Eden: Developer-friendly Application-integrated Far Memory

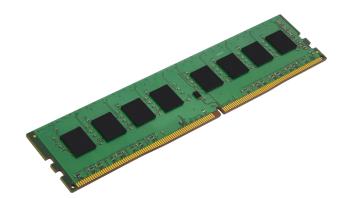
Anil Yelam, Stewart Grant, Saarth Deshpande, Nadav Amit, Radhika Niranjan Mysore, Amy Ousterhout, Marcos K. Aguilera, Alex C. Snoeren

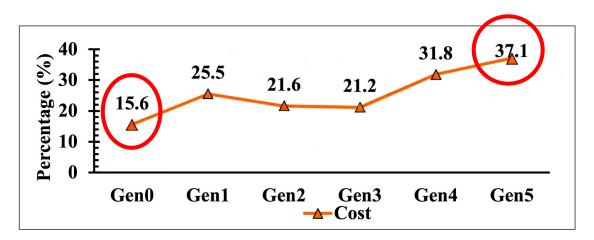




Rising DRAM cost in data centers

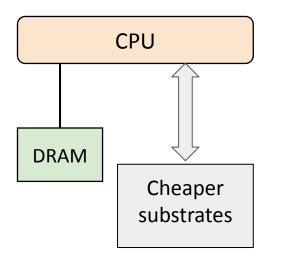
Reaching 40–50% of the server cost!



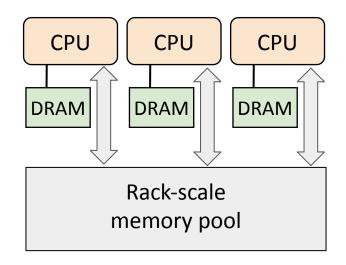


DRAM cost in Meta's data centers [Maruf et al. ASPLOS' 23]

Cost saving efforts



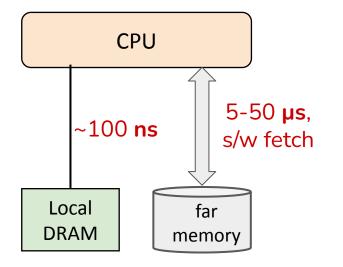
Google's Software-defined Far Memory **Meta's** Transparent Memory Offloading



Fastswap, LegoOS, AIFM, Kona

Far memory

A cost-effective but slower memory extension.

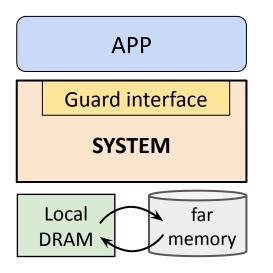


Compared to DRAM

- Slower
- Need guards

Far memory systems

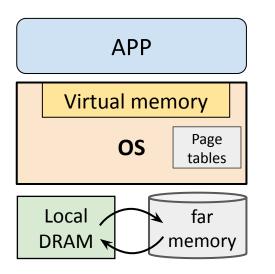
A cost-effective but slower memory extension.



| Compared to DRAM | Goal is to avoid: |
|--|---|
| SlowerNeed guards | \rightarrow Performance hit \rightarrow Application changes |

Hardware guards offer transparency

Use OS paging/hardware to support far memory.

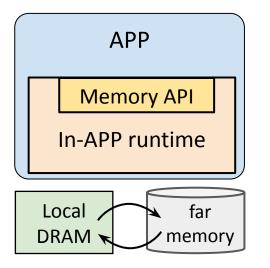






Software guards enable better performance

Use a custom API and annotate every access.



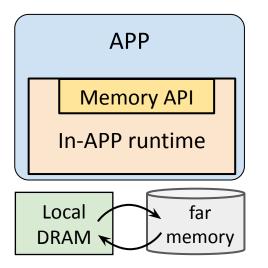




X Significant porting effort

Software guards enable better performance

Use a custom API and annotate every access.



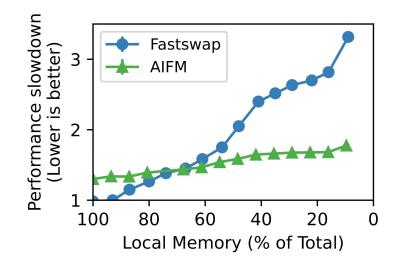
Performance



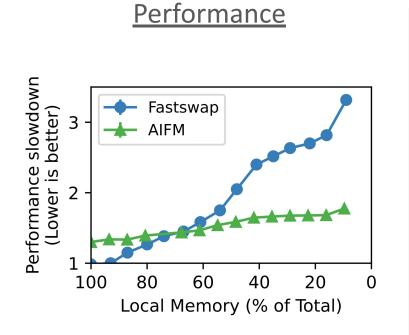


Example: Hardware vs Software guards

Performance



Example: Hardware vs Software guards



Code changes

Fastswap: 0

AIFM: >1000

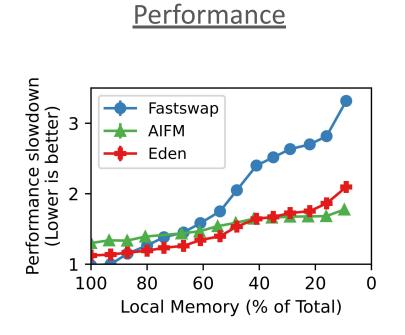
Example: Hardware vs Software guards

<u>Performance</u>

Code changes

Can we balance the performance benefits of software guards with the transparency of hardware guards?

Our answer is **Eden**

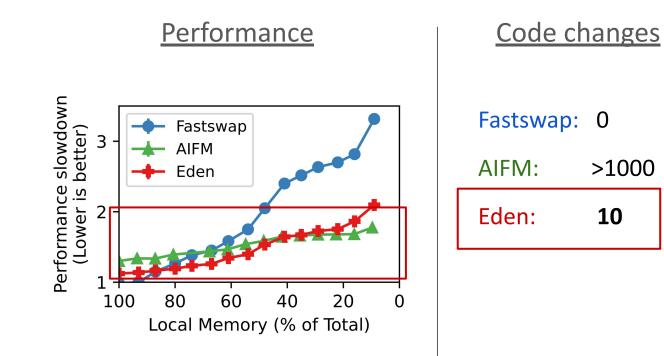


Code changes

Fastswap: 0

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Our answer is **Eden**

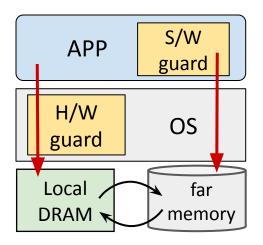


Eden supports both guards

Choice for each memory access.

- Hardware guards (default)
- Software guards (where beneficial)

Beneficial \rightarrow Only far memory accesses But that could be everywhere in the code?



How do applications access far memory?

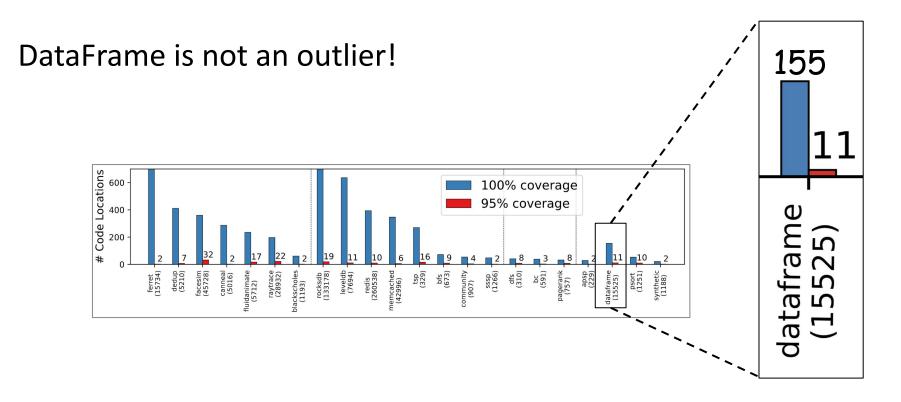
DataFrame example at 10% local memory.

Of **15000** total lines of code:

- Only $155 \rightarrow$ at least one far memory access
- Top 11 \rightarrow 95% of all accesses!

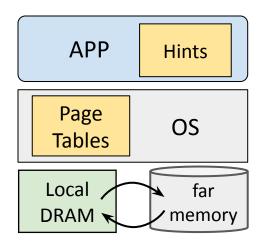
| | DataFrame |
|---|-----------|
| U | column |
| | vectors |
| | |

DataFrame library

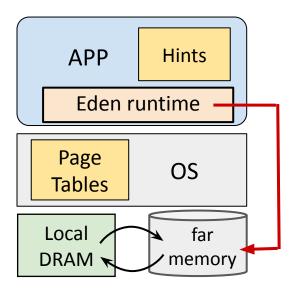


Max 32 code locations—12 at median—see 95% far memory accesses

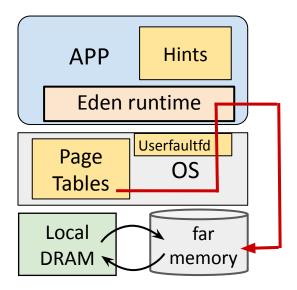
Software guards → Hints in code
 Hardware guards → Default



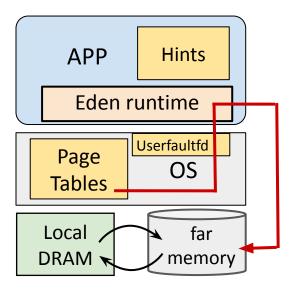
- Software guards → Hints in code
 Hardware guards → Default
- User-level runtime



- Software guards → Hints in code
 Hardware guards → Default
- User-level runtime
- Userfaultfd to keep hardware guards
 - Slower but rare



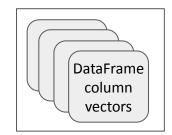
- Software guards → Hints in code
 Hardware guards → Default
- User-level runtime
- Userfaultfd to keep hardware guards
 Slower but rare
- Lightweight threads e.g., Shenango



Step 1: Eden points out top locations

e.g., Top **two** locations for DataFrame on Line 690.

| 687 | for (i = 0; i <; ++i) { |
|-----|-------------------------------------|
| 688 | ••• |
| 689 | |
| 690 | <pre>new_col[i] = vec[index];</pre> |
| 691 | |
| 692 | } |

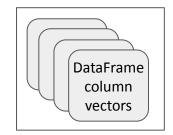


DataFrame library

Step 2: Add basic hints

Let Eden know what data to guard in software. Only for performance, not correctness!

| 687 | <pre>for (i = 0; i <; ++i) {</pre> |
|-----|---------------------------------------|
| 688 | |
| 689 | |
| 690 | hint(&new_col[i]); |
| 691 | <pre>hint(&vec[index]);</pre> |
| 692 | <pre>new_col[i] = vec[index];</pre> |
| 693 | |
| 694 | } |



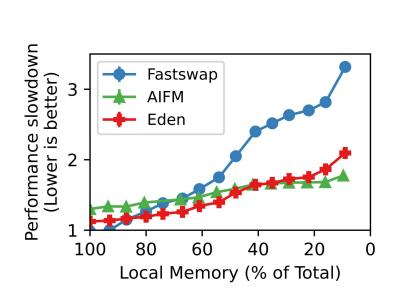
DataFrame library

Step 3: Pass additional info where helpful

DataFrame benefits from prefetching.

| 687 | <pre>for (i = 0; i <; ++i) {</pre> | DataFrame column vectors |
|-----|---|--------------------------------|
| 688 | ••• | DataFrame library |
| 689 | | |
| 690 | <pre>hint(&new_col[i], rdahead=True);</pre> | |
| 691 | <pre>hint(&vec[index], rdahead=True);</pre> | |
| 692 | <pre>new_col[i] = vec[index];</pre> | |
| 693 | | |
| 694 | } | |

Eden result for DataFrame



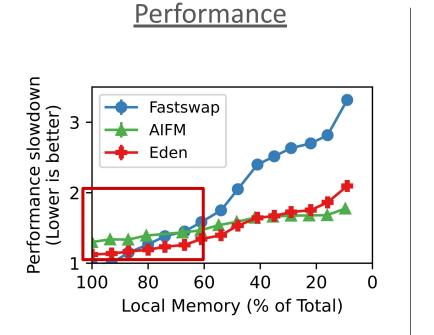
Performance

Code changes

Fastswap: 0

AIFM: >1000

More local accesses \rightarrow Exploit hardware guards



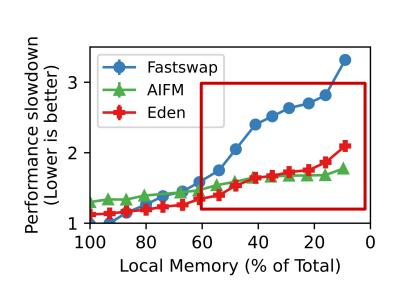
Code changes

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More far accesses \rightarrow Exploit software guards

Performance

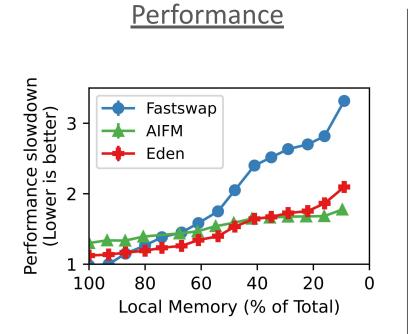


Code changes

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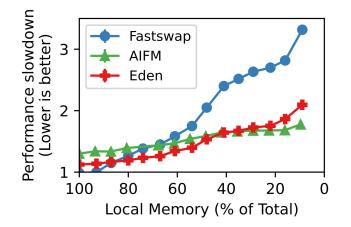
Deliberate use of software guards



| Fastswap: | 0 |
|-----------|-------|
| AIFM: | >1000 |
| Eden: | 10 |

Eden summary

- Applications only access far memory at very few code locations.
- Eden exploits this insight to **combine software and hardware guards**.
- Thus, Eden avoids hard bargain between performance and programmer effort.



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