

More data speeds up training time learning halfspaces over sparse vectors

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Big data alchemy - turning data into a computational resource?

Data is nowadays abundant. Sometimes, far more than what is needed.



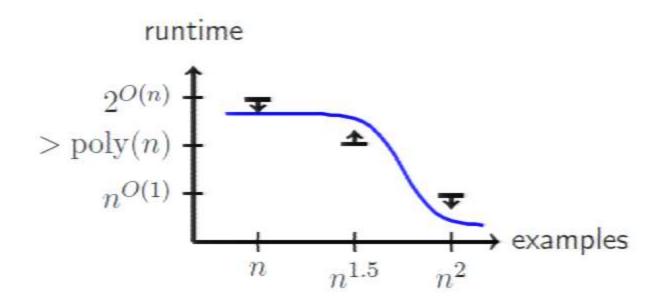
Are there learning tasks in which data, beyond the information barrier, can provably be leveraged to speed up computation?

First positive answer for a natural classification problem!

• Consider learning halfspaces over vectors with ≤ 3 non-zero coordinates.

Theorem (Main – informal)

- Information theoretically, O(n) examples suffice for the task.
- Shifting from n to n^2 examples, runtime drops from $\exp(n)$ to $\operatorname{poly}(n)$!



A new technique to lower bound improper learning!

- New (non cryptographic!) method to lower bound improper learning.
- In an upcoming paper (now on arXiv!), it is used to lower bound:
 - Learning DNFs!.
 - Approximately learning halfspaces.
 - Learning interesection of $\omega(1)$ halfspaces.
 - And more...

