Errata for "Cerebro: A Data System for Optimized Deep Learning Model Selection" (PVLDB 13(11): 2159-2173)

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We discovered that there was an inconsistency in the communication cost formulation for the decentralized fine-grained training method in **Table 2** of our paper. We used Horovod as the archetype for decentralized fine-grained approaches, and its correct communication cost is higher than what we had reported. So, we amend the communication cost of decentralized fine-grained to $2\mathbf{km}(\mathbf{p}-\mathbf{1})|\mathbf{S}| \left\lceil \frac{|\mathbf{D}|}{\mathbf{bp}} \right\rceil$, instead of $kmp|S| \left\lceil \frac{|D|}{\mathbf{bp}} \right\rceil$.

With this correction, **Table 2** of our paper should be corrected as follows, which uses the same notation.

Table 1: Communication cost analysis of MOP and other approaches. *Full replication. †Remote reads. †Parameters for the example: k = 20, |S| = 20, p = 10, m = 1GB, $\langle D \rangle = 1$ TB, and |D|/b = 100K.

	Comm. Cost	$\mathbf{Example}^{\ddagger}$
Model Hopper Parallelism	kmp S + m S	4 TB
Task Parallelism (FR*) Task Parallelism (RR [†])	$p\langle D\rangle + m S $ $k S \langle D\rangle + m S $	10 TB 400 TB
Bulk Synchronous Parallelism	2kmp S	8 TB
Centralized Fine-grained	$2kmp S \left\lceil \frac{ D }{bp}\right\rceil$	80 PB
Decentralized Fine-grained	$2km(p-1) S {\left\lceil \frac{ D }{bp} \right\rceil}$	72 PB

Also, the last two paragraphs of Section 2 that refers to the above table should be corrected as follows:

All PS-style approaches have high communication due to their centralized all-to-one communications, which is proportional to the number of mini-batches and orders of magnitude higher than BSP, e.g., 10,000x in Table 2.

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Decentralized Fine-grained. The best example is Horovod. It adopts HPC-style techniques to enable synchronous all-reduce SGD. While this approach is bandwidth optimal, communication latency is still proportional to the number of workers, and the synchronization barrier can become a bottleneck. The total communication overhead is also proportional to the number of mini-batches and orders of magnitude higher than BSP, e.g., 9,000x in Table 2.

The above amendments are purely in the conceptual exposition and do not affect any technical findings, empirical results, or conclusions in the paper.