

Figure 1: Re-construction losses of MAE pre-training ViT-Large on ImageNet-1K. The number in bracket in the legend is the validation accuracy (%) after fine-tuning. ESWP achieves lossless acceleration over Baseline (no data selection), and consistently outperforms previous SOTA method InfoBatch.

	Baseline	InfoBatch	ESWP (r=0.3)	ESWP (r=0.5)
Time(h)	48.1	37.6	35.1	27.1
Time saved(%)	_	21.8	27.0	44.7
Acc.(%)	84.9	84.6	84.9	84.6

Table 1: Comparisons of pre-training time and fine-tuning accuracy (Table 6 updated)

	Baseline	Random	ES	ESWP
CIFAR-100 (clean), ResNet-50	81.1	$ 80.4_{\downarrow 0.7}, 29\% $	$81.1_{\uparrow 0.0}$	$11\% \mid 80.6_{\downarrow 0.5},  31\%$
CIFAR-100 (40% noise), ResNet-50	51.1	$ 52.9_{\uparrow 1.8}, 20\% $	$60.1_{\uparrow 9.0},$	$16\% \mid 58.7_{\uparrow 7.6},  25\%$
CoLA, BERT-Base	55.0	$ 53.9_{\downarrow 1.1}, 18\% $	$56.2_{\uparrow 1.2},$	$16\% \mid 54.7_{\downarrow 0.3},  24\%$
SST-2, BERT-Base	91.9	$91.7_{\downarrow 0.2}, 20\%$	92.0 <sub>↑0.1</sub> ,	$15\% \mid 92.3_{\uparrow 0.4},  24\%$

Table 2: Accuracy (%) and Time-Saved of ResNet-50 on CIFAR-100. Here Random renders Baseline with random data pruning, and its performance is consistently worse than ESWP under the same amount of computation time saving.

## References

Truong Thao Nguyen, Balazs Gerofi, Edgar Josafat Martinez-Noriega, François Trahay, and Mohamed Wahib. KAKURENBO: Adaptively hiding samples in deep neural network training. In A. Oh, T. Naumann, A. Globerson, K. Saenko, M. Hardt, and S. Levine, editors, *Advances in Neural Information Processing Systems*, volume 36, pages 37900–37922. Curran Associates, Inc., 2023. URL https://proceedings.neurips.cc/paper\_files/paper/2023/file/7712b1075f5e0eae297702845714098f-Paper-Conference.pdf.

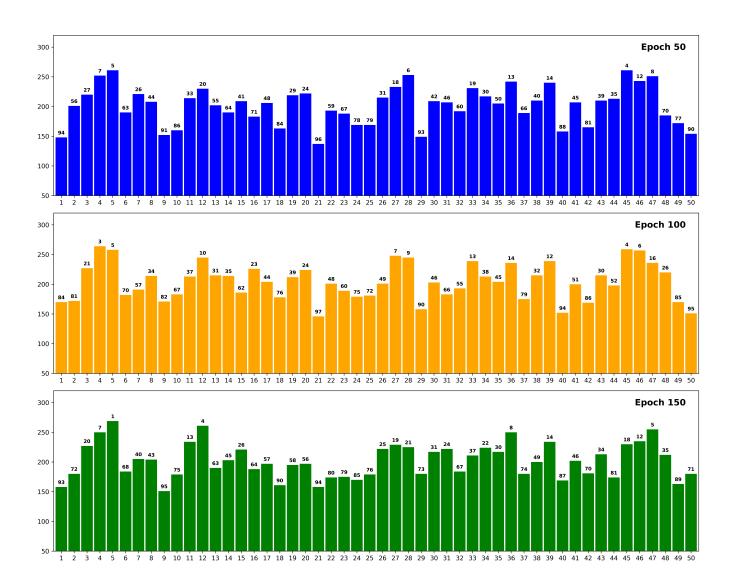


Figure 2: Visualization of the number of selected samples for BP of each class in ESWP (ResNet-50, Cifar-100), following Figure 6 in Thao Nguyen et al. [2023]. The figure shows the result of the first 50 classes. The number on top of each column shows the rank over 100 classes (a lower number indicates a higher number of selected samples). This indicates that ES(WP) can automatically select samples in different training stages.