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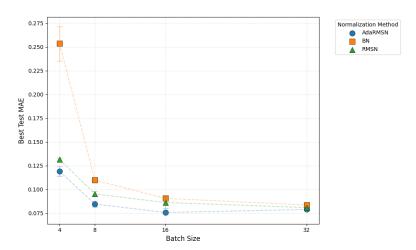


Figure 1. SGT on ZINC: Test MAE v.s. Batch Size (BS). # Training epochs are adjusted per batch-size for the same total update steps: 400 \* BS/32. The first 10% epochs are in the warmup stage.

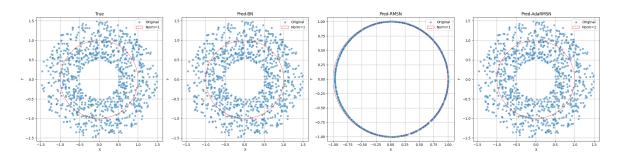


Figure 2. (Case Study of AdaRMSN) Visualization of Input and Pred data points. Ovefitting test on Auto-encoders of 2-dim ( $Linear \rightarrow BN/RMSN/AdaRMSN \rightarrow Linear$ ): each model is trained 5000 epochs via AdamW without regularization. (together with Figure. 3)

Table 1. Performance on ZINC. GPS+sL<sub>2</sub>: integrating sL<sub>2</sub> attention into GPS without changing other parts. (run 3 trials)

ZINC	GPS	$\mathbf{GPS+s}L_2$	SGT	
MAE (↓)	$0.070 \pm 0.004$	$0.0693 \pm 0.0023$	$0.0566 \pm 0.002$	

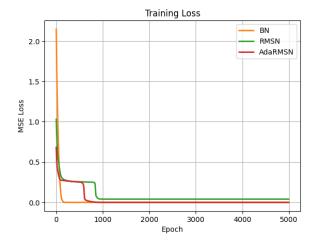


Figure 3. (Case Study of AdaRMSN) Training curves of overfitting test. (together with Figure. 2)

Table 2. Comparison of peak GPU memory usage and per-epoch training time for GRIT and SGT. Dataset: Peptides-Structure (15K graphs); Model config.: 5 transformer layers, 96 channels, batch size 32. Hardware: a single Nvidia V100 GPU with 32GB memory, supported by 80 Intel Xeon Gold 6140 CPUs running at 2.30GHz

Model   GPU Memory (GB)		Training Time (Sec/Epoch)		
GRIT	29.16	141.60		
SGT	25.07	100.68		
Improv.	~14.03%	${\sim}28.9\%$		

Table 3. Performance on PCMQM4Mv2 (over 3.7M graphs). The eval. pipeline follows Rampášek et al. (2022); no 3D-info included.

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1	28



PCMQM4Mv2 Val MAE (↓) # Param. Graphormer 0.0864 48.3M **GPS** 0.0858 19.4M **GRIT** 0.0859 16.6M **SGT** 0.0856 17.6M

Table 4. Performance comparison across different models on various datasets. Best results are highlighted in bold. \* indicates the difference to the best is not statistically significant (by two-tail T-test)

Model	ZINC MAE (\dagger)	SP-CIFAR Acc. (†)	SP-MNIST Acc. (†)	PATTERN W.Acc. (†)	CLUSTER W.Acc. (†)	Peptides-Struct MAE (↓)	Peptides-Func AP (†)
Exphormer	-	$74.69 \pm 0.125$	98.55±0.037	$86.74 \pm 0.015$	$78.07 \pm 0.037$	$0.2481 {\pm} 0.0007$	$0.6527 \pm 0.0043$
GEAET	-	$76.634 \pm 0.427$	$98.513 \pm 0.086$	$86.993 \pm 0.026$	-	$0.2445{\pm}0.0013$	-
GEANet	$0.193\pm0.001$	$73.857 \pm 0.306$	$98.315 \pm 0.097$	$85.607 \pm 0.038$	$77.013 \pm 0.224$	$0.2512 \pm 0.0003$	$0.6722 \pm 0.0065$
SGT	0.0566±0.002	$78.560 \pm 0.700$	$98.614 \pm 0.096$	$89.752 {\pm} 0.030$	$80.027 \pm 0.114$	$0.2450{\pm}0.0017*$	$0.6961 {\pm} 0.0062$

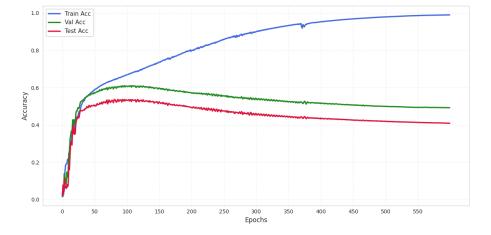


Figure 4. Sanity check of Exp-SGT on a large-scale graph in OGBN-ArXiv (169,343 nodes). Use the same configuration as Exphormer and remove all regularizations to validate the trainability via an overfitting test.