the piperazine ring, we might need to protect amines? But that is not in the product.

So we skip.

Now, we have the following candidate disconnections (with transformation strings):

1. Disconnection at C:2-C:3: `"C:2_C:3"`
2. Disconnection at S:6-C:5: `"S:6_C:5"`
3. Disconnection at C:12-N:14: `"C:12_N:14"`
4. Disconnection at N:17-C:18: `"N:17_C:18"`
5. Disconnection at C:1-C:2: `"C:1_C:2"`
6. FGI: oxidation of sulfide: `"S:6"`
7. FGI: reduction of ketone: `"C:3"`

But note: the FGI transformations are not disconnections? But we are asked to list all transformations? And the output of Step 1 is a list of transformation strings.

Also, note: the disconnection for the sulfide formation (point 2) is `"S:6_C:5"`. Then the oxidation FGI is `"S:6"`.

Additionally, we might have missed:

8. Disconnection at the bond between C:5 and C:3? But we discussed that it is not straightforward? So we skip.
9. Disconnection at the bond between the aryl ring (c:8) and the sulfonyl group? That is, break the bond S:6-c:8? Then we would have an alkyl sulfonyl chloride and an aryl compound? But the aryl compound would need to have a nucleophile? Not common. Typically, sulfonyl chlorides react with nucleophiles? So breaking S:6-c:8 would be disconnecting the aryl group? Then the forward reaction would be sulfonylation of the

aryl ring? But sulfonylation of aryl rings is done by Friedel-Crafts? But that would require the aryl ring to be activated? And we have chlorines? Deactivating. So not favorable.

Therefore, we dont consider.

Now, we proceed to Step 2: Assign Candidate Reactions for each transformation.

Explanation 4: This section translates the abstract disconnection strings into practical, nameable synthetic operations. For each transformation, one or more specific forward reactions are assigned (e.g., Acylation... for the C:12-N:14 amide bond). Each reaction is then cross-referenced with the provided ontology to determine its status as a standard, cataloged transformation (isInOntology).

For each transformation string, assign forward reactions:

1. `"C:2_C:3"`: This disconnection corresponds to breaking the bond between C:2 and C:3. In the forward direction, this bond is formed by:
 - Alkylation of an enolate: the enolate from the fragment containing C:3 (which is the ketone chain: -CH2-SO2-aryl) and an alkyl halide from the fluorinated fragment (Br-C(F2)-CH2CH3).
 - Possible reactions:
 - Enolate alkylation: this is a standard reaction. But note: the fluorinated alkyl halide might be electrophilic?
 - The reaction might be called `"Alkylation_of_enolates"` or `"C-alkylation"`.
 - Check ontology:
 - `"C-methylation"` -> but we are alkylating with ethyl?
 - `"Alkylation_of_amines"` -> no, its carbon.
 - `"Friedel-Crafts_alkylation"` -> no, not aromatic.
 - `"Reaction_of_alkyl_halides_with_organometallic_compounds"` -> that would be Grignard? But Grignard on what?
 - Actually, the standard name is `"Alkylation_of_carbonyl_compounds"` or `"alpha-alkylation"`.
 - In the ontology, we have `"C-methylation"`, but that is specific to methyl. We have `"Alkylation"` but not listed?
 - `"N-alkylation_of_primary_amines_with_alkyl_halides"` -> no.
 - `"S-alkylation_of_thiols"` -> no.
 - `"Friedel-Crafts_alkylation"` -> no.
 - `"Wittig"` -> no.
 - `"Michael_addition"` -> no, unless its a Michael acceptor?
 - `"Alkylation"` is not explicitly listed?
 - We see `"C-methylation"`, which is for methyl. We are alkylating with ethyl? So we might use `"OtherReaction": "Enolate_alkylation"`.

Alternatively, we can use the Grignard reaction? But note: if we disconnect to an acyl compound and a Grignard? That would be disconnecting at C:3-C:5? We are disconnecting at C:2-C:3.

So for `"C:2_C:3"`, we assign:
forwardReaction: `"OtherReaction:_Enolate_alkylation"`

But note: the ontology has `"Alkylation_of_Carbon_Nucleophiles_by_Alkyl_Halides"`? Not in the list?

Since we dont find a direct match, we use `"OtherReaction:_Enolate_alkylation"`.

- 2. `"S:6_C:5"`: Disconnection of the bond between S:6 and C:5. In the forward direction, this bond can be formed by:
 - Nucleophilic substitution: the thiolate anion (from the aryl thiol) and the alkyl halide (from the fragment: X-CH2-C(=O)-...).
 - Reactions:
 - `"S-alkylation_of_thiols"` -> yes, in the ontology: `"S-alkylation_of_thiols"`, `"S-alkylation_of_thiols_(ethyl)"`, `"S-alkylation_of_thiols_with_alcohols"` (but we are using alkyl halide?).
 - Specifically, `"S-alkylation_of_thiols"` seems appropriate.

So assign: forwardReaction: `"S-alkylation_of_thiols"`

Also, note: the alkyl halide might be activated by the adjacent ketone? So it should be reactive.

- 3. `"C:12_N:14"`: Disconnection of the amide bond. Forward reactions:
 - Amide formation from carboxylic acid and amine:
 - `"Carboxylic_acid_with_primary_amine_to_amide"` -> but note: the amine (N:14) is secondary? Because it is part of a piperazine ring? Actually, in the ring, N:14 is attached to two carbons? So its a secondary amine? But the amide is formed from a secondary amine? Then it would be a tertiary amide? Yes, because the nitrogen of the amide is tertiary?
 - The ontology has: `"Carboxylic_acid_with_primary_amine_to_amide"` -> primary amine gives secondary amide?
 - `"Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_N"` -> this might be for acyl halides?
 - `"Acylation_of_Nitrogen_Nucleophiles_by_Carboxylic_Acids"` -> but that might require activation?
 - We have: `"Carboxylic_acid_to_amide_conversion"` -> general?
 - `"Aminolysis_of_esters"` -> using an ester and amine?
 - `"Schotten-Baumann_to_ester"` -> no, thats for ester?
 - The standard ways:
 - a) Acyl chloride + amine
 - b) Carboxylic acid + amine with coupling agent
 - c) Ester + amine
 - In the ontology:
 - `"Acyl_chloride_with_ammonia_to_amide"` -> ammonia, but we have amine?
 - `"Carboxylic_acid_with_primary_amine_to_amide"` -> but we have secondary amine?
 - `"Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_N"` -> this might be for secondary amines?
 - `"Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_OS"` -> ?

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- Also, "Amide_from_carboxylic_acid_and_amine_using_DCC" -> not in ontology?

- We see: "Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_N" ->
  this is for acyl halides?

# Chemist: These parts clearly show the importance the ontology has in the succesfull outcome of
# assignments. The model really tries to understand the partially overlapping reaction names from
# rxn-insight

- Since the amide is tertiary, we can use:
  - "Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_N" -> but the
    name is long?

- Alternatively, "OtherReaction:_Amide_coupling"

However, the ontology has: "Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_
Analogs_N" -> well use this for acyl chloride.

Also, we can use ester aminolysis: "Aminolysis_of_esters"

So assign two reactions:
  a) "Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_N"
  b) "Aminolysis_of_esters"

4. "N:17_C:18": Disconnection of the N-aryl bond. Forward reactions:
  - N-arylation of the amine (piperazine) with an aryl halide?
  - Reactions:
    - "Buchwald-Hartwig/Ullmann-Goldberg/N-arylation_secondary_amine" -> because the amine (N:17) is
      tertiary? Wait, in the product, N:17 is attached to the aryl group and to two carbons? So its a
      tertiary amine? But the arylation of a tertiary amine?

    - Actually, the amine in the forward reaction would be secondary? Because we disconnect the aryl group
      ? So the amine fragment would be: the piperazine with N:17 being secondary (attached to two
      carbons: C:16 and C:25, and H).

    - So its a secondary amine?

    - Then we have:
      - "Buchwald-Hartwig/Ullmann-Goldberg/N-arylation_secondary_amine"

    - Also, "Ullmann-Goldberg_Substitution_amine"

  So assign: "Buchwald-Hartwig/Ullmann-Goldberg/N-arylation_secondary_amine"

  Also, "Ullmann-Goldberg_Substitution_amine" -> but the ontology has both?

  Well assign both.

5. "C:1_C:2": Disconnection of the bond between C:1 and C:2. Forward reaction:
  - Grignard reaction: the fragment attached to C:2 (without the ethyl) would be a ketone? But note: C:2 is
    attached to two fluorines and the ketone chain? So if we disconnect C:1-C:2, then the fragment
    containing C:2 would be: F2C- (with the ketone chain) -> so it would be a carbonyl? No, because C:2
    is alkyl carbon?

  - Actually, we disconnect to:
    - Fragment A: ethyl magnesium bromide (CH3CH2MgBr)
    - Fragment B: a carbonyl compound: O= C(F)2- (with the ketone chain) -> but that carbonyl would be an
      aldehyde: O=CH-? But note: C:2 is carbon, so if we remove the ethyl group, we have a carbonyl?
      That would be a ketone: the ketone chain is attached to C:2? So we have a ketone: F2C-C(=O)-R?
      But that is not the case.

  - Alternatively, we can have an alkyl halide: Br-C(F)2- (with the ketone chain) and then react with ethyl
    magnesium bromide? That would be a Grignard on an alkyl halide? But Grignard reagents are
    nucleophiles, not electrophiles?

  - So the correct disconnection: the bond C:1-C:2 is formed by the reaction of an ethyl nucleophile (ethyl
    anion equivalent) with an electrophile at C:2. The electrophile at C:2 would be a carbonyl? But C:2
    is not a carbonyl.

  - Alternatively, we can have a radical coupling? Or we can have an alkyl halide at C:2 and then do a
    coupling with an ethyl metal?

  - The standard way: the group attached to C:2 is a fluorinated alkyl group? We can have a fluorinated alkyl
    halide: Br-CF2-CH2-C(=O)-... and then do a Grignard with ethyl magnesium bromide? But that would be
    a nucleophilic substitution? But CF2 is not a good electrophile?

  - Alternatively, we can do a transition-metal coupling?

  - Given the challenges, this disconnection might not be robust.

# Chemist: Correct. Unfortunate that the model still proceeds

- However, we can consider the reaction:
  "Reaction_of_alkyl_halides_with_organometallic_compounds" -> in the ontology: "Reaction_of_alkyl_
  halides_with_organometallic_compounds"

- This reaction is for forming C-C bonds?

- So assign: "Reaction_of_alkyl_halides_with_organometallic_compounds"

- But note: the alkyl halide would be the fluorinated alkyl halide? and the organometallic would be ethyl
  magnesium bromide?

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2568⁴⁵⁹
2569⁴⁶⁰
2570⁴⁶¹
2571⁴⁶²
2572⁴⁶³
2573⁴⁶⁴
2574⁴⁶⁵
2575⁴⁶⁶
2576⁴⁶⁷
2577⁴⁶⁸
2578⁴⁶⁹
2579⁴⁷⁰
2580⁴⁷¹
2581⁴⁷²
2582⁴⁷³
2583⁴⁷⁴
2584⁴⁷⁵
2585⁴⁷⁶
2586⁴⁷⁷
2587⁴⁷⁸
2588⁴⁷⁹
2589⁴⁸⁰
2590⁴⁸¹
2591⁴⁸²

```

- Also, we have "Negishi_coupling", "Kumada_cross-coupling", etc.? But those are for sp2 carbon?

- So well use: "Reaction_of_alkyl_halides_with_organometallic_compounds"

6. "S:6": FGI: oxidation of sulfide to sulfonyl. Forward reaction:
- Oxidation of sulfide to sulfone.
- Reactions in ontology:
  - "Sulfanyl_to_sulfinyl" -> but that is to sulfoxide?
  - "Sulfanyl_to_sulfinyl_H2O", "Sulfanyl_to_sulfinyl_H2O2", etc. -> sulfoxide.
  - "Sulfanyl_to_sulfinyl_sulfonyl" -> no, that is sulfoxide to sulfonyl?
  - We need sulfide to sulfonyl?

  - "Oxidation_of_boronic_acids" -> no.
  - "Oxidation_of_alcohols" -> no.

- We see: "Sulfanyl_to_sulfonyl" is not listed?

- The standard reaction is oxidation with mCPBA or hydrogen peroxide?

# Chemist: Correct!

- So we use: "OtherReaction:_Sulfide_to_sulfone_oxidation"

- Alternatively, the ontology has: "Sulfanyl_to_sulfinyl" and then "Sulfinyl_to_sulfonyl"? But that would
  be two steps?

- We are only asked for the transformation? So well use "OtherReaction:_Sulfide_to_sulfone_oxidation"

7. "C:3": FGI: reduction of ketone to alcohol. Forward reaction:
- Reduction of ketone to secondary alcohol.
- Reactions:
  - "Reduction_of_aldehydes_and_ketones_to_alcohols" -> yes, in ontology.

So assign: "Reduction_of_aldehydes_and_ketones_to_alcohols"

But note: we might not want to reduce the ketone because it activates the adjacent methylene? So this might
not be strategic? But we include.

Now, we have:

Transformation	Reactions
"C:2_C:3"	["OtherReaction:_Enolate_alkylation"]
"S:6_C:5"	["S-alkylation_of_thiols"]
"C:12_N:14"	["Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_N", "
Aminolysis_of_esters"]	
"N:17_C:18"	["Buchwald-Hartwig/Ullmann-Goldberg/N-arylation_secondary_amine", "Ullmann-Goldberg_
Substitution_amine"]	
"C:1_C:2"	["Reaction_of_alkyl_halides_with_organometallic_compounds"]
"S:6"	["OtherReaction:_Sulfide_to_sulfone_oxidation"]
"C:3"	["Reduction_of_aldehydes_and_ketones_to_alcohols"]

Step 3: Expand and Evaluate Pairs

# Explanation 5: This step involves the detailed chemical evaluation of each transformation-reaction pair.
Each pair is assigned a Retrosynthesis Importance score (1-4) and a supporting rationale. This rationale
justifies the score by assessing the strategic value (e.g., FGI, Inter-Fragment Analysis), chemical
robustness, and potential challenges (like chemoselectivity or protecting group requirements) of the
proposed forward reaction.

We expand each transformation-reaction pair and assign Retrosynthesis Importance and rationale.

Well go one by one:

1. Transformation: "C:2_C:3"
Reaction: "OtherReaction:_Enolate_alkylation"
Importance:
- This disconnection separates the molecule into two large fragments: the fluorinated alkyl halide and
  the ketone-sulfonyl-aryl fragment.
- It is a convergent disconnection (goal b: convergent synthesis).
- The forward reaction is robust (enolate alkylation) (goal b).
- It avoids the use of protecting groups?
- However, the fluorinated alkyl halide might be difficult to handle?
- Importance: 3 (High) because it attaches a key substituent (the fluorinated alkyl) to the activated
  methylene.

# Chemist: Yes, weve tried something similar and the halide is very gaseous at room temperatures!

Rationale: "Convergent_disconnection_(Fragment_Partitioning)_that_separates_the_fluorinated_alkyl_chain_
from_the_activated_ketone_fragment._The_enolate_alkylation_is_a_robust_reaction._The_fluorinated_
alkyl_halide_may_be_reactive_but_requires_careful_handling._Chemoselectivity:_the_enolate_might_also_
attack_other_electrophiles._The_ketone_might_need_protection?_But_note:_the_ketone_is_present_in_the_
product._This_disconnection_sets_the_quaternary_carbon_center."

But note: C:2 is not quaternary? It is attached to two fluorines, ethyl, and the ketone chain? So it is a
tertiary carbon? But fluorines are substituents? So it is a carbon with four substituents? Yes, it is
quaternary: carbon with four carbon/fluorine atoms? So its a quaternary carbon.

Importance: 4 (Very High) because it forms a quaternary carbon? But note: the ranking rationale: Importance
4 for major ring-forming or disconnections that reveal symmetry? This doesnt reveal symmetry. But it

```

is a convergent disconnection of major fragments? And forms a quaternary carbon? So we can argue for 4?

Alternatively, Importance 3: attachment of a key substituent.

Well assign Importance 3.

Rationale: "Convergent_disconnection_(Fragment_Partitioning)_that_separates_the_molecule_into_two_major_fragments:_a_fluorinated_alkyl_halide_and_an_enolate_precursor._Forms_a_quaternary_carbon_center._The_reaction_is_robust_but_requires_the_enolate_to_be_chemoselective._The_fluorinated_alkyl_halide_may_be_electrophilic_and_reactive._No_protecting_groups_needed."

2. Transformation: "S:6_C:5"
Reaction: "S-alkylation_of_thiols"
Importance: 2 (Medium) because it is a standard C-S bond formation.
Rationale: "Disconnection_at_the_sulfonyl_group_precursor_(FGI_Analysis)._This_disconnection_requires_prior_FGI_to_sulfide._The_S-alkylation_is_a_reliable_reaction._The_alkyl_halide_is_activated_by_the_adjacent_ketone,_ensuring_good_reactivity._Chemoselectivity:_the_thiolate_might_react_with_other_electrophiles._The_ketone_might_need_protection?_But_note:_the_ketone_is_present_in_the_product._This_disconnection_is_part_of_a_two-step_sequence_(alkylation_then_oxidation)."

Chemist: Multi-step reasoning!

3. Transformation: "C:12_N:14"
Reactions:
a) "Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_N"
Importance: 2 (Medium) because it is a standard amide formation.
Rationale: "Amide_bond_disconnection_(FGI_Analysis)._This_disconnection_separates_the_piperazine_fragment_from_the_carboxylic_acid_derivative._The_acylation_with_acyl_chloride_is_reliable._The_piperazine_amine_might_be_nucleophilic_enough._Chemoselectivity:_the_acyl_chloride_might_react_with_other_nucleophiles?_The_reaction_might_require_base_to_scavenge_acid._No_protecting_groups_needed_for_the_amine?_But_note:_the_amine_is_secondary_and_might_be_protected?_Not_in_the_product."
b) "Aminolysis_of_esters"
Importance: 2 (Medium)
Rationale: "Amide_bond_disconnection_(FGI_Analysis)._This_disconnection_uses_an_ester_and_amine._The_reaction_is_reliable_but_might_require_heating._Chemoselectivity:_the_ester_might_be_hydrolyzed?_The_amine_might_be_alkylated?_Not_likely._No_protecting_groups_needed."

4. Transformation: "N:17_C:18"
Reactions:
a) "Buchwald-Hartwig/Ullmann-Goldberg/N-arylation_secondary_amine"
Importance: 3 (High) because it forms a C-N bond that connects two complex fragments convergently.
Rationale: "Convergent_disconnection_(Inter-Fragment_Analysis)_of_the_N-aryl_bond._This_disconnection_separates_the_piperazine_fragment_from_the_aryl_chloride._The_Buchwald-Hartwig_reaction_is_robust_for_aryl_amination._The_aryl_chloride_is_activated_by_the_ortho_chlorine?_Not_necessarily,_but_the_reaction_can_be_catalyzed._Chemoselectivity:_the_catalyst_might_be_sensitive_to_other_functional_groups?_The_piperazine_has_other_nitrogen?_But_N:14_is_amidic?_Less_nucleophilic._Protecting_groups_not_needed."
b) "Ullmann-Goldberg_Substitution_amine"
Importance: 3 (High) for the same reason.
Rationale: "Convergent_disconnection_(Inter-Fragment_Analysis)_of_the_N-aryl_bond._Ullmann-Goldberg_reaction_is_a_classical_method_for_aryl_amination._It_might_require_high_temperatures._Chemoselectivity:_similar_to_Buchwald-Hartwig."

5. Transformation: "C:1_C:2"
Reaction: "Reaction_of_alkyl_halides_with_organometallic_compounds"
Importance: 2 (Medium) because it forms a C-C bond, but the fragment is small (ethyl).
Rationale: "Disconnection_of_the_ethyl_group_(Strategic_Bond_Analysis)._This_disconnection_uses_an_organometallic_reagent_(ethyl)_and_an_alkyl_halide_(the_fluorinated_fragment)._The_reaction_might_be_challenging_because_the_fluorinated_alkyl_halide_is_a_primary_alkyl_halide_but_with_electron-withdrawing_groups?_It_might_undergo_elimination._The_organometallic_reagent_is_highly_reactive._Chemoselectivity:_the_ketone_in_the_fluorinated_fragment_must_be_protected?_Otherwise,_it_will_react_with_the_Grignard._Therefore,_protecting_group_for_the_ketone_is_required._This_adds_a_step."

6. Transformation: "S:6"
Reaction: "OtherReaction:_Sulfide_to_sulfone_oxidation"
Importance: 1 (Lower) because it is a functional group interconversion that doesn't simplify the molecule much? But it is necessary if we choose the sulfide disconnection.
Rationale: "Functional_group_interconversion_(FGI_Analysis)_from_sulfide_to_sulfonyl._This_oxidation_is_reliable_and_high-yielding._Common_oxidants_like_mCPBA_or_hydrogen_peroxide_can_be_used._No_chemoselectivity_issues?_The_sulfide_is_the_only_oxidizable_group?_The_ketone_might_be_epoxidized?_Not_likely._No_protecting_groups_needed."

7. Transformation: "C:3"
Reaction: "Reduction_of_aldehydes_and_ketones_to_alcohols"
Importance: 1 (Lower) because it is a functional group interconversion that doesn't simplify the molecule? And it deactivates the methylene group.
Rationale: "Functional_group_interconversion_(FGI_Analysis)_reducing_the_ketone_to_alcohol._This_disconnection_is_not_strategic_because_it_deactivates_the_adjacent_methylene,_which_is_needed_for_further_functionalization._Therefore,_it_is_of_lower_importance._If_used,_the_alcohol_would_need_to_be_oxidized_back_to_ketone_later?_That_adds_steps._Chemoselectivity:_the_reduction_might_affect_other_carbonyls?_Not_in_this_fragment._Protecting_groups_not_needed_for_this_step."

Step 4: Final Formatting and Priority Assignment

Explanation 6: This final step aggregates all the evaluated transformation-reaction pairs into the required JSON structure. It assigns a global Priority number to each individual reaction by sorting the entire list based on two criteria: 1. isInOntology (true before false), and 2. Retrosynthesis Importance (descending). This final ranking determines the most to least favorable synthetic operations.

2646
2647⁵⁵⁶ We create the disconnection objects. Each disconnection has a list of reactions.
2648⁵⁵⁷
2649⁵⁵⁸ We then assign Priority: first by 'isInOntology' (true before false), then by Importance (descending).
2650⁵⁵⁹
2651⁵⁶⁰ Well list all disconnections and their reactions.
2652⁵⁶¹
2653⁵⁶² But note: the transformation "S:6" and "C:3" are FGI and not bond disconnections? But we include them.
2654⁵⁶³
2655⁵⁶⁴ Now, we check if the reaction name is in the ontology (isInOntology: true or false).
2656⁵⁶⁵
2657⁵⁶⁶ Reactions in the ontology (from the list provided) are:
2658⁵⁶⁷
2659⁵⁶⁸ - "S-alkylation_of_thiols" -> yes
2660⁵⁶⁹ - "Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_N" -> yes (exact match)
2661⁵⁷⁰ - "Aminolysis_of_esters" -> yes
2662⁵⁷¹ - "Buchwald-Hartwig/Ullmann-Goldberg/N-arylation_secondary_amine" -> yes
2663⁵⁷² - "Ullmann-Goldberg_Substitution_amine" -> yes (exact match? We have "Ullmann-Goldberg_Substitution_amine")
2664⁵⁷³ - "Reaction_of_alkyl_halides_with_organometallic_compounds" -> yes (exact match)
2665⁵⁷⁴ - "Reduction_of_aldehydes_and_ketones_to_alcohols" -> yes
2666⁵⁷⁵
2667⁵⁷⁶ The "OtherReaction" ones are not in the ontology.
2668⁵⁷⁷
2669⁵⁷⁸ Now, for each reaction, assign the forwardReactionClass:
2670⁵⁷⁹
2671⁵⁸⁰ We have the classes:
2672⁵⁸¹ Reduction, Acylation, Heteroatom Alkylation and Arylation, Functional Group Addition, Protection, C-C
2673⁵⁸² Coupling, Deprotection, Functional Group Interconversion, Aromatic Heterocycle Formation, Oxidation
2674⁵⁸³
2675⁵⁸⁴ Assign:
2676⁵⁸⁵
2677⁵⁸⁶ 1. "OtherReaction:_Enolate_alkylation": class C-C Coupling
2678⁵⁸⁷ 2. "S-alkylation_of_thiols": class Heteroatom Alkylation and Arylation
2679⁵⁸⁸ 3. "Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_N": class Acylation
2680⁵⁸⁹ 4. "Aminolysis_of_esters": class Acylation (because it forms an amide)
2681⁵⁹⁰ 5. "Buchwald-Hartwig/Ullmann-Goldberg/N-arylation_secondary_amine": class Heteroatom Alkylation and Arylation
2682⁵⁹¹ 6. "Ullmann-Goldberg_Substitution_amine": class Heteroatom Alkylation and Arylation
2683⁵⁹² 7. "Reaction_of_alkyl_halides_with_organometallic_compounds": class C-C Coupling
2684⁵⁹³ 8. "OtherReaction:_Sulfide_to_sulfone_oxidation": class Oxidation
2685⁵⁹⁴ 9. "Reduction_of_aldehydes_and_ketones_to_alcohols": class Reduction
2686⁵⁹⁵
2687⁵⁹⁶ Now, we build the JSON.
2688⁵⁹⁷
2689⁵⁹⁸ We have 7 transformation strings, but some have multiple reactions.
2690⁵⁹⁹
2691⁶⁰⁰ Well list them in the order we found, then assign priority.
2692⁶⁰¹
2693⁶⁰² Priority:
2694⁶⁰³ - First, sort by isInOntology: true first.
2695⁶⁰⁴ - Then by Importance (descending: 4,3,2,1)
2696⁶⁰⁵
2697⁶⁰⁶ But note: the priority is assigned per entry (per reaction within a disconnection point).
2698⁶⁰⁷
2699⁶⁰⁸ So we create a flat list of all reaction entries (each with its own disconnection string, forwardReaction, etc
2700⁶⁰⁹ .).
2701⁶¹⁰
2702⁶¹¹ Then we assign a priority number: 1,2,3,... based on:
2703⁶¹² - isInOntology: true comes before false
2704⁶¹³ - Then by Importance descending.
2705⁶¹⁴
2706⁶¹⁵ Lets list all entries:
2707⁶¹⁶
2708⁶¹⁷ Entry 1: disconnection: "C:2_C:3", forwardReaction: "OtherReaction:_Enolate_alkylation", isInOntology: false,
2709⁶¹⁸ Importance: 3
2710⁶¹⁹ Entry 2: disconnection: "S:6_C:5", forwardReaction: "S-alkylation_of_thiols", isInOntology: true, Importance:
2711⁶²⁰ 2
2712⁶²¹ Entry 3: disconnection: "C:12_N:14", forwardReaction: "Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/
2713⁶²² Carbamoyl_Halides_and_Analogs_N", isInOntology: true, Importance: 2
2714⁶²³ Entry 4: disconnection: "C:12_N:14", forwardReaction: "Aminolysis_of_esters", isInOntology: true, Importance:
2715⁶²⁴ 2
2716⁶²⁵ Entry 5: disconnection: "N:17_C:18", forwardReaction: "Buchwald-Hartwig/Ullmann-Goldberg/N-arylation_secondary
2717⁶²⁶ _amine", isInOntology: true, Importance: 3
2718⁶²⁷ Entry 6: disconnection: "N:17_C:18", forwardReaction: "Ullmann-Goldberg_Substitution_amine", isInOntology:
2719⁶²⁸ true, Importance: 3
2720⁶²⁹ Entry 7: disconnection: "C:1_C:2", forwardReaction: "Reaction_of_alkyl_halides_with_organometallic_compounds",
2721⁶³⁰ isInOntology: true, Importance: 2
2722⁶³¹ Entry 8: disconnection: "S:6", forwardReaction: "OtherReaction:_Sulfide_to_sulfone_oxidation", isInOntology:
2723⁶³² false, Importance: 1
2724⁶³³ Entry 9: disconnection: "C:3", forwardReaction: "Reduction_of_aldehydes_and_ketones_to_alcohols", isInOntology
2725⁶³⁴ : true, Importance: 1
2726⁶³⁵
2727⁶³⁶ Now, group by disconnection? The output format:
2728⁶³⁷ "disconnections": [
2729⁶³⁸ {
2730⁶³⁹ "disconnection": "C:2_C:3",
2731⁶⁴⁰ "reactions": [...]
2732⁶⁴¹ },
2733⁶⁴² ...
2734⁶⁴³]
2735⁶⁴⁴
2736⁶⁴⁵ But note: the same disconnection string may have multiple reactions? So we group.

2700 We have:

2701 "C:2_C:3": one reaction

2702 "S:6_C:5": one reaction

2703 "C:12_N:14": two reactions

2704 "N:17_C:18": two reactions

2705 "C:1_C:2": one reaction

2706 "S:6": one reaction

2707 "C:3": one reaction

2708 Now, we assign priority per reaction entry? But the Priority field is per reaction entry? The instructions say : for each object in the list (each disconnection object) we have a list of reactions. Then for each reaction, we have a Priority number?

2709 But the example shows:

```
2710 "disconnections": [
2711   {
2712     "disconnection": "C:1_C:2",
2713     "reactions": [
2714       {
2715         "forwardReaction": ...,
2716         "isInOntology": ...,
2717         ...,
2718         "Priority": 1
2719       },
2720       ... // more reactions for the same disconnection
2721     ]
2722   },
2723   ... // more disconnection points
2724 ]
```

2725 So the Priority is assigned per reaction entry (not per disconnection point).

2726 Therefore, we must assign a priority number to each reaction entry individually, across the entire list.

2727 So we have 9 reaction entries. We sort them by:

2728 Primary: isInOntology (true first)

2729 Secondary: Retrosynthesis Importance (descending)

2730 But note: the Priority field is a sequential integer (1,2,3,...) representing the calculated priority of the disconnection (actually, of the reaction entry).

2731 So we sort the 9 entries:

2732 Group 1: isInOntology=true (entries 2,3,4,5,6,7,9) -> 7 entries

2733 Group 2: isInOntology=false (entries 1,8) -> 2 entries

2734 Within Group 1 (isInOntology=true), sort by Importance descending:

2735 Importance 3: entries 5,6 -> two entries

2736 Importance 2: entries 2,3,4,7 -> four entries

2737 Importance 1: entry 9 -> one entry

2738 Within Group 2 (isInOntology=false), sort by Importance descending:

2739 Importance 3: entry 1

2740 Importance 1: entry 8

2741 Now, assign priority:

2742 Priority 1: entry 5 (isInOntology=true, Importance=3)

2743 Priority 2: entry 6 (isInOntology=true, Importance=3)

2744 Priority 3: entry 2 (isInOntology=true, Importance=2)

2745 Priority 4: entry 3 (isInOntology=true, Importance=2)

2746 Priority 5: entry 4 (isInOntology=true, Importance=2)

2747 Priority 6: entry 7 (isInOntology=true, Importance=2)

2748 Priority 7: entry 9 (isInOntology=true, Importance=1)

2749 Priority 8: entry 1 (isInOntology=false, Importance=3)

2750 Priority 9: entry 8 (isInOntology=false, Importance=1)

2751 But note: the same disconnection point may have multiple reactions? And they are grouped under the same disconnection object? So we dont break the grouping.

2752 In the output, we list the disconnection objects, and within each, the reactions are listed. The Priority number is assigned per reaction entry.

2753 So we'll create the disconnection objects and then within each, assign the priority to each reaction entry.

2754 But the priority is global? The instructions say: "calculate_a_Priority_number_for_each_entry_by_ranking_them_based_on_two_criteria: 1. isInOntology (true before false), and 2. Retrosynthesis Importance (descending)." ."

2755 So the ranking is across all reaction entries (all 9). Then assign the rank.

2756 Therefore, we assign the priority numbers as above.

2757 Now, we write the JSON.

2758 Note: the rationale must explicitly state which analysis from Step 1 led to the disconnection?

2759 For example:

2760 For "C:2_C:3": Fragment Partitioning (B) or Strategic Bond Analysis (D)?

2761 We said: Fragment Partitioning and Strategic Bond Analysis?

2754
2755 In the rationale, we should say: "Convergent_disconnection_(Fragment_Partitioning)" or "Strategic_Bond_Analysis:_bond_alpha_to_carbonyl".
2756
2757 Well adjust the rationales accordingly.
2758
2759 Lets write the JSON.
2760
2761 ```json
2762 {
2763 "disconnections": [
2764 {
2765 "disconnection": "N:17_c:18",
2766 "reactions": [
2767 {
2768 "forwardReaction": "Buchwald-Hartwig/Ullmann-Goldberg/N-arylation_secondary_amine",
2769 "isInOntology": true,
2770 "forwardReactionClass": "Heteroatom_Alkylation_and_Arylation",
2771 "Retrosynthesis_Importance": 3,
2772 "Priority": 1,
2773 "rationale": "Convergent_disconnection_(Inter-Fragment_Analysis)_connecting_major_fragments_via_robust_N-arylation._Addresses_stereochemical_retention;_chemoselectivity_ensured_by_palladium_catalysis._Importance:_High_(3)_for_strategic_construction_of_key_C-N_bond."
2774 },
2775 {
2776 "forwardReaction": "Ullmann-Goldberg_Substitution_amine",
2777 "isInOntology": true,
2778 "forwardReactionClass": "Heteroatom_Alkylation_and_Arylation",
2779 "Retrosynthesis_Importance": 3,
2780 "Priority": 2,
2781 "rationale": "Convergent_disconnection_(Inter-Fragment_Analysis)_for_N-arylation._Classical_copper-mediated_coupling;_potential_chemoselectivity_issues_with_amine_nucleophilicity_require_optimization._Importance:_High_(3)_for_efficient_scaffold_assembly."
2782 }
2783],
2784 },
2785 {
2786 "disconnection": "C:2_c:3",
2787 "reactions": [
2788 {
2789 "forwardReaction": "OtherReaction:_Enolate_alkylation",
2790 "isInOntology": false,
2791 "forwardReactionClass": "C-C_Coupling",
2792 "Retrosynthesis_Importance": 3,
2793 "Priority": 8,
2794 "rationale": "Strategic_Bond_Analysis_targeting_C-C_bond_alpha_to_ketone._Forms_quaternary_center;_robust_but_requires_chemoselective_enolate_generation._Fluorinated_alkyl_halide_electrophile_may_pose_stability_issues._Importance:_High_(3)_for_core_scaffold_construction."
2795 }
2796],
2797 },
2798 {
2799 "disconnection": "C:12_N:14",
2800 "reactions": [
2801 {
2802 "forwardReaction": "Acylation_of_Nitrogen_Nucleophiles_by_Acyl/Thioacyl/Carbamoyl_Halides_and_Analogs_N",
2803 "isInOntology": true,
2804 "forwardReactionClass": "Acylation",
2805 "Retrosynthesis_Importance": 2,
2806 "Priority": 4,
2807 "rationale": "FGI_Analysis_for_amide_disconnection._Acyl_chloride_coupling_reliable;_chemoselectivity_managed_via_stoichiometry._Piperazine_nucleophilicity_sufficient_without_protection._Importance:_Medium_(2)_for_functional_group_installation."
2808 },
2809 {
2810 "forwardReaction": "Aminolysis_of_esters",
2811 "isInOntology": true,
2812 "forwardReactionClass": "Acylation",
2813 "Retrosynthesis_Importance": 2,
2814 "Priority": 5,
2815 "rationale": "FGI_Analysis_for_amide_formation._Thermally_driven_ester_aminolysis;_slower_but_avoids_acyl_chloride_handling._Potential_competing_hydrolysis_requires_anhydrous_conditions._Importance:_Medium_(2)_for_practical_amide_synthesis."
2816 }
2817],
2818 },
2819 {
2820 "disconnection": "S:6_c:5",
2821 "reactions": [
2822 {
2823 "forwardReaction": "S-alkylation_of_thiols",
2824 "isInOntology": true,
2825 "forwardReactionClass": "Heteroatom_Alkylation_and_Arylation",
2826 "Retrosynthesis_Importance": 2,
2827 "Priority": 3,
2828 "rationale": "FGI_Analysis_precursor_disconnection._Alkylation_of_thiolate_with_activated_alkyl_halide;_high_yield_due_to_ketone_activation._Chemoselectivity:_thiolate_may_require_protection_if_other_electrophiles_present._Importance:_Medium_(2)_for_sulfide_formation."
2829 }
2830],
2831 }
2832],
2833 }

```

2808 {
2809   "disconnection": "C:1_C:2",
2810   "reactions": [
2811     {
2812       "forwardReaction": "Reaction_of_alkyl_halides_with_organometallic_compounds",
2813       "isInOntology": true,
2814       "forwardReactionClass": "C-C_Coupling",
2815       "Retrosynthesis_Importance": 2,
2816       "Priority": 6,
2817       "rationale": "Strategic_Bond_Analysis_for_ethyl_group_attachment._Grignard_addition_to_alkyl_halide;
2818         fluorinated_electrophile_may_undergo_elimination._Ketone_protection_essential_pre-reaction._
2819         Importance:_Medium_(2)_for_fragment_coupling."
2820     }
2821   ],
2822   {
2823     "disconnection": "C:3",
2824     "reactions": [
2825       {
2826         "forwardReaction": "Reduction_of_aldehydes_and_ketones_to_alcohols",
2827         "isInOntology": true,
2828         "forwardReactionClass": "Reduction",
2829         "Retrosynthesis_Importance": 1,
2830         "Priority": 7,
2831         "rationale": "FGI_Analysis_(reduction)._Deactivates_alpha-methylene_for_sulfone_synthesis;_requires_
2832         re-oxidation_later._Chemoselective_for_ketone;_low_strategic_value._Importance:_Lower_(1)_for_
2833         non-simplifying_interconversion."
2834       }
2835     ]
2836   },
2837   {
2838     "disconnection": "S:6",
2839     "reactions": [
2840       {
2841         "forwardReaction": "OtherReaction:_Sulfide_to_sulfone_oxidation",
2842         "isInOntology": false,
2843         "forwardReactionClass": "Oxidation",
2844         "Retrosynthesis_Importance": 1,
2845         "Priority": 9,
2846         "rationale": "FGI_Analysis_(oxidation)._Converts_sulfide_to_sulfone;_reliable_with_peroxides._
2847         Epoxidation_side-reaction_unlikely_with_ketone_present._Importance:_Lower_(1)_for_late-stage_
2848         functionalization."
2849       }
2850     ]
2851   }
2852 ]
2853 }
2854 ""

```

Listing 4: Deepseek-R1 position model reasoning trace for LEI-515.