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Knowledge-Enhanced Machine Learning



Analytic Computing

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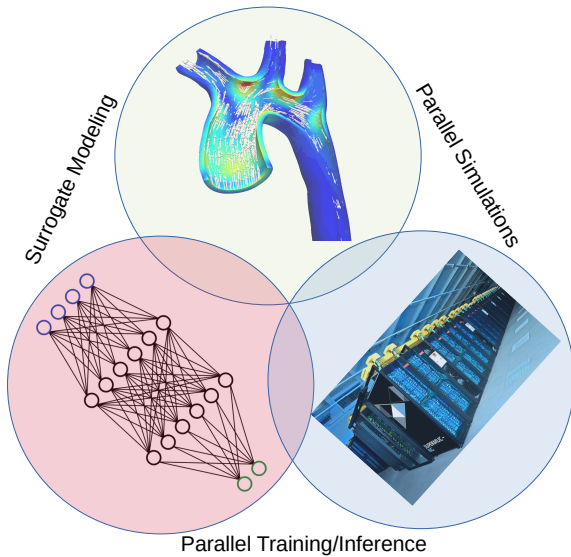
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Causal Inference and Discovery, Knowledge Graphs

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Previous researches



Deep Learning's
DIMINISHING RETURNS

The cost of improvement is becoming unsustainable

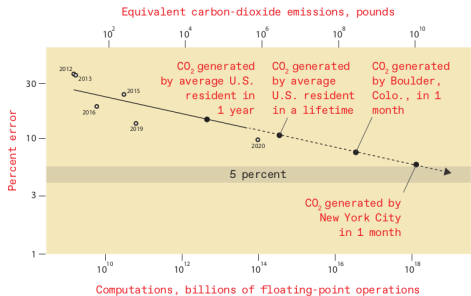
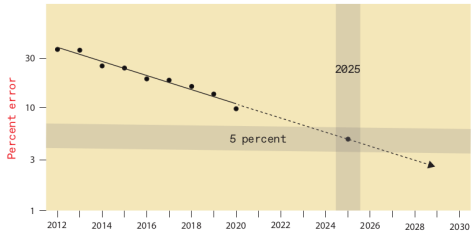
DEEP LEARNING IS NOW being used to translate between languages, predict how proteins fold, analyze medical scans, and play games as complex as Go, to name just a few applications of a technique that is now becoming pervasive. Success in those and other realms has brought this machine-learning technique from obscurity in the early 2000s to dominance today. • Although deep learning's rise to

BY NEIL C. THOMPSON, KRISTJAN GREENEWALD, KEEHEON LEE & GABRIEL F. MANSO

THE GREAT AI RECKONING

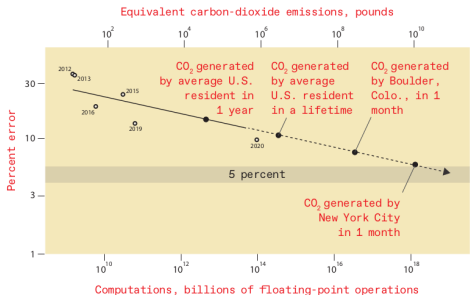
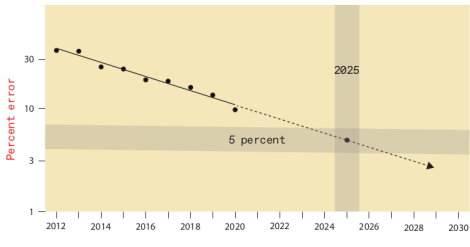
Training cost is becoming too high!

- Improve by factor of k
 - k^2 more data
 - k^4 more computation (k^9 in practice)



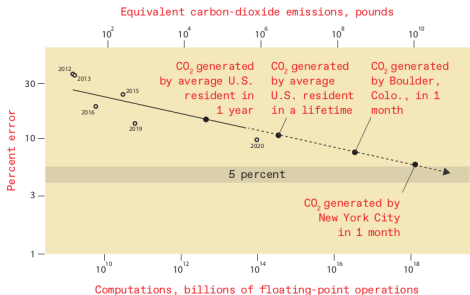
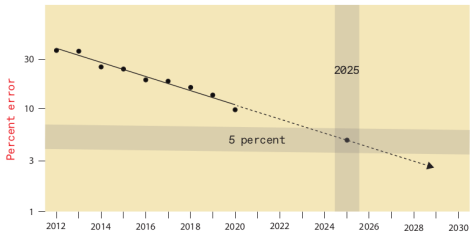
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→ k^4 more computation
(k^9 in practice)
- 95% accuracy costs \$100 billion.
- Re-training is being avoided due to high cost.



What are the possible solutions?

Hardware optimization:
1-GPUs, FPGAs, TPUs
2-Quantum computing?

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Enjoy the kick-off event!