# A Framework for Memory Oversubscription Management in Graphics Processing Units

Chen Li, Rachata Ausavarungnirun, Christopher J. Rossbach, Youtao Zhang, Onur Mutlu, Yang Guo, Jun Yang





The University of Texas at Austin

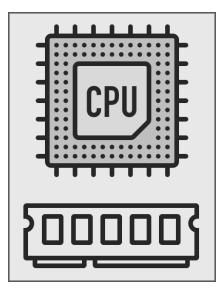


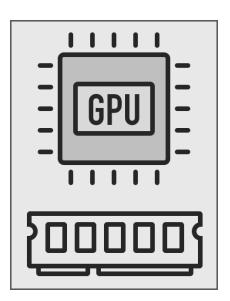




## Problem

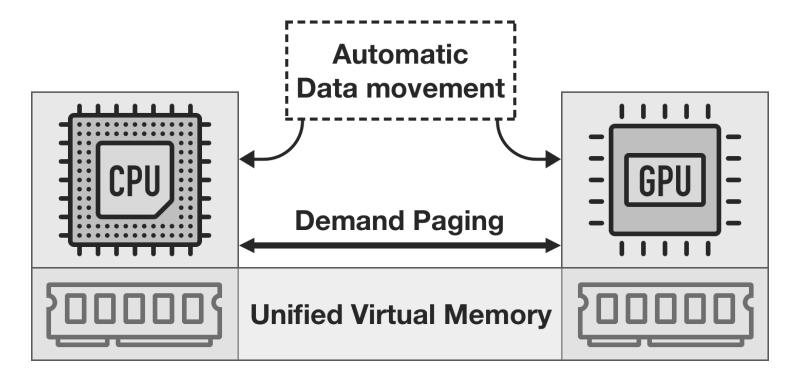
 Limited memory capacity becomes a first-order design and performance bottleneck





## Problem

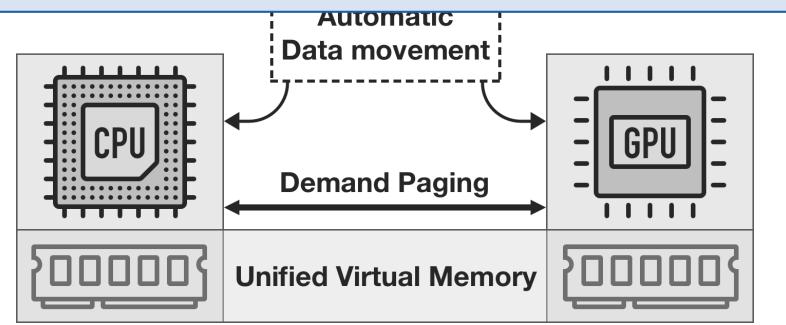
- Limited memory capacity becomes a first-order design and performance bottleneck
- Unified virtual memory and demand paging enable memory oversubscription support



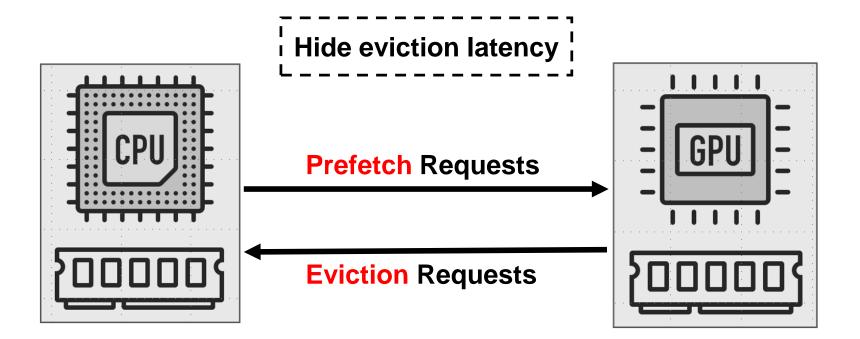
## Problem

• Limited memory capacity becomes a first-order design and

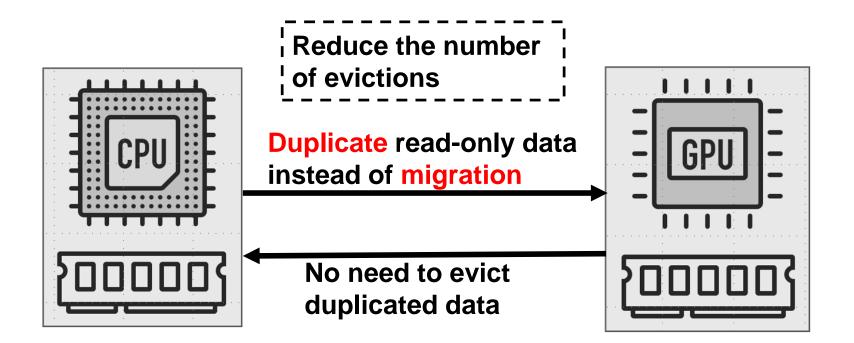
Memory oversubscription causes GPU performance degradation or, in several cases, crash



- Prior Hand-tuning Technique 1:
  - Overlap prefetch with eviction requests



- Prior Hand-tuning Technique 2:
  - Duplicate read-only data



- Prior Hand-tuning Techniques:
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  - Duplicate read-only data
  - Manually managing data movement
  - **×** No visibility into other VMs in cloud environment

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# **Application-transparent** mechanisms are urgently needed

• Application-transparent Framework

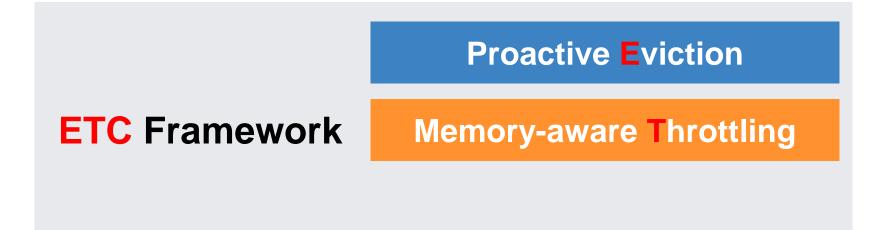
#### **ETC** Framework

• Application-transparent Framework

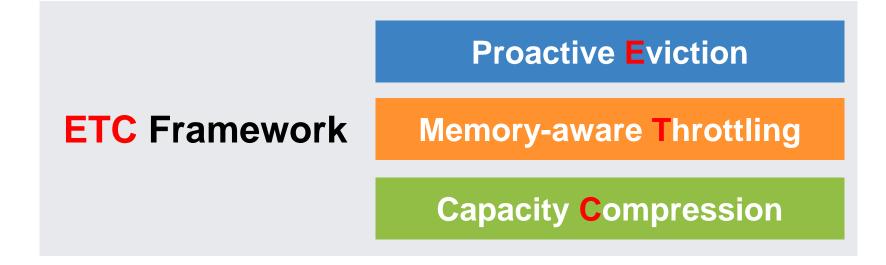
#### **Proactive Eviction**

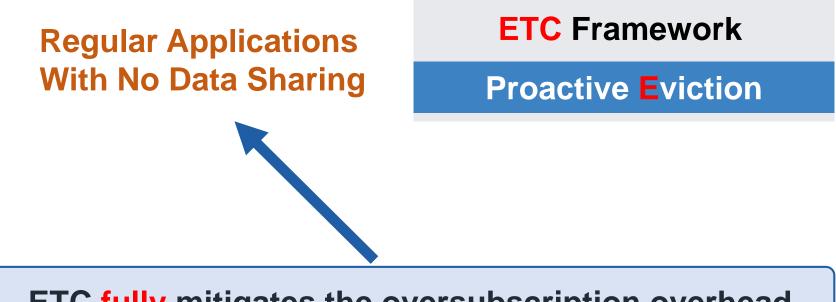
#### **ETC** Framework

• Application-transparent Framework



• Application-transparent Framework





#### ETC fully mitigates the oversubscription overhead

**Regular Applications With No Data Sharing**  **ETC Framework** 

**Proactive Eviction** 

Regular Applications With Data Sharing **ETC** Framework

**Proactive Eviction** 

**Capacity Compression** 

ETC improves the performance by 60.4%

Regular Applications With No Data Sharing



**Proactive Eviction** 

**ETC Framework** 

Regular Applications With Data Sharing **Proactive Eviction** 

ETC improves the performance by 270%

Irregular Applications

**ETC** Framework

**Memory-aware Throttling** 

**Capacity Compression** 

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