Nexus: A New Approach to Replication in Distributed Shared Caches

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But replicating too aggressively leads to more cache misses

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- Prior adaptive techniques focus on which data to replicate at each core
 Data that is not replicated locally still incurs high latency
- Nexus instead focuses on how much to replicate across the system
 Chooses the best number of replicas for the whole read-only working set
 Lets cores access replicas beyond their local bank
 Outperforms a state-of-the-art replication technique by up to 90%

























Simple but large average distance















Cache replicated read-only lines locally and check the local bank first. Upon a miss in the local bank, check the directory (at line's original location).



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Replicating too aggressively causes more cache misses than no replication



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A is nearby, but B, C, D are still far away

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Threads **share** a read-only data **replica** within a core group cluster



All threads enjoy fast access to all read-only data by replicating beyond their local bank
An experiment to show why and when Nexus is better

A multithreaded workload that regularly scans over shared read-only data



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Previous replication techniques are ineffective when the readonly data does not fit in the local bank



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Data fits in the local bank

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Data placement is controlled using the virtual memory system and does not require a global directory





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Data can be dynamically mapped to nearby banks and shared by arbitrary cores









16 MB LLC capacity

Choosing how much to replicate is more important than choosing which lines to replicate









Too few replicas cause extra network traversals, while too many cause unnecessary cache misses

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Other directory-less D-NUCAs do not replicate data

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Apply different replication degrees for all read-only data



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Applications prefer different degrees, requiring an adaptive approach.



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Observation 1:

Applications prefer different degrees, requiring an adaptive approach.

Observation 2:

A few replication degrees suffice.



- Builds on top of **directory-less** D-NUCAs
 - Read-only data's on-chip location and coherence are tracked via the virtual memory system
 - Cores access and share closest replicas without directory overheads

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- Supports flexible replication degrees for all read-only data
- Leverages set-sampling to choose the best replication degree

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- Extends Jigsaw's configuration algorithm to select the best replication degree
- Outperforms Nexus-R in multi-program workloads

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Focus of this talk

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- Extends Jigsaw's configuration algorithm to select the best replication degree
- Outperforms Nexus-R in multi-program workloads
□ Nexus uses the virtual memory system to classify pages into three types.

Similar to R-NUCA, but differentiates all read-only data (not just instructions)



















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Shared read-only data: Replicated clusters



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Replication **degree of 4** → cluster with **size of 9**

- Replication **degree of 9 on 36 cores** →
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Enhances set-sampling to monitor the performance of different degrees

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Compares the cumulative access latency of each degree from sampled sets



Counters record the latency difference between degrees

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Counters record the latency difference between degrees

- Sampled sets spread across several banks
 - Threads share sampled sets if they share a read-only replica cluster



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For another thread in the system
Nexus-R takes coordinated decision across threads

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- Uncoordinated decisions work poorly
 - "Tragedy of the commons": Each thread wants itself to replicate more, but others to replicate less
- Nexus-R makes the whole process agree on the best replication degree by using per-process total latency for each degree
 - The OS reads latency counters periodically and sets the best degree for a process

Nexus-R adds small overheads over R-NUCA

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- Overheads of applying Nexus to R-NUCA:
 - **1.5%** of the LLC used for set-sampling
 - ~100 bits per core for hardware counters
 - 10s of instructions per context switch for the OS support

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Jigsaw manages capacity among applications and data types, outperforming many D-NUCA techniques

□ Jigsaw outperforms R-NUCA's simple heuristics with better data placement

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See the paper for implementation details

Evaluation

- Modeled system
 - 144 Silvermont-like OOO cores
 - 12x12 mesh
 - 32KB L11/D caches
 - 72MB LLC (0.5MB per core)



- Multithreaded workloads
 - Scientific workloads: SPECOMP2012, PARSEC, SPLASH2, BioParallel
 - Server workloads: TailBench [Kasture, IISWC'16]
 - With various input sizes

Evaluation

Compared 6 schemes

S-NUCA	No replication (baseline).
R-NUCA	Replicate instructions at a fixed degree.
Jigsaw	Allocate capacity across processes. No replication.
Locality-aware replication [Kurian, HPCA'14]	State-of-the-art directory-based D-NUCA. Selectively replicate cache lines in local bank.
Nexus-R	Nexus on R-NUCA.
Nexus-J	Nexus on Jigsaw.

□ Single-program workloads running with 144 threads











Workload mixes with 4 different apps running with 36 threads each

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□ Workload mixes with 4 different apps running with 36 threads each



Replication-sensitive → Nexus-R and Nexus-J are better

Workload mixes with 4 different apps running with 36 threads each



Workload mixes with 4 different apps running with 36 threads each



See paper for more results

Performance of 60 apps between Nexus-R and Locality-aware replication

Dynamic replication degree vs. static degrees

Result of 20 Multi-program workloads

□ Sensitivity study to

System sizes

Different cache hierarchies

Dynamic data reclassification

Conclusion

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Thanks! Questions?

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