
A APPENDIX

A.1 DETAILS OF THE BREWALGORITHM

We provide pseudocode for the core components of BREW, aligning with the stages introduced in Section 3. Each algorithm plays a distinct role in constructing, organizing, or refining the knowledge base over iterative interactions. `GENERATEINSIGHTS` (Alg. 2) produces concept-aligned insights from annotated rollouts using `ReflAgent`. `DEDUPLICATECONCEPTS` (Alg. 3) clusters semantically overlapping concepts into a compact meta-concept set. `INTEGAGENT` incrementally builds and updates per-concept documents using newly generated insights. Finally, `EXPANDNODE` (Alg. 4) performs MCTS-guided expansions to explore improved document variants, while `EVALUATE` (Alg. 5) scores candidate KB states using correctness and retrieval-based rewards.

We specify the `IntegAgent` prompt below:

BREW Integrator Prompt

```
# Enhanced Documentation Editor Prompt

You are a meticulous documentation-level editor specializing in
comprehensive technical reference materials. You will be given a
list of topic nodes, each containing structured information that
must be preserved and enhanced with maximum detail retention.

## Input Structure Analysis
Each node contains:
- **Title**: The primary topic identifier
- **Context**: Background information and conceptual foundation
- **How to Use**: Step-by-step instructions, commands, flags,
  parameters, and implementation details
- **When to Use**: Specific scenarios, conditions, and decision
  criteria
- **Best Practices**: Expert recommendations, optimization techniques,
  and common pitfalls to avoid

## Detailed Processing Requirements

### 1. Information Preservation (Zero Loss Policy)
- **Preserve every technical detail**: All command-line flags,
  parameter values, configuration options, file paths, URLs, version
  numbers, and exact syntax
- **Maintain all examples**: Keep every code snippet, sample input/
  output, file names, directory structures, and command sequences
  exactly as provided
- **Retain contextual nuances**: Preserve qualifying language like "
  typically," "usually," "in most cases," "when available," and
  conditional statements
- **Keep quantitative data**: Preserve all numbers, measurements,
  timeframes, limits, thresholds, and statistical information
- **Maintain cross-references**: Keep all mentions of related tools,
  dependencies, prerequisites, and interconnected concepts

### 2. Enhanced Detail Extraction
- **Expand abbreviations**: When encountering shortened forms, expand
  them naturally while preserving the original
- **Surface implicit knowledge**: Make obvious assumptions explicit (e
  .g., "this requires root permissions," "assumes default
  configuration")
- **Clarify relationships**: Explicitly describe how different
  components, options, or steps relate to each other
- **Highlight edge cases**: Emphasize special conditions, exceptions,
  or unusual scenarios mentioned in the source
- **Elaborate on consequences**: When the source mentions outcomes,
  expand on both success and failure scenarios
```

```

702
703 ### 3. Prose Transformation Guidelines
704 - **Bullet integration**: Transform each bullet point into 1-3
705   complete sentences that naturally flow together
706 - **Technical precision**: Use precise technical vocabulary while
707   maintaining readability
708 - **Logical flow**: Organize information within each section to follow
709   a logical sequence (setup →execution →verification)
710 - **Contextual embedding**: Weave code snippets and technical terms
711   seamlessly into narrative sentences
712 - **Comprehensive coverage**: Ensure every sub-bullet, nested item,
713   and parenthetical note becomes part of the prose
714
715 ### 4. Structural Requirements
716 - **Heading hierarchy**: Use '# Title' for each node's main heading
717 - **Section order**: Maintain Context →How to Use →When to Use →Best
718   Practices sequence
719 - **Paragraph organization**: Create substantial paragraphs (3-6
720   sentences) rather than brief statements
721 - **Transition quality**: Craft smooth bridges between sections and
722   between different nodes
723 - **Code formatting**: Preserve all inline code with backticks and
724   maintain proper formatting for code blocks
725
726 ### 5. Quality Assurance Checklist
727 Before finalizing, verify:
728 - [ ] Every piece of source information appears in the output
729 - [ ] All technical specifications, parameters, and examples are
730   intact
731 - [ ] Code snippets maintain their exact syntax and formatting
732 - [ ] Prose flows naturally without choppy or fragmented sentences
733 - [ ] Each section provides comprehensive coverage of its topic area
734 - [ ] Cross-references and dependencies are clearly explained
735 - [ ] No section labels or formatting artifacts remain in the prose
736
737 ## Output Specifications
738 Generate a single, cohesive markdown document that reads as
739   authoritative technical documentation. The result should be
740   comprehensive enough that a reader could successfully implement
741   the described tools or techniques using only the information
742   provided, without referring back to the original nodes.
743
744 ---
745
746 **Input Nodes:**
747 <NODES>
748 {node_list}
749 </NODES>
750
751 ---
752
753 Now, produce the aggregated markdown reference sheet with maximum
754   detail preservation and enhanced clarity.
755

```

Algorithm 2 GenerateInsights: Extract behavioral insights from trajectories

Require: Queries $\mathcal{Q}$, KB $\mathcal{D}$, rubrics**Ensure:** Concept-insight pairs $\mathcal{B}$

```
1:  $\mathcal{B} \leftarrow \emptyset$ 
2: for each query  $q \in \mathcal{Q}$  do
3:    $\tau \leftarrow \text{LLM}(q, \mathcal{D})$  ▷ Generate trajectory
4:   label  $\leftarrow \text{GRADE}(\tau)$  ▷ Success/failure
5:    $(c, i) \leftarrow \text{REFLAGENT}(\tau, \text{rubrics}, \text{label})$ 
6:    $\mathcal{B} \leftarrow \mathcal{B} \cup \{(c, i, q)\}$  ▷ Store with source query
7: end for
8: return  $\mathcal{B}$ 
```

Algorithm 3 DeduplicateConcepts: Cluster similar concepts and map queries

Require: Concept-insight-query triples $\mathcal{B}$ **Ensure:** Meta-concepts $\mathcal{K}$ with mapped queries and insights

```
1: Extract all concepts from  $\mathcal{B}$ 
2: Embed and cluster concepts by similarity
3:  $\mathcal{K} \leftarrow$  cluster representatives
4: for each  $k \in \mathcal{K}$  do
5:    $\mathcal{Q}_k^{\text{train}} \leftarrow \{\text{training queries that contributed insights to } k\}$ 
6:    $\mathcal{Q}_k^{\text{eval}} \leftarrow \{\text{held-out queries relevant to } k\}$ 
7:    $\mathcal{I}_k \leftarrow \{\text{all insights mapped to concept } k\}$ 
8: end for
9: return  $\mathcal{K}$  with associated queries and insights
```

Algorithm 4 ExpandNode: Generate and evaluate new document variants

Require: Node s , concept k , candidates h , current KB $\mathcal{D}_{\text{current}}$, best docs $\mathcal{D}_{\text{best}}$, tree**Ensure:** Updated tree with new evaluated nodes

```
1: ▷ Generate new insights from concept-relevant queries
2:  $\mathcal{B}_{\text{new}} \leftarrow \emptyset$ 
3: for query  $q \in \mathcal{Q}_k^{\text{train}}$  do
4:    $\tau \leftarrow \text{LLM}(q, \mathcal{D}_{\text{current}})$ 
5:    $(c, i) \leftarrow \text{ANNOTATE}(\tau, \text{rubrics}, \cdot)$ 
6:   if  $c$  maps to  $k$  then
7:      $\mathcal{B}_{\text{new}} \leftarrow \mathcal{B}_{\text{new}} \cup \{i\}$ 
8:   end if
9: end for
10: ▷ Generate and evaluate candidate documents
11: for  $j = 1$  to  $h$  do
12:    $d_{k,j} \leftarrow \text{INTEGAGENT}(k, \mathcal{I}_k \cup \mathcal{B}_{\text{new}}, d_k^s)$ 
13:   ▷ Evaluate using hybrid KB with best docs from other concepts
14:    $\mathcal{D}_{\text{hybrid}} \leftarrow \{d_{k,j}\} \cup \{d_{k'} \in \mathcal{D}_{\text{best}} : k' \neq k\}$ 
15:    $R_{k,j} \leftarrow \text{EVALUATE}(d_{k,j}, \mathcal{D}_{\text{hybrid}}, \mathcal{Q}_k^{\text{eval}})$ 
16:   ▷ Add to tree and backpropagate
17:   Add  $(d_{k,j}, R_{k,j})$  as child of  $s$  in tree
18:   Backpropagate  $R_{k,j}$  from new node to root
19: end for
```

Algorithm 5 Evaluate: Score document using held-out queries

Require: Document d_k , hybrid KB $\mathcal{D}_{\text{hybrid}}$, eval queries $\mathcal{Q}_k^{\text{eval}}$

Ensure: Reward score R

```
1:  $R^{\text{corr}} \leftarrow 0$ 
2:  $R^{\text{ret}} \leftarrow 0$ 
3: for each  $q \in \mathcal{Q}_k^{\text{eval}}$  do
4:    $R^{\text{corr}} \leftarrow R^{\text{corr}} + \text{EVAL}(q, \text{agent} \oplus \mathcal{D}_{\text{hybrid}})$ 
5:    $R^{\text{ret}} \leftarrow R^{\text{ret}} + \text{MRR}(d_k, q, \mathcal{D}_{\text{hybrid}})$ 
6: end for
7:  $R^{\text{corr}} \leftarrow \frac{R^{\text{corr}}}{|\mathcal{Q}_k^{\text{eval}}|}$ 
8:  $R^{\text{ret}} \leftarrow \frac{R^{\text{ret}}}{|\mathcal{Q}_k^{\text{eval}}|}$ 
9: return  $\lambda_{\text{corr}} \cdot R^{\text{corr}} + \lambda_{\text{ret}} \cdot R^{\text{ret}}$ 
```

A.2 BREW CONFIGURATIONS

Base LLM Configuration For all BREW algorithm steps, we use the OpenAI GPT-4.1-2025-04-14 model as the underlying language model. To balance exploration and stability, we set the temperature to 0.7 for the `IntegAgent` component to encourage diversity in sampled completions, while all other calls use a temperature of 0.1 for deterministic behavior. The search process employs an expansion width of $e = 3$, a maximum search depth of $k = 3$, and a maximum of $n = 10$ iterations. Reward signals are weighted equally across correctness and retrieval relevance, with $\lambda_{\text{corr}} = \lambda_{\text{ret}} = 0.5$.

A.3 BASELINE METHODS

We compare BREW against two common reasoning baselines. Step-Back Prompting encourages backward reasoning by guiding the model to work from the final task objective back to the initial actions. In-Context Learning augments the input prompt with successful trajectories from related tasks, enabling the model to benefit from relevant prior examples without additional fine-tuning.

A.4 BENCHMARK SPECIFICATIONS

A.4.1 OSWORLD: COMPUTER-USE AUTOMATION

Dataset Overview OSWorld Xie et al. (2024) comprises 369 real-world computer-use tasks spanning 10 distinct applications. The benchmark is divided into train and test sets, with the distribution of tasks across domains shown in Table 2.

Agent Specifications The UI-Tars-7B variant is a 7B-parameter multimodal transformer fine-tuned for graphical user interface understanding. It operates over an action space of PyAutoGUI commands (e.g., click, type, and key presses). The agent integrates a retrieval module that queries a task-relevant knowledge base using the user-provided description, with the top three retrieved items added to the system prompt. Inputs to the model consist of a screenshot of the active UI paired with the natural language task description.

The GTA1-7B configuration adopts a two-agent architecture, consisting of a planner and a grounding module. The planner (GTA-1-7B) generates the high-level action sequence, while the grounding module (OpenAI O3) verifies and refines each action before execution. Knowledge retrieval is incorporated differently for each component: the planner performs a single retrieval at the start of execution, which is persisted in its prompt, whereas the grounding module performs dynamic retrievals at each verification step.

Evaluation Protocol Evaluation uses 134 task-specific scripts designed for automated verification. Success criteria include file state checks (e.g., validating `.xlsx` or `.docx` outputs), UI element validation to confirm correct interaction, and process completion checks to ensure that the intended automation sequence was executed successfully.

A.4.2 τ^2 -BENCH: INTERACTIVE TOOL USAGE

Dataset Overview τ^2 -Bench Barres et al. (2025b) extends τ -Bench by introducing bidirectional tool-calling capabilities. The dataset covers multiple service-oriented domains, with domain-level task distributions summarized in Table 3.

Domain Characteristics The benchmark spans several domains with distinct task characteristics. The Telecom domain focuses on connectivity troubleshooting, plan modifications, and service activation workflows. The Retail domain includes order processing, return handling, and inventory queries. The Airline domain emphasizes booking modifications and policy-compliant rescheduling scenarios.

Interaction Settings Two interaction modes are defined. In Easy mode, a human proxy (implemented via GPT-4.1) provides detailed guidance to the agent. The knowledge base is built exclusively from Easy mode trajectories, ensuring high-quality demonstrations for learning. In Hard mode, human intervention is minimized. The knowledge base combines both Easy and Hard trajectories, testing the agent’s robustness to underspecified or noisy instructions.

Evaluation Criteria Task success is measured using domain-specific verification procedures. These include database state checks to validate final outcomes, status checks for confirming service or connection state, natural language verification to ensure correct confirmation statements appear in dialogue, and action matching to confirm that all required steps are completed. Each domain uses a tailored subset of these checks (e.g., Telecom relies primarily on status checks).

Domain	Test	Train
Calc	45	2
Chrome	44	2
Writer	21	2
Gimp	24	2
Impress	45	2
Os	22	2
Thunderbird	13	2
Multi-apps	99	2
VLC	15	2
VSCode	21	2
Total	349	20

Table 2: Test and Train samples across different domains in OSWorld.

Domain	Test	Train
Telecom	105	7
Retail	105	7
Airline	44	6
Total	254	20

Table 3: Task-wise breakdown for τ^2 -Bench with assumed 2-shot training samples per domain.

Domain Characteristics

- **Telecom:** Connectivity issues, plan management, service activation
- **Retail:** Order processing, returns, inventory queries
- **Airline:** Booking modifications, policy-compliant rescheduling

Evaluation Criteria Task success determined by:

- **Database Checks:** Final state verification

- **Status Checks:** Service/connection state validation
- **NL Checks:** Confirmation statements in dialogue
- **Action Matching:** Required action sequence completion

Note: Each domain uses specific check combinations (e.g., Telecom uses only status checks).

A.4.3 SPREADSHEETBENCH: REAL-WORLD SPREADSHEET MANIPULATION

Dataset Overview SpreadsheetBench Ma et al. (2024) consists of 912 instructions collected from four major Excel forums and blogs. Each instruction is paired with spreadsheets reflecting authentic, complex user scenarios, often containing multiple tables and non-standard relational structures. The dataset totals 2,729 test cases, averaging three per instruction. A breakdown of cell-level and sheet-level manipulations is shown in Table 4.

Task Settings The benchmark defines two dimensions of evaluation:

- **Granularity:** Instructions involve either *cell-level* manipulations (specific ranges such as D2:D6) or *sheet-level* manipulations (entire tables or multi-sheet updates).
- **Evaluation:** Performance is measured using an Online Judge (OJ)-style protocol. The *soft* setting (IOI-style) awards partial credit when only some test cases are solved, while the *hard* setting (ICPC-style) requires solutions to succeed on all test cases.

Agent Configuration We evaluate textttto4-mini using a function-calling agent connected to a single Python execution tool. The agent translates natural language instructions into Python code for spreadsheet manipulation (e.g., modifying cells, applying formulas, restructuring tables). After each tool call, all formulas in the spreadsheet are recalculated to ensure consistency before proceeding to the next step. This setup provides a controlled environment to assess reasoning, code generation, and execution robustness across diverse spreadsheet tasks.

Granularity	Instructions	Test Cases
Cell-Level	329	986
Sheet-Level	583	1,743
Total	912	2,729

Table 4: Cell-level vs. sheet-level distribution in SpreadsheetBench.

A.5 KB CONSTRUCTION AND RETRIEVAL DETAILS

Training Data Collection

- **OSWorld:** 20 successful trajectories (2 per application domain) and 10 for evals.
- **τ^2 -Bench:** 20 trajectories balanced across domains and difficulty settings and 10 for evals.
- **SpreadsheetBench:** Uniformly sample 30 trajectories for training and 10 for evaluation.

All numbers are reported on the remaining train set.

Retrieval Strategy

- **Query Formation:** For each task we take in the seed Natural Language query as the retrieval query.
- **Retrieval Count:** We take top-3 documents for all the retrieval steps
- **Integration Point:** For SPREADSHEET BENCH and OSWorld we insert retrievals in the system prompt augmentation. For τ^2 -bench we add perfrom retrieval after each user interaction.

	Baseline	max_width=3, max_depth=3	max_width=3, max_depth=10	max_width=10, max_depth=3
OSworld	44.20	47.56	43.83	49.32

Table 5: OSworld difference in MCTS parameters

B QUALITATIVE ANALYSIS

Exploration on MCTS parameters WE evaluate OSworld on two different MCTS parameters.

- **Increased Depth:** To increase the depth we keep maximum width of the tree as 3 and depth as 10 with max number of iterations as 25. We observe that the Knowledge base over optimizes on the train set leading to a poorer performance on test set.
- **Increased Width:** For increased width we reverse the parameters where depth is 3 and maximum width is 10 with max iterations 25. We observe many different styles of KBs are generated storing very similar information, these different styles lead to a varied performance on both eval and test set notifying the importance of state search.

We report the numbers on table ??

C EXEMPLAR KNOWLEDGE BASES

C.1 KNOWLEDGE BASE LEARNED FOR OSWORLD

We showcase a small part of knowledge base learned thought BREW . This demonstrate 3 major parts on which each document is aggregated. These parts discuss when to use a piece of information, why to use the information, how to use the information/tool.

```
## Search and Open Files

**When to use**: Locating documents, spreadsheets, images, or
downloads for editing, conversion, or attachment.

### How to Perform
- Open **File Manager (Nautilus)** from launcher or system dock
- Press 'Ctrl + F' or click the search icon
- Enter part of filename, full name, or wildcard (*.pdf', 'report*)
- Use right-click →**Open With** to choose the desired application
- Use the sidebar to navigate to **Downloads**, **Documents**, or
custom folders

### Additional Actions
- Right-click →**Properties** to check modification date or file type
- Sort results by Date, Type, or Name from the top-right dropdown
- Use 'F2' to rename files inline

### Example
- Task: "Edit the file titled 'sales_report_march.ods'"
- Search for 'sales' in File Manager
- Confirm '.ods' type and open with LibreOffice Calc

...

## Insert Images

**When to use**: Adding visual elements to documents, presentations,
emails, or templates.

### How to Perform
- Navigate to **Insert →Image →From File** (in Writer, Impress,
Thunderbird)
```

```

1026 - Select an image file (`.png`, `.jpg`, `.svg`) from the file dialog
1027 - Use drag handles to resize; right-click → **Wrap** or **Alignment**
1028   for layout
1029
1030 ### Additional Actions
1031 - In GIMP: **File → Open as Layers** to insert image as a new layer
1032 - Use drag-and-drop from file manager into open document windows
1033 - Use **Format → Image** to apply borders, shadows, or color
1034   corrections (in Writer/Impress)
1035
1036 ### Example
1037 - Task: "Insert the logo.png image into the title slide"
1038   - Open `.odp` file in Impress → Go to Slide 1 → Insert → Image →
1039     Select `logo.png`
1040
1041 ...
1042
1043 ## Export as PDF
1044
1045 **When to use**: Required submission format
1046
1047 ### How to Perform
1048 - Go to **File → Export As PDF**
1049 - Choose output folder (usually **Documents** or **Downloads**)
1050 - Click **Save**, then confirm the exported file opens correctly
1051
1052 ### Additional Actions
1053 - In GIMP or Impress: choose **File → Export As**, then select `.pdf`
1054   from format list
1055 - Use **Save As** to preserve both editable and exported versions
1056   separately
1057
1058 ### Example
1059 - Task: "Export the flyer.xcf as a PDF"
1060   - Open in GIMP → File → Export As → Rename to `flyer.pdf` → Click
1061     Export

```

C.2 BREW KNOWLEDGE BASE FOR τ^2 -BENCH

BREW enable use to learn relevant information for tau bench for across the domains in a single knowledge base. This knowledge base is helpful to use relevant actions from the action pool.

```

1064 ### Additional Actions
1065
1066 * Inform the user:
1067   - Refunds via gift card = immediate.
1068   - Refunds via other methods = -57 business days.
1069
1070 ### Example
1071
1072 * Task: "Cancel a T-shirt order placed yesterday"
1073   * Validate: Status is `pending`
1074   * Reason: "no longer needed"
1075   * Confirm
1076   * Execute tool call
1077
1078 # Exchange Delivered Order
1079
1080 **When to use**:
1081 User wants to swap delivered items for a different variant (e.g., size
1082   or color).

```

```

1080
1081 **Why to use it**:
1082 To fix sizing or option errors without needing a new purchase.
1083
1084 ### How to Perform
1085 - Authenticate user
1086 - Confirm order status is 'delivered'
1087 - Get full list of exchange items
1088 > "Please ensure all items for exchange are listed. This step 'cant be
1089 repeated."
1090 - Ask for refund/payment method
1091 - Confirm:
1092 > "'Youre exchanging item X for same product, different option.
1093 Proceed?"
1094 - On confirmation:
1095 ```python
1096 request_exchange(order_id="45678", item_exchanges=[...],
1097 payment_method="paypal")
1098 ```
1099
1100 ### Additional Actions
1101
1102 * Mention: An email will be sent with return instructions
1103 * Validate that the new variant is from the same product
1104
1105 ### Example
1106
1107 * Task: "Exchange red shirt for blue in Order #45678"
1108 * Confirm all exchange items
1109 * Confirm payment method for difference
1110 * Execute tool call
1111
1112 ### Example
1113
1114 * Task: "Show me my last 2 orders"
1115 * Authenticate
1116 * Retrieve and present info
1117
1118 # Deny Unsupported Request
1119
1120 **When to use**:
1121 User asks for an unsupported action (e.g., cancel processed order,
1122 exchange to different product type, help another user).
1123
1124 **Why to use it**:
1125 To stay compliant with platform policy.
1126
1127 ### How to Perform
1128 - Politely reject:
1129 > "'Im sorry, but I 'cant process that request. 'Its outside the
1130 allowed scope."
1131
1132 ### Example
1133
1134 * Task: "Cancel a processed order"
1135 * Respond with denial message
1136 # Transfer to Human Agent
1137
1138 **When to use**:
1139 User needs help outside the 'assistants permitted capabilities.
1140
1141 **Why to use it**:
1142 To ensure user gets the right help from trained staff.
1143
1144 ### How to Perform

```

```

1134 - Make tool call:
1135     ```python
1136     transfer_to_human_agents()
1137     ```
1138 - Then inform user:
1139     > "YOU ARE BEING TRANSFERRED TO A HUMAN AGENT. PLEASE HOLD ON."
1140
1141 ### Example
1142
1143 * Task: "Delete a task"
1144 * Deny deletion
1145 * Transfer to human

```

C.3 BREW KNOWLEDGE BASE FOR SPREADSHEETBENCH

```

1148 Header Extraction
1149 1. Detecting Header Rows
1150 Overview:
1151 To accurately identify header rows, scan the initial region of your
1152 dataset. This process is crucial for mapping column information
1153 for further processing.
1154
1155 Approaches:
1156 - Heuristic Checks:
1157 - Look for rows where all cells are strings (e.g., "Name", "Date", "
1158   Region", "Amount").
1159 - Identify rows with distinctive formatting such as bold text or
1160   background color.
1161 - Example:
1162 | Name | Date | Region | Amount | |--
1163 |-----|-----|-----|-----| | John | 2024-01-01| North
1164 | 100 |
1165
1166 - Pattern Recognition:
1167 - Use regex to match typical header patterns, such as column names
1168   starting with uppercase letters.
1169 - Score candidate rows based on the likelihood of being headers.
1170 - Multi-Table Sheets:
1171 - Detect gaps, empty rows, or separators indicating a new table.
1172 - Assign a Table ID to each detected table for later reference.
1173
1174 Edge Cases:
1175 - Merge multi-row headers (e.g., "Sales" over "2024", "2025" becomes "
1176   Sales 2024", "Sales 2025").
1177 - Fill in missing headers by inferring from context.
1178
1179 2. Assigning and Validating Headers
1180 Overview:
1181 Once headers are detected, assign them programmatically and ensure
1182 they match expected schema and data types.
1183
1184 Implementation:
1185 - Column Naming:
1186 - Set names in code, e.g., df.columns = ["Name", "Date", "Region", "
1187   Amount"].
1188 - Schema Mapping:
1189 - Map headers to a standardized schema, using external files or user
1190   prompts.
1191 - Example:
1192 - Raw header: "Amt"; Mapped header: "Amount"
1193 - Quality Checks:
1194 - Detect duplicate or empty headers ("Date", "Date" becomes "Date_1",
1195   "Date_2").
1196 - Validate each column's expected data type.

```

```

1188 3. Automation and Usability Enhancements
1189 Overview:
1190 Enhance usability and automation to streamline header extraction and
1191 user interaction.
1192
1193 Features:
1194 - Freeze Panes:
1195 - Automatically freeze header rows in Excel for easier navigation.
1196 - Highlighting:
1197 - Use colored formatting to visually distinguish headers.
1198 - Example:
1199 - Yellow fill for header row.
1200 - Documentation:
1201 - Log extraction logic and confidence scores for each detected header.
1202 - Integration:
1203 - Build header extraction into ETL pipelines and record process
1204 metadata.
1205
1206 Block Detection
1207 1. Identifying Block Boundaries
1208 Overview:
1209 Block detection segments data into logical units or tables.
1210
1211 Methods:
1212 - Boundary Detection:
1213 - Find empty rows, repeated labels, or formatting changes.
1214 - Example:
1215 | Name | Amount | |-----|-----| | John | 100 | | | | <-- Empty row
1216 indicates new block | Name | Amount | | Alice| 200 |
1217 - Machine Learning:
1218 - Train classifiers to detect block boundaries based on cell patterns.
1219
1220 Advanced:
1221 - Detect nested blocks or hierarchies using indentation or merged
1222 cells.
1223 - Identify summary blocks with keywords like "Total" or "Summary".
1224
1225 2. Processing and Tracking Blocks
1226 Overview:
1227 Once blocks are detected, assign IDs and enable block-level analysis.
1228
1229 Actions:
1230 - Block ID:
1231 - Assign unique IDs (e.g., Block_001, Block_002).
1232 - Analysis:
1233 - Perform group-by or aggregation within each block.
1234 - Example:
1235 - Sum "Amount" for Block_001: 100 + 150 = 250
1236
1237 3. Additional Block Actions
1238 Overview:
1239 Enable modular analysis and reporting at the block level.
1240
1241 Features:
1242 - Summary Rows:
1243 - Add computed totals/averages for each block.
1244 - Export/Save:
1245 - Save blocks as separate files or sheets.
1246 - Example:
1247 - Export Block_001 to "block1.csv"
1248
1249 Search for Values or Patterns
1250 1. Search Execution Methods
1251 Overview:
1252 Efficiently locate specific values or patterns in your data.

```

1242

1243 Techniques:

1244 - Manual Tools:

1245 - Use Ctrl + F in Excel for quick lookups.

1246 - Programmatic Search:

1247 - Scan all cells using loops or vectorized code.

1248 - Example:

1249 - Find all instances of "North" in the "Region" column.

1250 - Pattern Matching:

1251 - Support exact, wildcard (*Total*), and regex (\d{4}-\d{2}-\d{2} for dates).

1252

1253 2. Recording and Highlighting Results

1254 Overview:

1255 Log and visualize search matches for user review.

1256

1257 Actions:

1258 - Logging:

1259 - Record coordinates (e.g., Sheet1, Row 3, Col "Region").

1260 - Highlighting:

1261 - Apply conditional formatting to search hits.

1262

1263 3. Advanced Search Scenarios

1264 Overview:

1265 Handle complex or large-scale search requirements.

1266

1267 Scenarios:

1268 - Merged Cells:

1269 - Search within merged cells or across multiple sheets.

1270 - Export:

1271 - Export found results for further analysis.

1272 - Example:

1273 - Export all rows containing "John" to "john_results.csv"

1274

1275 Writeback Results

1276 1. Output Placement

1277 Overview:

1278 Choose where and how to insert results.

1279

1280 Options:

1281 - Target Columns:

1282 - Select existing or blank columns for output.

1283 - Appending:

1284 - Add new columns for flags, counts, or statuses.

1285 - Example:

1286 - Add "Approved_Flag" column next to "Status".

1287

1288 2. Writing and Styling Results

1289 Overview:

1290 Automate and style the output for visibility.

1291

1292 Methods:

1293 - Formulas/Code:

1294 - Use code (e.g., ws.cell(row, col).value = result) to insert results.

1295 - Styling:

1296 - Bold, borders, or colors for output cells.

1297 - Example:

1298 - Green fill for "Success", red for "Error".

1299

1300 3. Audit and Protection

1301 Overview:

1302 Maintain the integrity and traceability of results.

1303

1304 Measures:

1305 - Lock Columns:

```

1296 | - Prevent edits to output columns.
1297 | - Timestamps/User Info:
1298 | - Add audit trail for writebacks.
1299 | - Example:
1300 | - "2024-06-01, User: admin"
1301 |
1302 | Difference in State
1303 | 1. Sheet Comparison
1304 | Overview:
1305 | Identify changes between input and output sheets.
1306 |
1307 | Process:
1308 | - Load Sheets:
1309 | - Read both sheets into memory.
1310 | - Compare Cells:
1311 | - Detect differences by position and value.
1312 |
1313 | 2. Recording and Reporting Differences
1314 | Overview:
1315 | Log and report all detected changes.
1316 |
1317 | Actions:
1318 | - Log Mismatches:
1319 | - Record cell coordinates and values.
1320 | - Example:
1321 | - Cell B3: "North" → "South"
1322 | - Export Diff Report:
1323 | - List all detected differences for review.
1324 |
1325 | 3. Visualization and Automation
1326 | Overview:
1327 | Make changes visible and automate validation.
1328 |
1329 | Features:
1330 | - Highlight Changes:
1331 | - Color code changed cells.
1332 | - Automate Checks:
1333 | - Integrate diff comparisons into test scripts.
1334 |
1335 | Column Selection
1336 | 1. Selection Criteria
1337 | Overview:
1338 | Choose relevant columns for analysis.
1339 |
1340 | Methods:
1341 | - Labels/Indices:
1342 | - Select by name or position.
1343 | - Dynamic Rules:
1344 | - E.g., all numeric columns.
1345 | - Assign Roles:
1346 | - Example: "ID", "Date", "Metric"
1347 |
1348 | 2. Preparation and Validation
1349 | Overview:
1350 | Prepare columns for consistent use.
1351 |
1352 | Actions:
1353 | - Rename/Relabel:
1354 | - Standardize column names.
1355 | - Validate Types:
1356 | - Ensure columns are of expected type.
1357 | - Example:
1358 | - "Date" column as datetime.
1359 |
1360 | 3. Reusability

```

1350 Overview:
1351 Save and reuse column selections.
1352
1353 Features:
1354 - Presets:
1355 - Save selection profiles.
1356 - Downstream Use:
1357 - Use validated columns in subsequent processes.

1358 Filter Rows
1359 1. Filtering Methods
1360 Overview:
1361 Refine your dataset with filters.
1362
1363 Techniques:
1364 - Spreadsheet Tools:
1365 - Use built-in filters.
1366 - Code Logic:
1367 - Filter with code (e.g., `df[df['Status'] == 'Approved']`).
1368 - Multiple Criteria:
1369 - Combine conditions (AND/OR).
1370 - Example:
1371 - Status = "Approved" AND Amount > 100

1372 2. Helper Columns and Complex Filters
1373 Overview:
1374 Simplify filtering using helper columns.
1375
1376 Actions:
1377 - Helper Columns:
1378 - Compute intermediate flags.
1379 - Document Logic:
1380 - Record filtering rules for audit.

1381 3. Post-Filter Actions
1382 Overview:
1383 Visualize and export filtered data.
1384
1385 Features:
1386 - Highlighting:
1387 - Grey-out filtered-out rows.
1388 - Export:
1389 - Save the filtered dataset.

1390 Merge Tables
1391 1. Key-Based Merging
1392 Overview:
1393 Combine tables using shared keys.
1394
1395 Techniques:
1396 - Join Operations:
1397 - Use VLOOKUP, JOIN, or code merges.
1398 - Example:
1399 - Merge "Customer_ID" from two tables.
1400 - Align Data:
1401 - Match on columns like "ID", "Name".

1402 2. Stack-Based Merging
1403 Overview:
Append tables when keys 'arent needed.

1404 Methods:
1405 - Vertical Append:
1406 - Combine rows from similar tables.
1407 - Deduplicate:

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1404 - Remove duplicate records.
1405
1406 3. Tracking and Audit
1407 Overview:
1408 Track source and unmatched records.
1409
1410 Actions:
1411 - Source Column:
1412 - Add "Source" to indicate origin.
1413 - Highlight Unmatched:
1414 - Mark or export mismatched rows.
1415
1416 Pivot or Unpivot
1417 1. Pivoting Data
1418 Overview:
1419 Summarize data using pivots.
1420
1421 Methods:
1422 - PivotTables:
1423 - Group by row/column dimensions.
1424 - Example:
1425 - Sum "Amount" by "Region".
1426 - Aggregation:
1427 - Choose SUM, AVG, COUNT, etc.
1428
1429 2. Unpivoting (Melting) Data
1430 Overview:
1431 Reshape data from wide to long format.
1432
1433 Techniques:
1434 - Melt Operations:
1435 - Convert columns into rows.
1436 - Example:
1437 -
1438 | Year | Sales_2019 | Sales_2020 | |-----|-----|-----|
1439 →
1440 | Year | Sales_Year | Value |
1441 - Flexible Restructuring:
1442 - Selectively unpivot non-ID columns.
1443
1444 3. Post-Pivot Actions
1445 Overview:
1446 Prepare pivoted data for export.
1447
1448 Features:
1449 - Flatten Pivot Table:
1450 - Convert back to flat for further analysis.
1451 - Reorder/Rename:
1452 - Clarify pivoted fields.
1453
1454 Map with Lookup Tables
1455 1. Mapping Techniques
1456 Overview:
1457 Standardize data using lookups.
1458
1459 Methods:
1460 - Functions:
1461 - Use VLOOKUP, merge with dictionaries.
1462 - Code-to-Label:
1463 - Example:
1464 - Code "N" →Label "North"
1465
1466 2. Application and Fallbacks
1467 Overview:
1468 Apply lookups and handle missing values.

```

1458

1459 Actions:

1460 - Apply Mappings:

1461 - Across selected columns.

1462 - Handle Missings:

1463 - Use defaults for missing codes.

1464

1465 3. Audit and Display

1466 Overview:

1467 Ensure mapping transparency.

1468

1469 Features:

1470 - Cache Mappings:

1471 - Store for repeated use.

1472 - Display Codes/Labels:

1473 - Show both for clarity.

1474

1475 Fill Missing Data

1476 1. Choosing Fill Methods

1477 Overview:

1478 Impute missing data appropriately.

1479

1480 Techniques:

1481 - Forward/Backward Fill:

1482 - Fill gaps with prior/next value.

1483 - Default Values:

1484 - Use fixed placeholder (e.g., 0, "Unknown").

1485 - Contextual Example:

1486 - Dates: Fill missing month with last known month.

1487

1488 2. Application and Auditing

1489 Overview:

1490 Apply fills and flag for review.

1491

1492 Actions:

1493 - Targeted Filling:

1494 - Apply to specific columns/rows.

1495 - Flag Filled Cells:

1496 - Highlight for later review.

1497

1498 3. Documentation

1499 Overview:

1500 Keep fill logic transparent.

1501

1502 Features:

1503 - Record Logic:

1504 - Document assumptions and methods.

1505 - Audit Trail:

1506 - Track all changes.

1507

1508 Flag Rows or Cells

1509 1. Defining Flag Rules

1510 Overview:

1511 Establish criteria for flagging.

1512

1513 Examples:

1514 - Simple Rule:

1515 - Flag where Amount < 0

1516 - Complex Rule:

1517 - Flag where Status = "Pending" and Amount > 1000

1518

1519 2. Applying Flags

1520 Overview:

1521 Insert flags and summarize.

1512 Actions:

1513 - Flag Column:

1514 - Add "Flag" column with "Yes"/"No".

1515 - Export Flagged Rows:

1516 - Save for further inspection.

1517

1518 3. Advanced Flagging

1518 Overview:

1519 Use multiple criteria and document.

1520

1521 Features:

1522 - Multi-Criteria:

1523 - Combine several rules for granular checks.

1524 - Notes:

1525 - Document flagging rationale.

1526

1526 Sort Data

1527 1. Setting Sort Criteria

1528 Overview:

1529 Organize data for analysis.

1530

1530 Options:

1531 - Sort Columns:

1532 - By value, ascending/descending.

1533 - Multi-Level:

1534 - E.g., sort by "Region", then by "Amount".

1535

1535 2. Applying Sorts

1536 Overview:

1537 Implement sorting programmatically or manually.

1538

1538 Methods:

1539 - Spreadsheet Tools:

1540 - Built-in sort features.

1541 - Code:

1542 - E.g., `df.sort_values(['Region', 'Amount'])`

1543

1543 3. Post-Sort Actions

1544 Overview:

1545 Finalize sorted data.

1546

1546 Actions:

1547 - Renumber Rows:

1548 - Update indices.

1549 - Highlight Extremes:

1550 - Mark top/bottom values.

1551

1551 Validate Data

1552 1. Validation Checks

1553 Overview:

1554 Ensure data meets required standards.

1555

1555 Checks:

1556 - Type:

1557 - Ensure numeric columns contain numbers.

1558 - Range:

1559 - E.g., `"Amount" > 0`.

1560 - Pattern:

1561 - Date columns match YYYY-MM-DD.

1562 - Business Rule Example:

1563 - `"Start Date" < "End Date"`

1564

1564 2. Marking and Reporting

1565 Overview:

Visualize and report errors.

1566	
1567	Actions:
1568	- Highlight Invalids:
1569	- Color-code errors.
1570	- Export Summary:
1571	- Table of error counts and locations.
1572	3. Integration in Workflow
1573	Overview:
1574	Make validation a routine part of processing.
1575	Features:
1576	- Pre-Processing Step:
1577	- Validate before analysis.
1578	- Automation:
1579	- Integrate into data pipelines.
1580	Split Sheets or Data
1581	1. Defining Split Rules
1582	Overview:
1583	Segment data for modular analysis.
1584	Methods:
1585	- By Category:
1586	- E.g., split by "Region".
1587	- By Date Range:
1588	- E.g., split by year.
1589	2. Exporting Segments
1590	Overview:
1591	Save segments for separate use.
1592	
1593	Actions:
1594	- Export Files:
1595	- "North_Region.csv", "South_Region.csv"
1596	- Consistent Formatting:
1597	- Ensure identical columns and styling.
1598	3. Automation and Documentation
1599	Overview:
1600	Automate splitting and track provenance.
1601	Features:
1602	- Automation:
1603	- Use scripts/macros for repeated splits.
1604	- Documentation:
1605	- Record rules and export logs.

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D QUALITATIVE ANALYSIS OF BREW-GENERATED KNOWLEDGE BASES

1615 This section presents a comprehensive qualitative analysis of knowledge bases generated through
1616 the BREW technique applied to two distinct agent training environments: OSWorld and τ^2 Bench
1617 described in the section before. The analysis examines knowledge representation patterns, procedural
1618 sophistication, and domain-specific learning characteristics extracted from CUA agent behaviors,
1619 providing insights into the effectiveness and scope of knowledge distillation techniques across diverse
task environments.

D.1 CROSS-DOMAIN KNOWLEDGE BASE ANALYSIS

D.1.1 BASE STRUCTURE & ORGANIZATION

Schema Consistency and Evolution: Both knowledge bases demonstrate consistent structural schemas, though adapted to their respective domains. The OSWorld KB employs a four-part schema (contextual triggers, procedural steps, extended capabilities, concrete instantiation), while the τ^2 Bench KB extends this to a five-part structure, adding explicit purpose rationale (“Why to use it”). This evolution suggests that BREW adapts its extraction patterns to domain-specific requirements—conversational commerce demands explicit justification for actions due to customer interaction contexts.

Taxonomic Organization Principles: The OSWorld KB reveals a **capability-based taxonomy** organized around computational tasks: file operations, document processing, inter-application workflows, and data visualization. Each category represents a distinct computational domain with specific tool requirements and interaction patterns. In contrast, the τ^2 Bench KB employs a **lifecycle-based taxonomy** structured around transactional states: order creation, modification, fulfillment, and post-delivery operations. This organizational difference reflects fundamental domain characteristics—desktop automation focuses on tool orchestration, while conversational commerce centers on process management.

Hierarchical Task Decomposition: Both KBs demonstrate sophisticated hierarchical reasoning, but through different decomposition strategies. OSWorld exhibits **technical decomposition**, breaking complex operations like “Create Charts from Data” into constituent technical steps (data selection, chart insertion, customization, formatting). τ^2 Bench shows **process decomposition**, structuring operations like order modification into authentication, validation, confirmation, and execution phases. This suggests BREW successfully identifies domain-appropriate decomposition strategies rather than applying uniform patterns.

Knowledge Boundary Definition: Both KBs explicitly encode operational boundaries, but through contrasting mechanisms. OSWorld boundaries are **capability-constrained**—determined by available applications and system resources. τ^2 Bench boundaries are **policy-constrained**—explicitly defined through “Deny Unsupported Request” patterns and escalation protocols. This difference highlights how knowledge extraction adapts to domain-specific constraint types.

D.1.2 PROCEDURAL KNOWLEDGE GROUNDING

Context-Dependent Action Selection: Both domains demonstrate sophisticated context awareness, but grounded in different environmental factors. OSWorld exhibits **application-context sensitivity**, where identical operations (e.g., image insertion) require different procedures across LibreOffice Writer, Impress, GIMP, and Thunderbird. The agent learned application-specific affordances and interaction patterns rather than generic command sequences. τ^2 Bench demonstrates **state-context sensitivity**, where available actions depend on order status (pending vs. delivered), payment methods, and authentication levels. This reveals learned understanding of business process constraints and temporal operation windows.

Error Prevention and Validation Workflows: Both KBs incorporate sophisticated error prevention mechanisms, but grounded in domain-specific failure modes. OSWorld emphasizes **technical validation**: file integrity checks (“confirm the exported file opens correctly”), application state verification, and multi-step confirmation for irreversible operations. τ^2 Bench emphasizes **transactional validation**: authentication cascades, confirmation dialogues with standardized templates, and explicit user consent protocols. The emergence of defensive programming practices across both domains suggests these represent fundamental principles of reliable agent behavior.

State-Dependent Decision Logic: The procedural knowledge in both domains demonstrates sophisticated state machine reasoning. OSWorld exhibits **application state awareness**—understanding when applications are ready for input, when files are loaded, and when operations can be safely executed. Window management and application switching reveal learned understanding of desktop metaphors and resource constraints. τ^2 Bench demonstrates **business process state awareness**—finite state machine reasoning where order lifecycle states determine available operations. The agent learned that pending orders enable modification while delivered orders unlock return workflows, indicating internalized understanding of business logic constraints.

1674 **Security and Authentication Grounding:** While OSWorld operates in a trusted desktop environment
1675 with minimal explicit security concerns, τ^2 Bench reveals pervasive **authentication-first paradigms**.
1676 Nearly every transactional operation begins with identity verification through email, name, and zip
1677 code combinations. The KB demonstrates **graduated security reasoning**: information retrieval
1678 requires basic authentication while financial transactions trigger rigorous verification protocols. This
1679 contrast highlights how procedural knowledge adapts to domain-specific security requirements.

1680 **Cross-Application vs. Cross-Process Orchestration:** OSWorld demonstrates **technical orches-**
1681 **tration**—coordinating multiple applications (Chrome, LibreOffice suite, File Manager, GIMP) to
1682 accomplish complex workflows. The “Navigate Between Applications” section reveals learned be-
1683 haviors for window management, application switching, and resource coordination. τ^2 Bench exhibits
1684 **process orchestration**—coordinating authentication, validation, confirmation, and execution phases
1685 across different operational contexts. Both forms of orchestration require sophisticated temporal
1686 reasoning and constraint management, but applied to different environmental complexity types.

1687 **Failure Mode Internalization:** Both KBs reveal learned understanding of domain-specific failure
1688 modes. OSWorld incorporates file validation, application crash recovery suggestions, and verification
1689 steps for critical operations. τ^2 Bench includes explicit escalation protocols (“Transfer to Human
1690 Agent”), policy compliance mechanisms, and irreversibility warnings for financial operations. The
1691 consistent emergence of failure-aware procedures suggests that agents successfully internalize risk
1692 assessment and mitigation strategies during training.

1693 **Domain-Specific Communication Patterns:** The procedural knowledge reveals distinct communica-
1694 tion paradigms appropriate to each domain. OSWorld procedures are **task-oriented** with minimal
1695 user interaction—focusing on efficient command execution and verification. τ^2 Bench procedures are
1696 **dialogue-oriented** with standardized customer interaction templates, confirmation protocols, and
1697 expectation management communications. This adaptation demonstrates that BREW extracts not just
1698 procedural logic but domain-appropriate interaction modalities.

1699 The cross-domain analysis reveals that BREW successfully extracts procedural knowledge that is both
1700 **structurally consistent** (following learnable organizational patterns) and **contextually grounded**
1701 (adapted to domain-specific constraints, failure modes, and interaction requirements). This dual capa-
1702 bility suggests significant potential for knowledge transfer across related domains while maintaining
1703 appropriate domain-specific adaptations.

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