Table 1: Evaluation of proposed and baseline methods across multiple robustness benchmarks. The best results are highlighted in bold font and the second best is highlighted in underlines. All backbone models are ViT-B with 86M parameters. In most situations, our proposed method achieves better performance over baselines. We exclude FourierFormer as it only implements the tiny version of ViT at this moment.

| Dataset | ImageNet-C | ImageNet-A | ImageNet-O | ImageNet-R | |
|-------------------|------------|--------------|--------------|-----------------|--|
| Metric | mCE↓ | Top-1 Acc↑ | AUPR↑ | Top-1 Err Rate↓ | |
| ViT | 55.54 | 26.62 | 21.43 | 73.60 | |
| RVT | 46.80 | 28.50 | 25.87 | 51.30 | |
| ViT-RKDE (Huber) | 46.72 | 26.68 | 28.33 | 50.26 | |
| ViT-RKDE (Hampel) | 46.75 | 26.75 | 28.65 | <u>50.17</u> | |
| ViT-SPKDE | 46.34 | <u>27.86</u> | 30.37 | 49.54 | |
| ViT-MoM | 49.36 | 23.34 | <u>29.53</u> | 55.62 | |

Table 2: The Top-1 accuracy (%) was measured on ImageNet's clean data as well as under adversarial attacks. All underlying models used are ViT-B with 86M parameters. The proposed methods demonstrate enhanced resilience against various adversarial attacks and simultaneously maintain competitive performance on the original ImageNet.

| Method | Clean Data | FGSM | PGD | SPSA |
|-------------------|--------------|--------------|--------------|--------------|
| ViT | 79.96 | 63.14 | 48.74 | 54.29 |
| RVT | <u>82.70</u> | 67.48 | 51.66 | <u>58.77</u> |
| ViT-RKDE (Huber) | 82.24 | 69.13 | 52.43 | 58.24 |
| ViT-RKDE (Hampel) | 82.33 | <u>69.16</u> | <u>52.54</u> | 58.31 |
| ViT-SPKDE | 82.95 | 70.08 | 52.89 | 58.96 |
| ViT-MoM | 81.16 | 67.22 | 50.65 | 57.43 |

Table 3: We measured the computation time (in seconds per batch) during the training phase for both the proposed and baseline Transformers. These results were obtained using the WikiText-103 dataset for the language modeling task.

| | Iterations of KIRWLS | | | VLS | Transformer | SPKDE | MoM | MGK |
|----------------|----------------------|------|------|------|-------------|-------|---------|------|
| | 1 | 2 | 3 | 5 | Transformer | SIKDL | IVIOIVI | WOK |
| Time (s/batch) | 0.32 | 0.43 | 0.56 | 0.72 | 0.17 | 0.86 | 0.18 | 0.45 |