Fine-tuning Computational Info LLMs for Drug-Drug Interaction Prediction

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1 GPT-4o Fine-tuning

Regarding the computational aspects, GPT-40 fine-tuning was performed via OpenAI API at a cost of approximately \$20.68 for 1,000 training examples over 3 epochs, totaling 827,007 trained tokens and lasting 1 hour and 2 minutes.

2 Fine-tuning of Open-weight LLMs

Table 1 details the computational resources required for each open-weight model. Phase 1 average time per trial represents the mean duration across all 1,000 trials including pruned trials. Phase 2 average time per trial represents the mean duration of full runs without pruning. Total time includes both phases plus intermediate processing.

During Phase 1, the Successive HalvingPruner eliminated approximately 97–99% of trials before completion, yielding substantial compute savings. The pruner typically discarded unpromising configurations after 1–2 evaluations (iterations 5–10). On Phi-3.5 2.7B (≈ 500 –700 tokens/s on our machine), each pruned trial took about 1 to 2 minutes of wall time, including validation. When we examined larger models like Gemma2 9B, which ran about 3 to 5 times slower, the time increased to roughly 4 to 8 minutes per pruned trial. Phase-2 throughput depended on model size. On models with 1.5–2.7 billion parameters, we observed about 1.5–3 trials/hour, while on models with 9 billion parameters, we observed about 0.4–0.8 trials/hour. The validation loss typically plateaued within the first 100–200 iterations; the remaining iterations confirmed stability and served as a guard against premature selection.

Table 1: Computational Resources per Model during the Optuna optimization process. Avg Time represents the average time per trial.

Model	Phase 1			Phase 2			Total	
	Trials	Avg Time	Dur.	Trials	Avg Time	Dur.	Time	Peak Mem.
DeepSeek R1 1.5B	1,000	1.2 min	20 hrs	12	15 min	3 hrs	23 hrs	35 GB
Phi-3.5 2.7B	1,000	1.8 min	30 hrs	10	95 min	16 hrs	46 hrs	$42~\mathrm{GB}$
Qwen2.5 3B	1,000	1.9 min	32 hrs	11	85 min	15.5 hrs	47.5 hrs	44 GB
Gemma2 9B	1,000	$4.2 \min$	70 hrs	9	$110 \min$	$16.5~\mathrm{hrs}$	86.5 hrs	78 GB