



#### MemLiner: Lining Up Tracing and Application for a Far-Memory-Friendly Runtime

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#### **Memory Capacity Bottleneck in Datacenters**





Growing imbalance between processor computation and memory capacity

Memory underutilization in datacenters



#### **Far-Memory System**





#### **High-level Languages**



Applications written in highlevel languages are dominant in datacenter workloads.







#### **Garbage Collection**



Tracing is done <u>concurrently</u> with applications

Local Mem Ratio	25%	13%
Slowdown	2.6x	3.4x



#### **Resource Competition**





#### **Ineffective Prefetching**

#### **Without Concurrent Tracing**







#### Can we disable concurrent tracing?





With Concurrent

Tracing

# Are application and garbage collection completely unrelated?





#### **1** Application and GC are just temporally unaligned

#### 2 Changing object access order in GC is possible



## Key Design Idea



(a) Current runtime

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(b) MemLiner runtime

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#### **Object Classification**

- 1. Local Objects: Currently being accessed by application threads
  - GC threads should touch
- 2. Incoming Objects: In remote memory, will soon be accessed by app threads
  - GC threads should touch
- 3. Distant Objects: In remote memory, will <u>not</u> be accessed by app threads soon
  - GC threads should <u>delay</u> the access



## **Challenges in Classifying Objects**





#### **Barriers**

**Pre-read Barrier** 

**Read Operation** 

$$a = b.f$$
 or  $a = b[i]$   
*Post-read Barrier*

Write Operation

Pre-write Barrier  

$$b.f = a$$
 Or  $b[i] = a$   
Post-write Barrier



#### **Local Objects**

$$a = \mathbf{b}.f$$
$$\mathbf{b}.f = a$$





#### **Incoming Objects**





In remote memory, used by app soon



#### **Distant Objects**



$$Diff( \begin{bmatrix} Current \\ Epoch \end{bmatrix}, \begin{bmatrix} Timestamp \\ (4 \text{ bits}) \end{bmatrix} < \delta$$



#### **Benchmarks**

- MemLiner is implemented in two widely-used garbage collectors:
  - G1 GC
  - Shenandoah GC
- Evaluated MemLiner on *12 workloads* using a range of local memory ratios
- MemLiner is run on two swap systems: Fastswap and Leap



#### **Results: Throughput**



Shenandoah GC



## **Results: Prefetching Effectiveness**

- An average of 1.6x speed up under 25% local memory on Leap
- Reduces 58% of on-demand swap-ins, and 53% of total swap-ins on average.

#### Prefetching Accuracy and Coverage





## **Key Takeaways**



- Runtime should also be taken into consideration when hardware changes
- Runtime serves as a semantic bridge between application and underlying OS/hardware architecture



Thank you! Code at https://github.com/uclasystem/MemLiner.



# Q&A

