

CS294:  
Scheduling Deep Learning Workloads

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# What is the problem?

You have a bunch of training jobs sharing the cluster

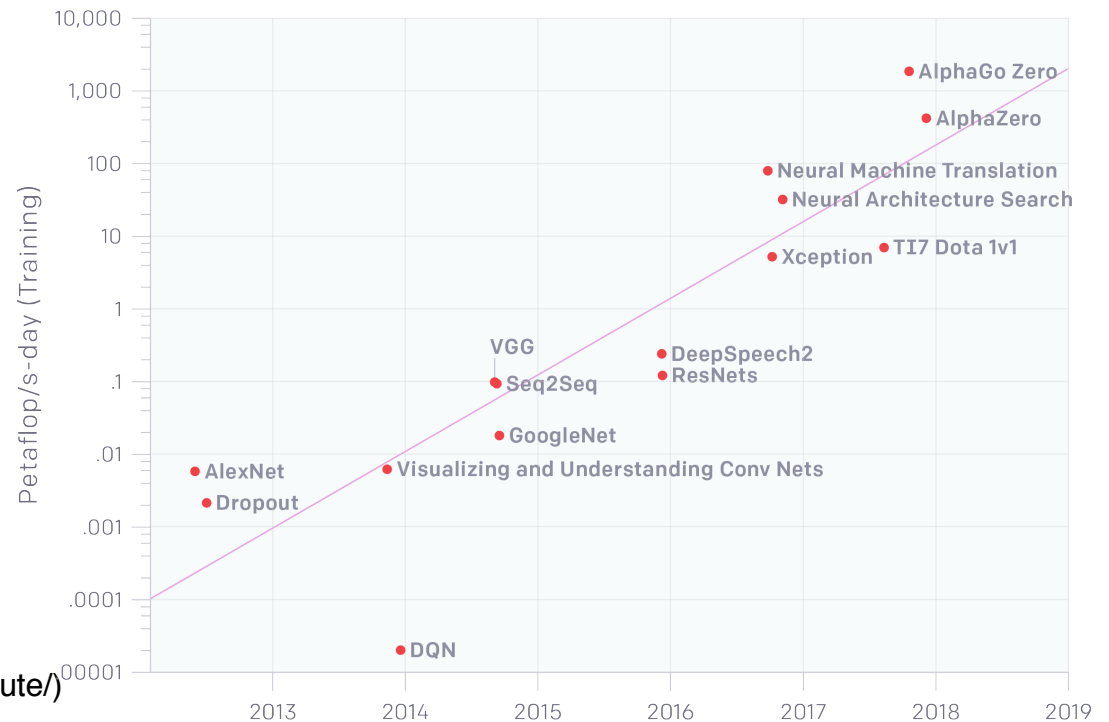
You want to optimize for a scheduling metric:

- Makespan / average completion time
- Throughput
- Fairness
- A combination of the above

# Why care about this?

Training a single model very expensive

AlexNet to AlphaGo Zero: A 300,000x Increase in Compute



AI and Compute (<https://blog.openai.com/ai-and-compute/>)

# Why care about this?

Training a single model very expensive

Models brittle so might want to train multiple times

And, we want to do hyperparameter search!

- Network architecture design
- AutoML
- ...

# Minimize job average completion time

For one processor: shortest job first is optimal

For parallel systems is an approximation but need to bin the jobs carefully

Assumption: you need to know completion time

- Otherwise need to predict it
- Complex because it can depend on parallelism, time when you get a particular resource, etc

# Maximize throughput

This is what cluster operators want!

- Justify their investment

It can be gamed!

Need to be careful about how we pack jobs

- Can lead to starvation

# Fairness

A trip in the history lane...

- see Dominant Resource Fairness (DRF) presentation