$L(y,\hat{y})$ 

Feature maps reused in backpropagation

AlexNet VGG-16 VGG-16 VGG-216

Bottleneck: intermediate result storage

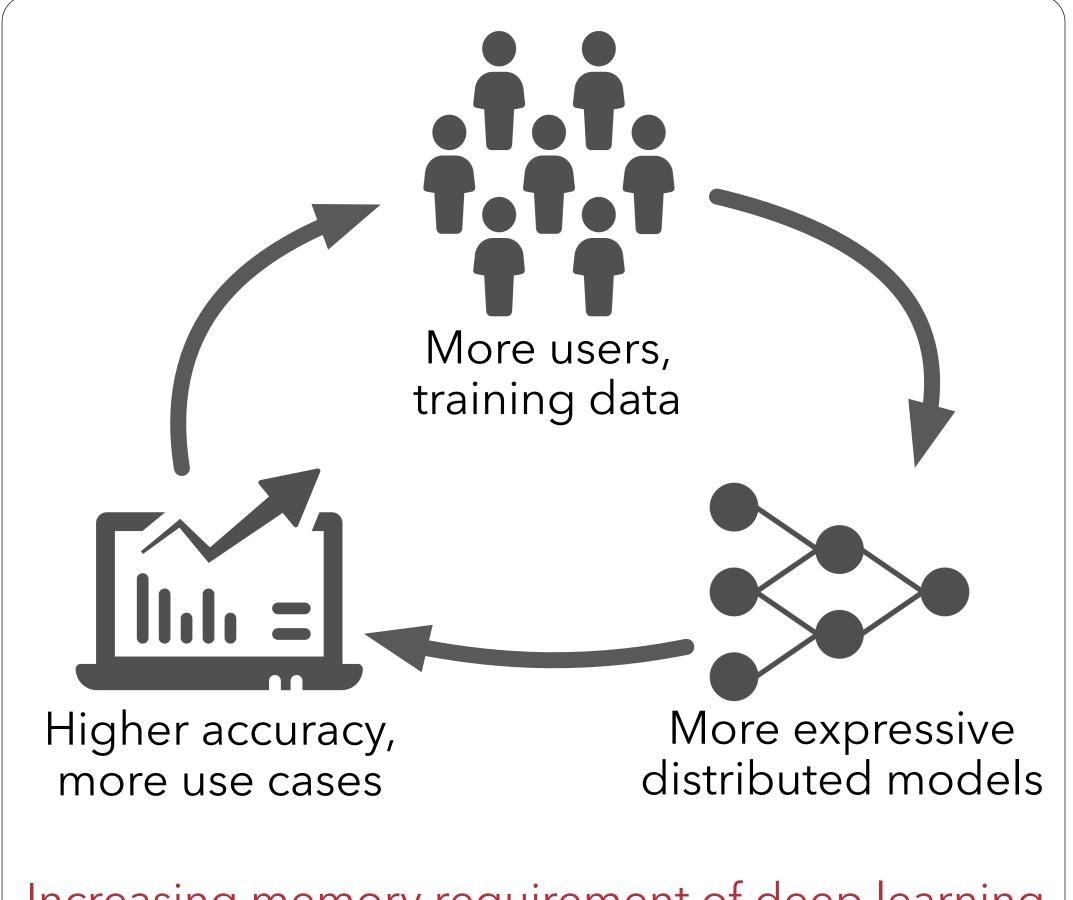
(256)



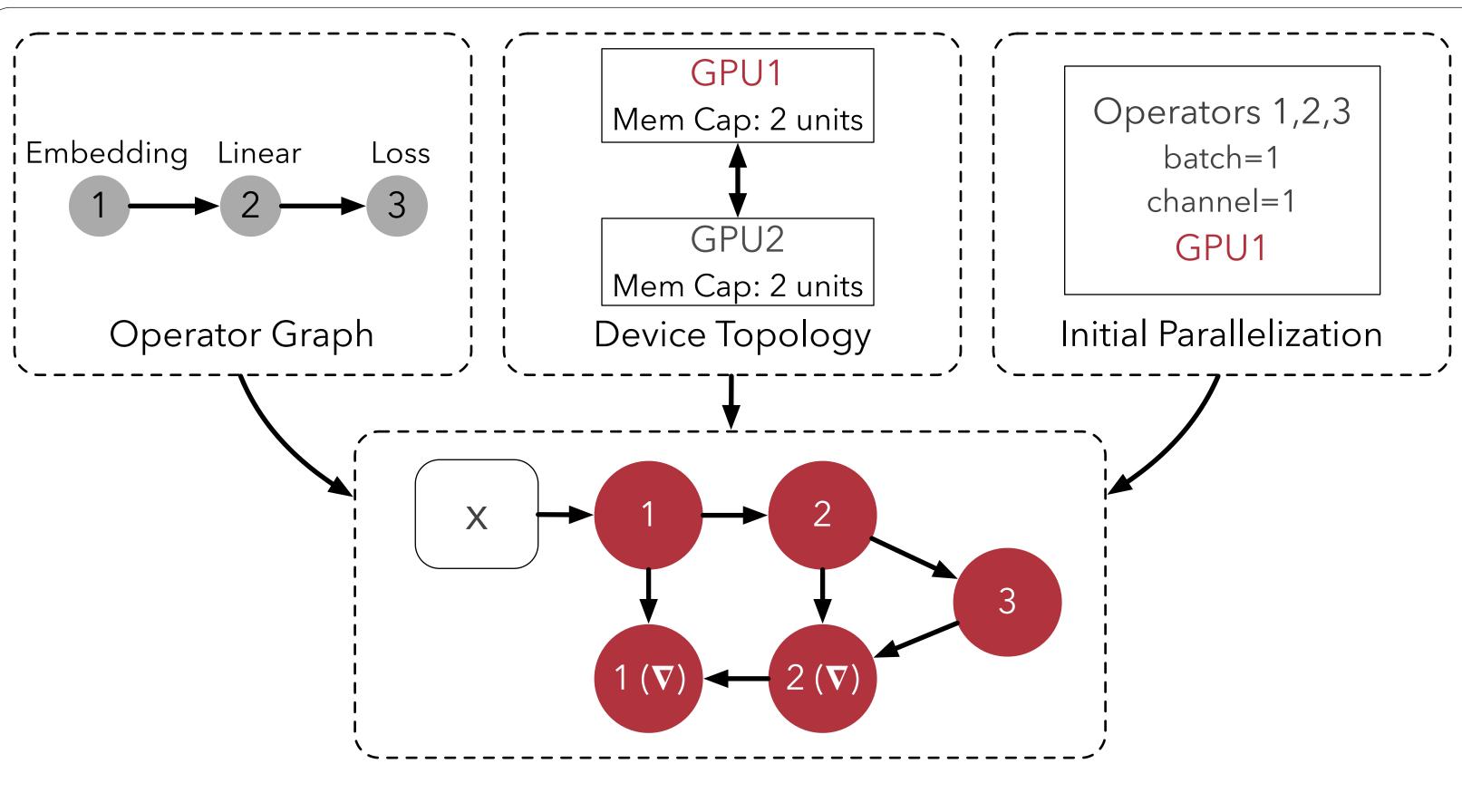
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Single device

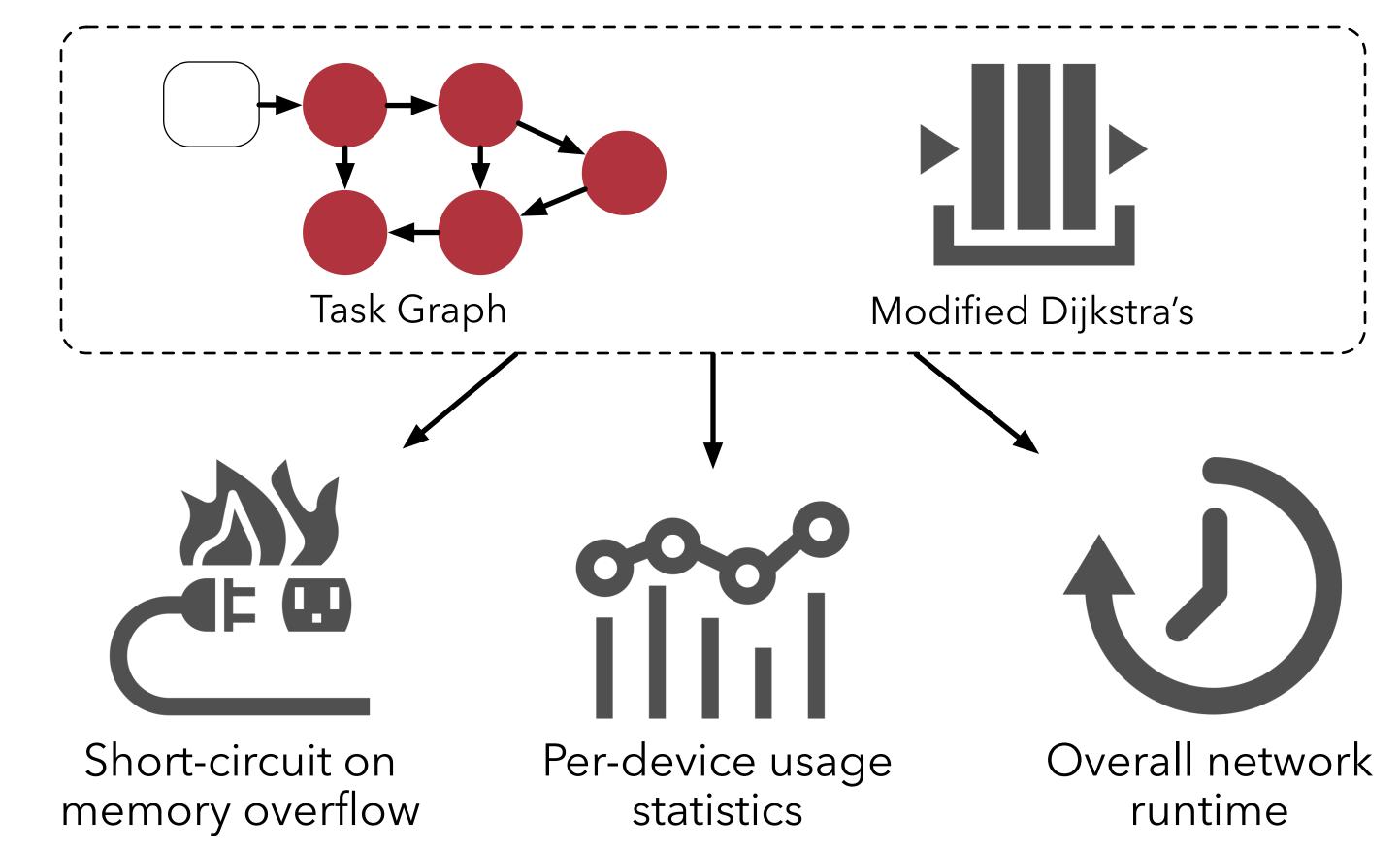
Problem: no general memory-aware framework



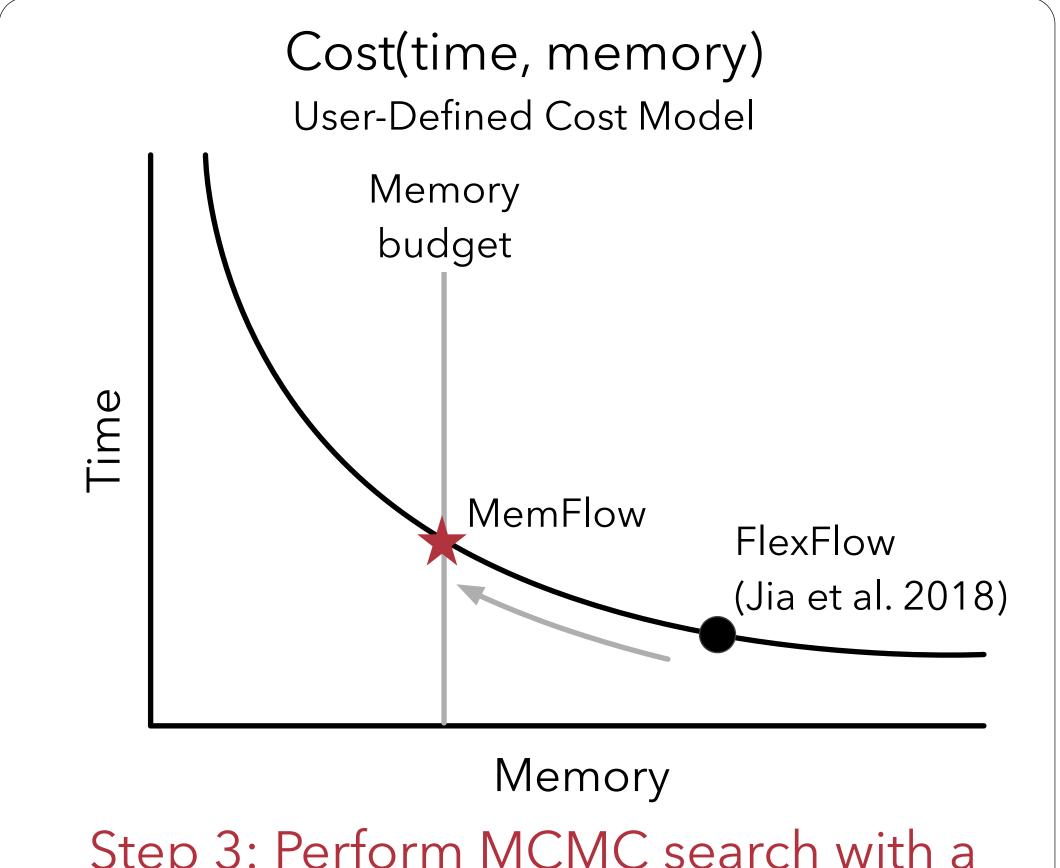
Increasing memory requirement of deep learning



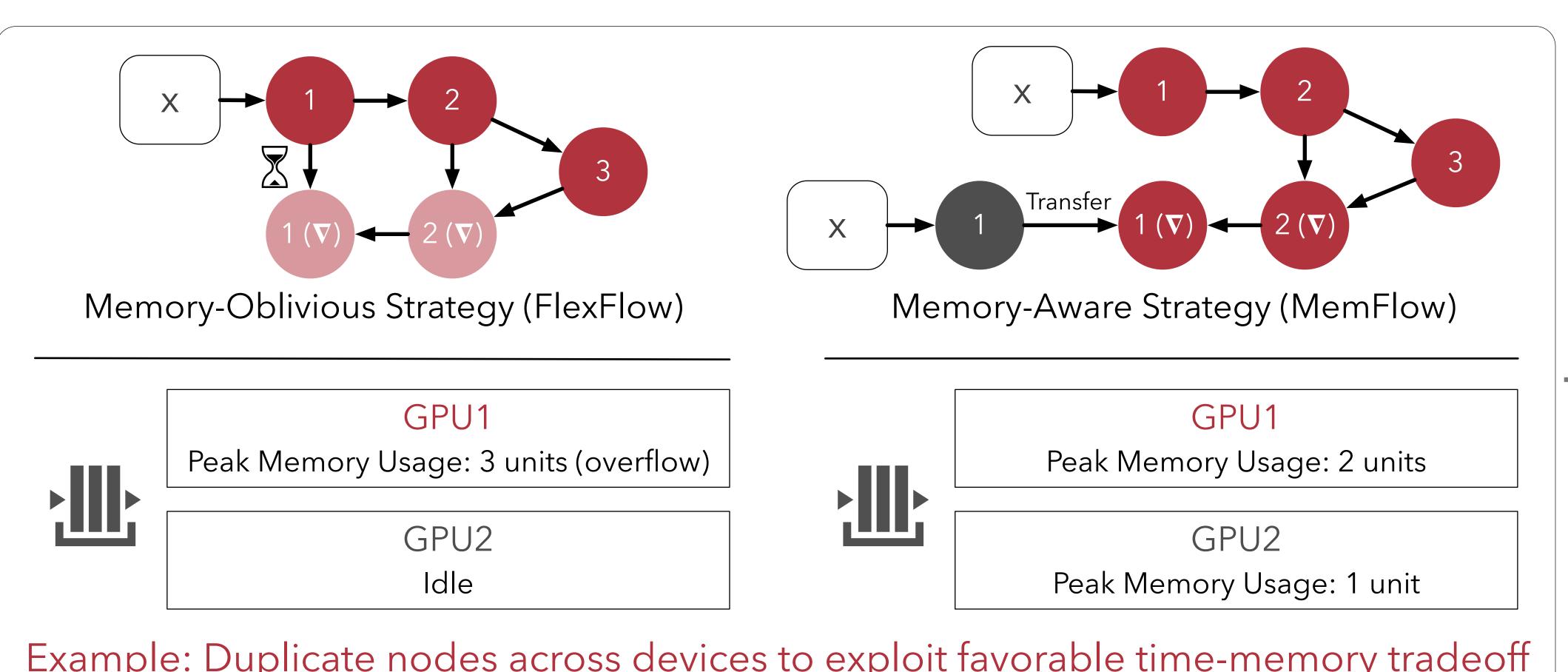
Step 1: Construct a task graph given a deep learning model and hardware



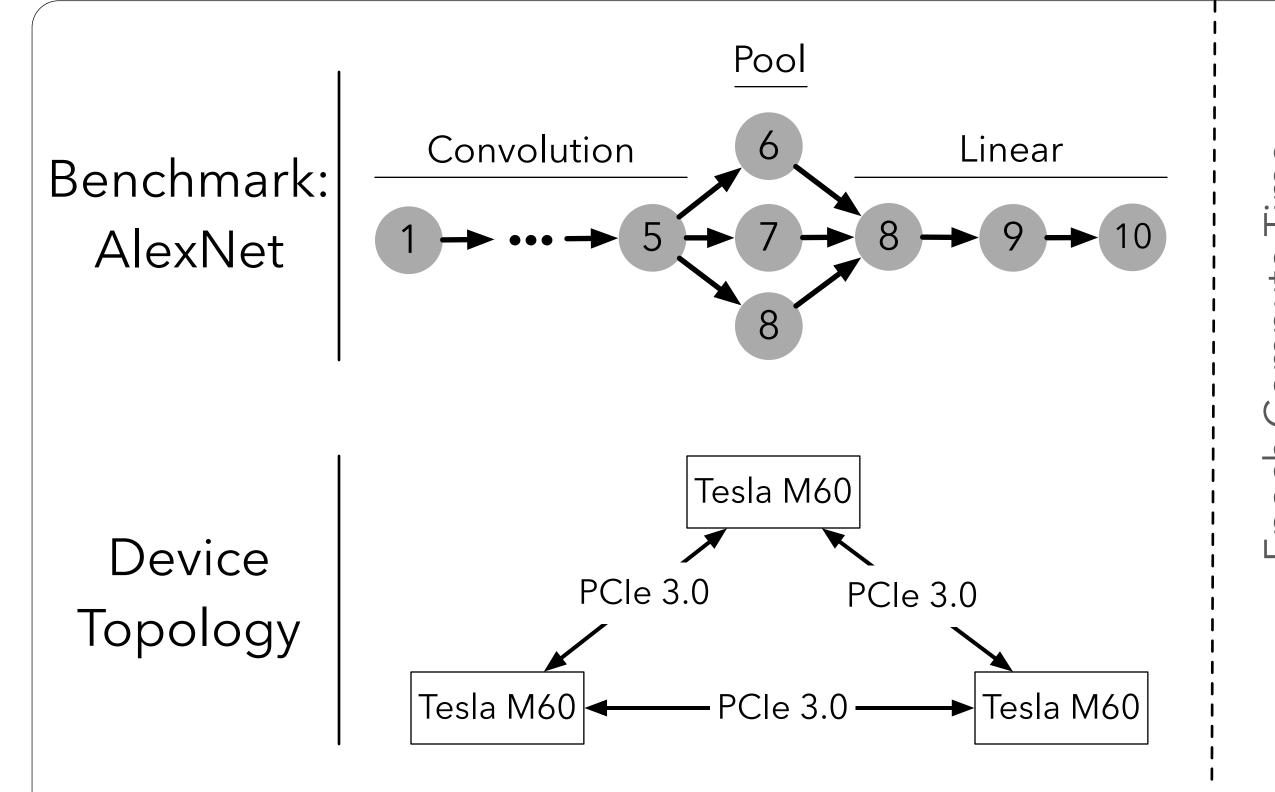
Step 2: Evaluate the task graph using a memory-aware simulator

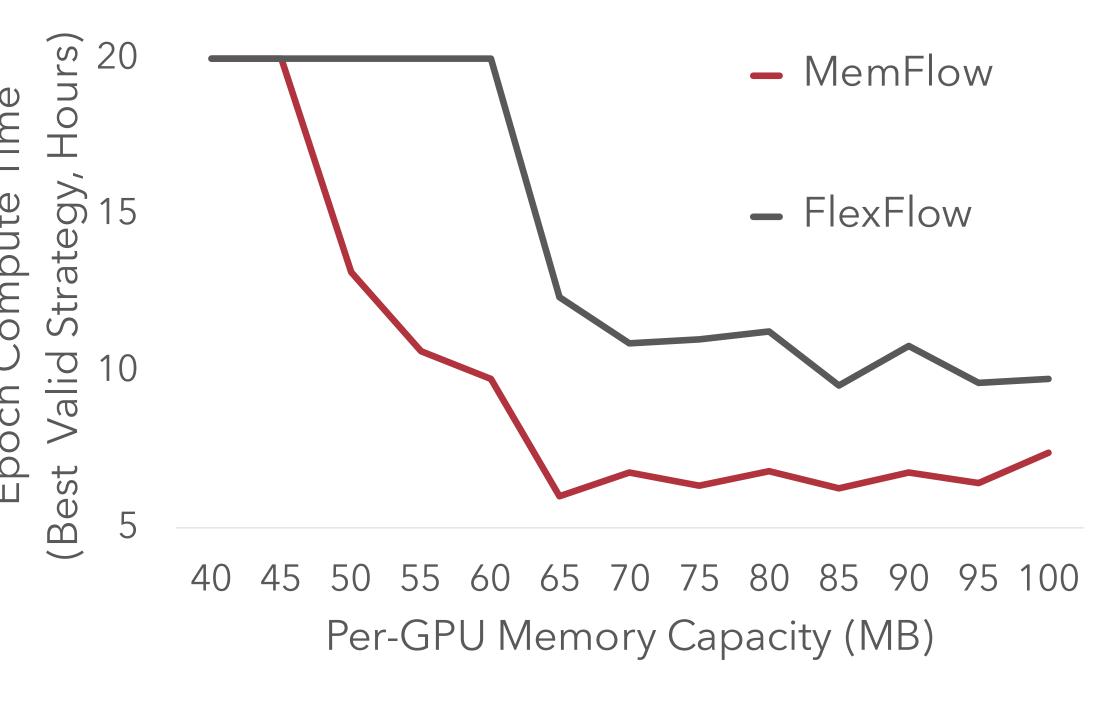


Step 3: Perform MCMC search with a user-defined cost model

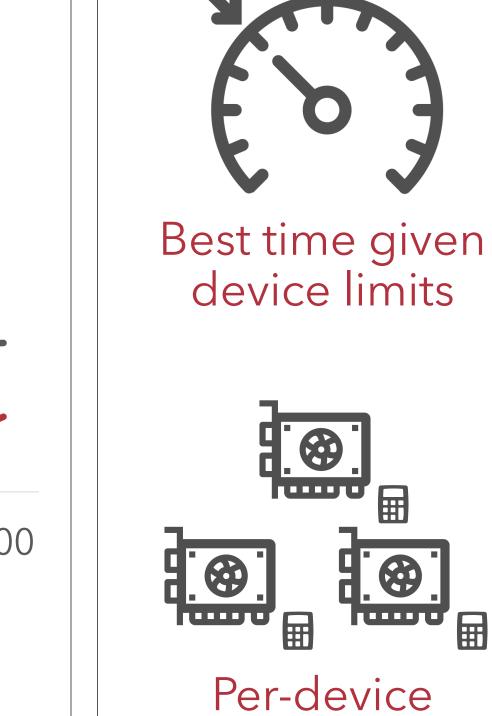


Example: Duplicate nodes across devices to exploit favorable time-memory tradeoff
Use GPU2 space to avoid cold storage of Task 1 intermediate result on GPU1

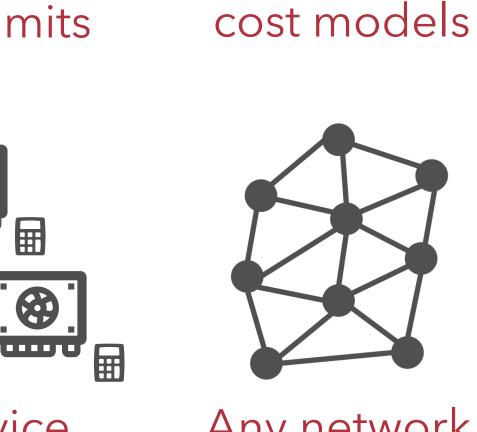




MemFlow locates valid and superior parallelization strategies for a wide range of memory limits



load estimates



Any network, any devices

Arbitrary

E N M