



DFS: A Simple to Write Yet Difficult to Execute Benchmark

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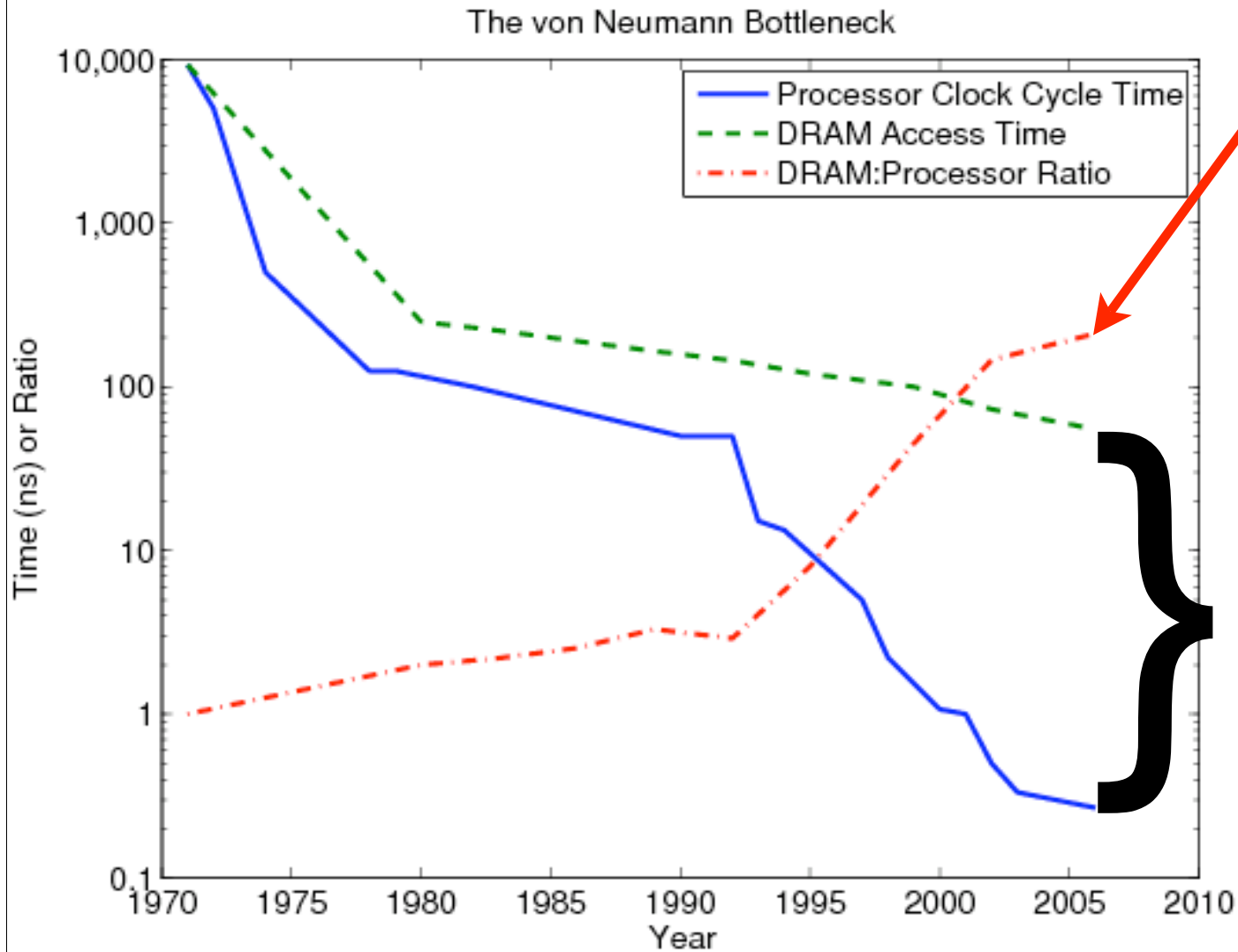
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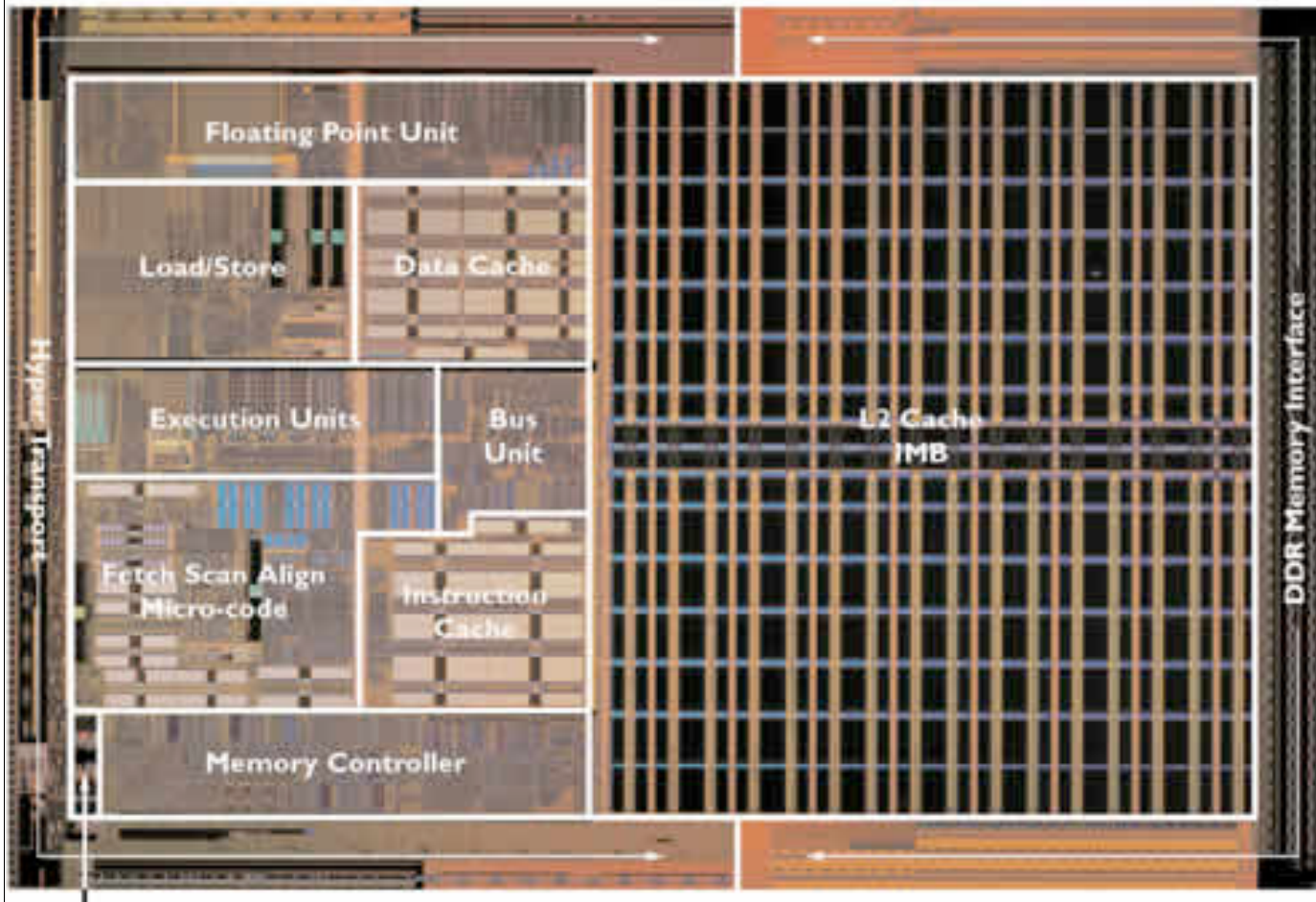
The von Neumann Bottleneck and the Demon Moore



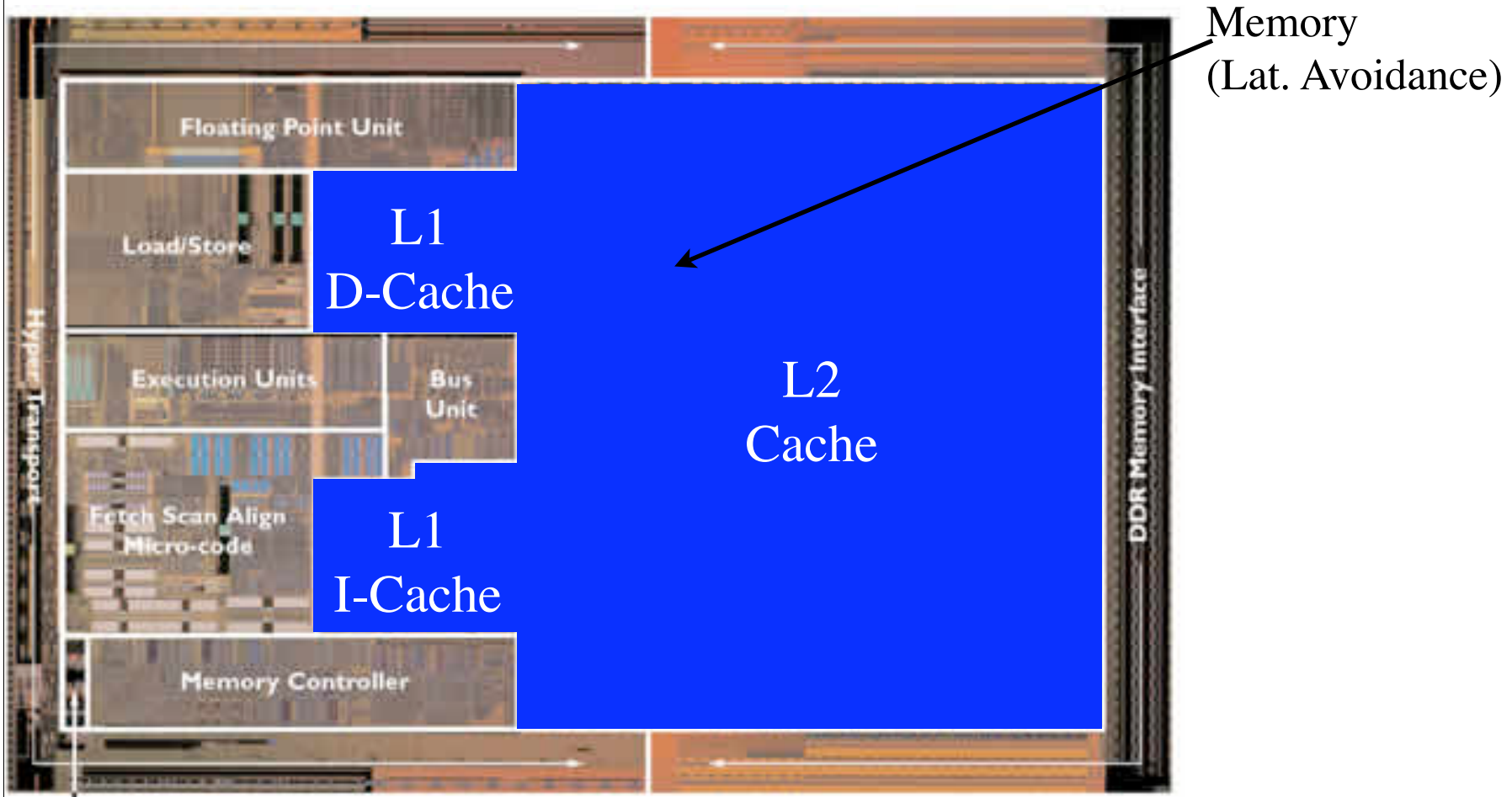
**200+ X
INCREASE
IN 30
YEARS!**

**Memory
Wall**

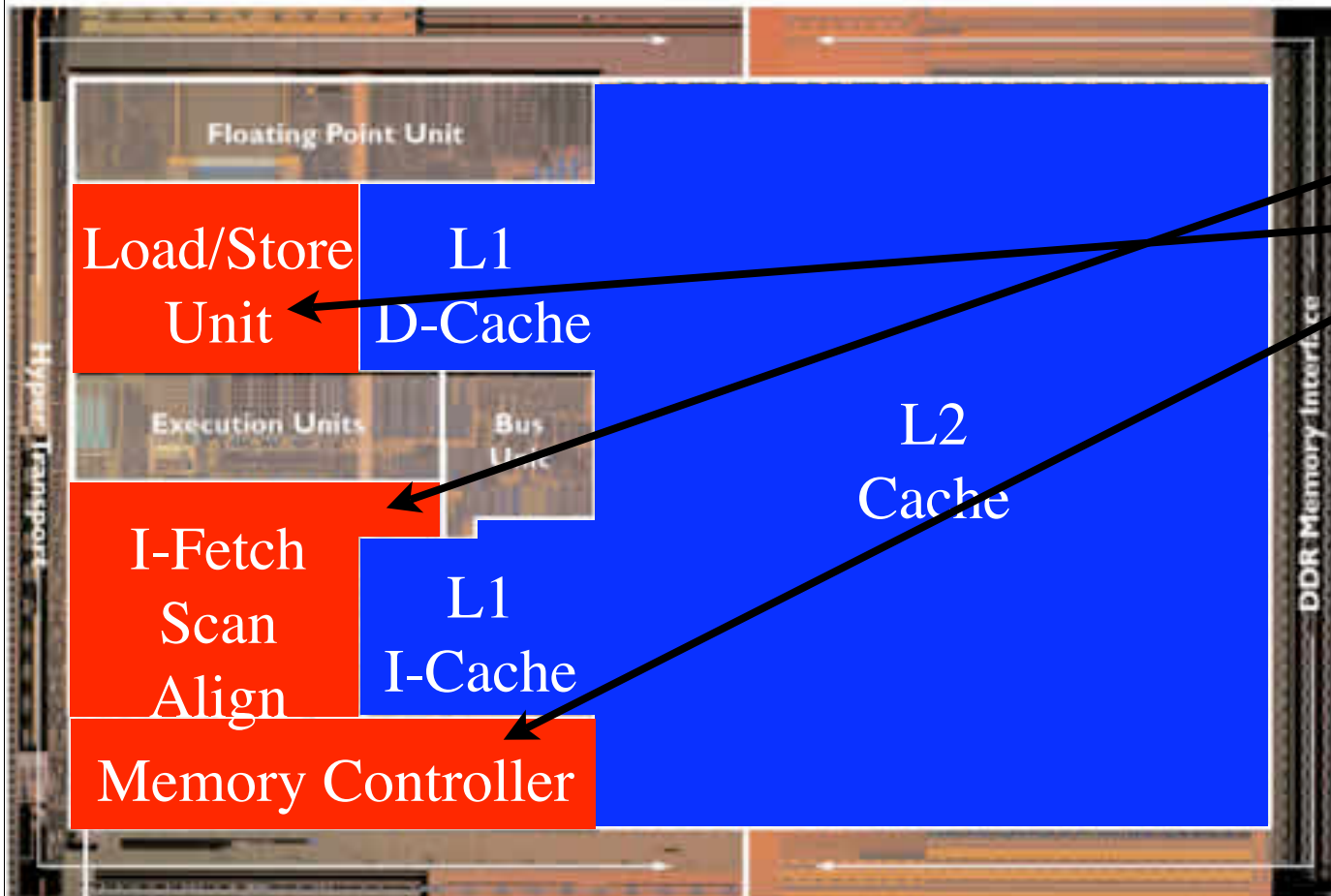
The Computer Architect's View of Memory



The Computer Architect's View of Memory



The Computer Architect's View of Memory



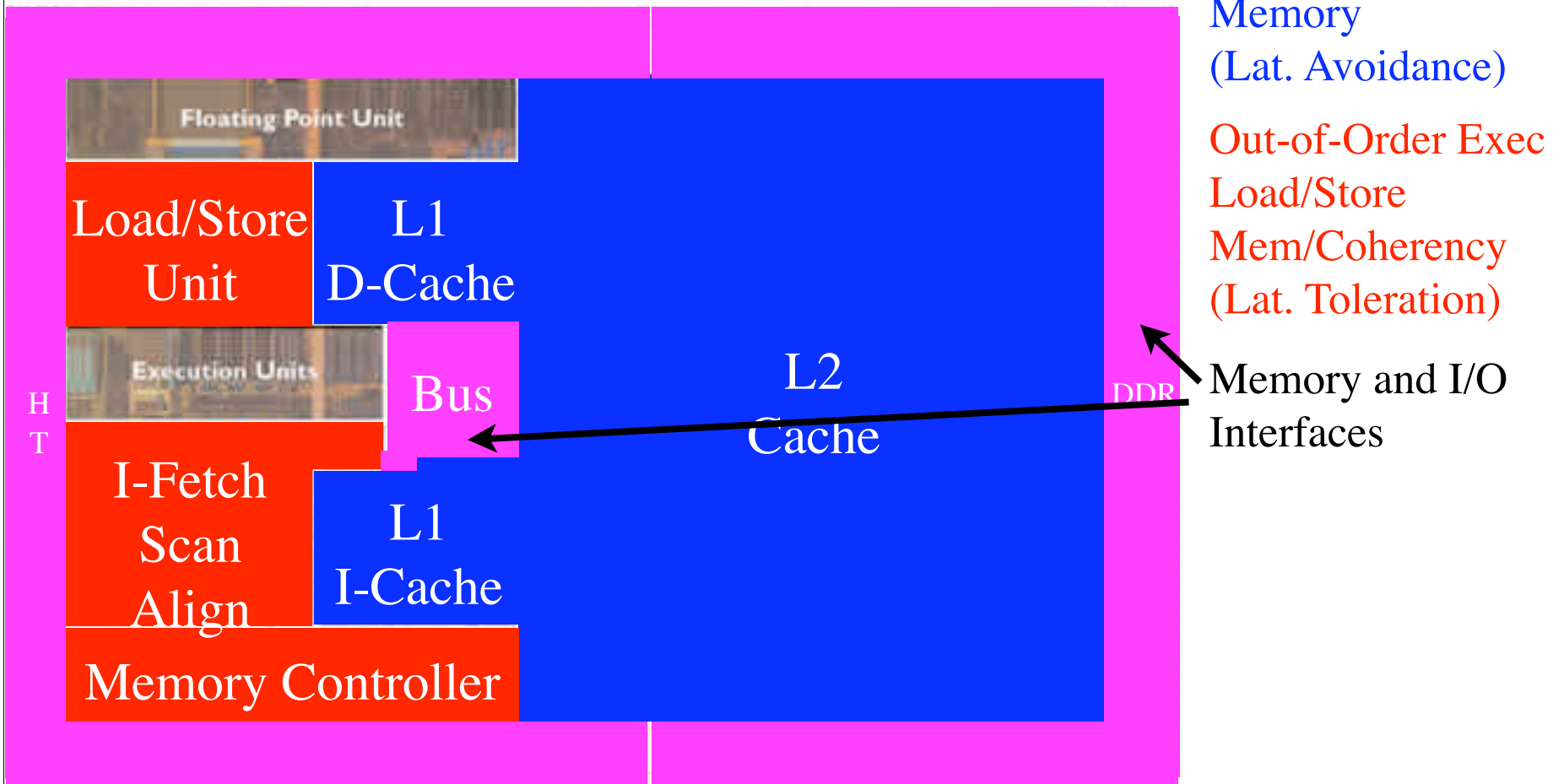
Memory
(Lat. Avoidance)

Out-of-Order Exec

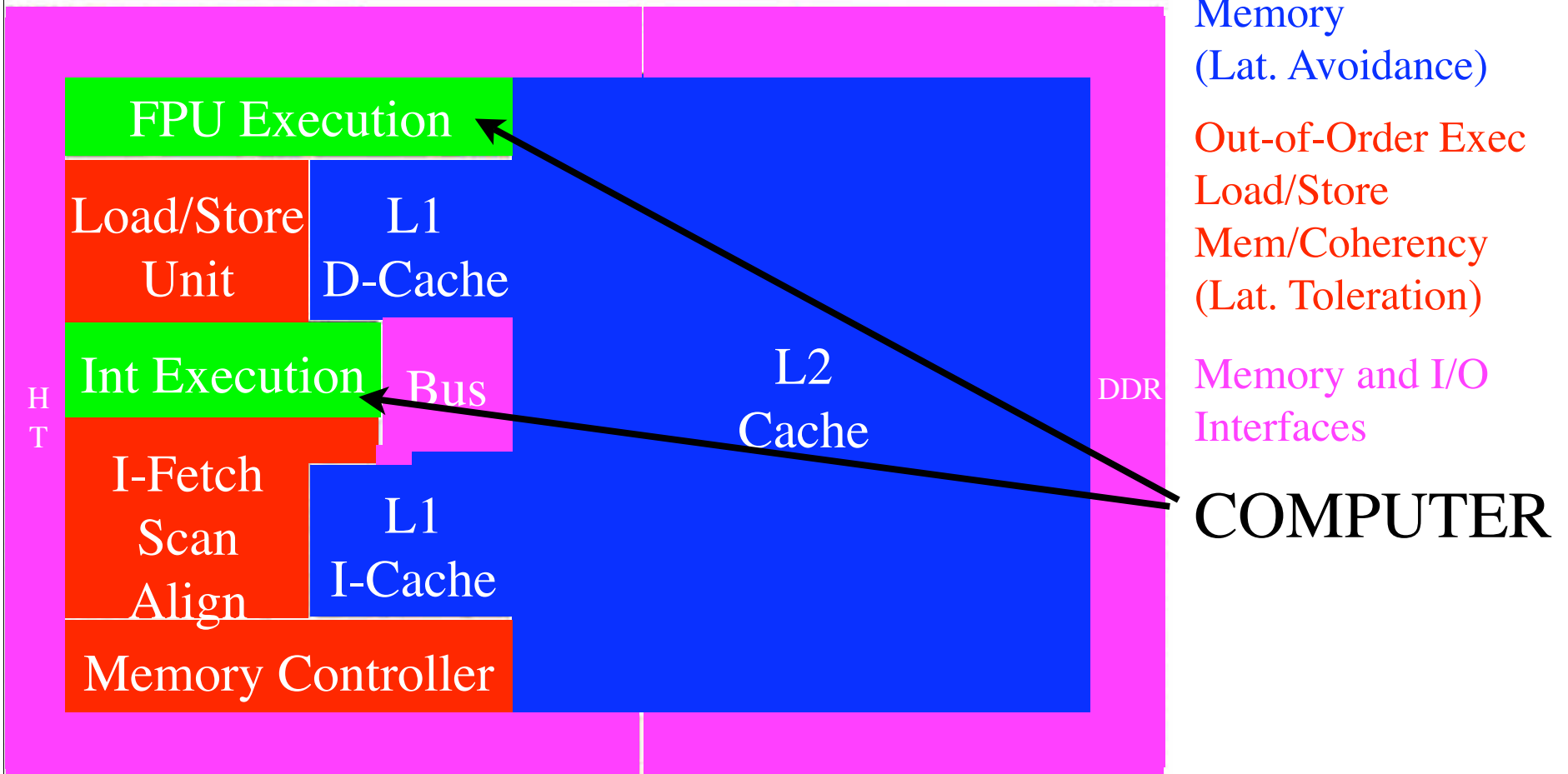
Load/Store

Mem/Coherency
(Lat. Toleration)

The Computer Architect's View of Memory



The Computer Architect's View of Memory





Key Memory-Centric Benchmarks

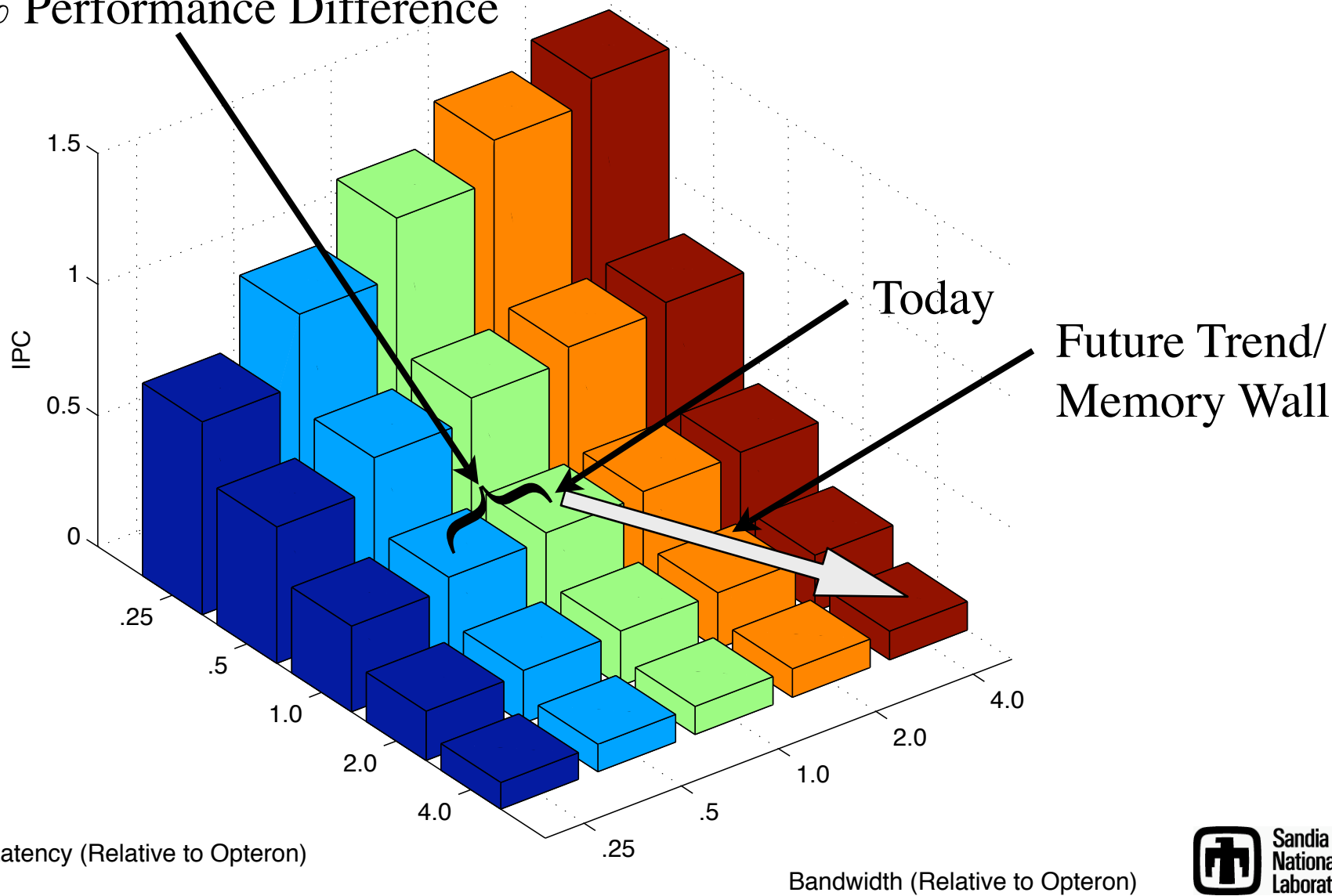
- **Giga Updates Per Second (GUPS)**
 - HPCS Discrete Math Benchmark
 - $\text{Memory}[\text{Random}()] \wedge = \text{Random}()$
 - Pure Latency Effect Measure
 - Little or no “Real” computation

- **Stream (McCalpin’s Bandwidth Benchmark)**
 - Strided access
 - COPY: $a(i) = b(i)$
 - SCALE: $a(i) = q * b(i)$
 - SUM: $a(i) = b(i) + c(i)$
 - TRIAD: $a(i) = b(i) + q * c(i)$
 - Prefetcher and compiler options *hugely* impact results!
 - Not presented in this work (too bandwidth-centric)

The Effect on REAL Applications: Latency vs. Bandwidth

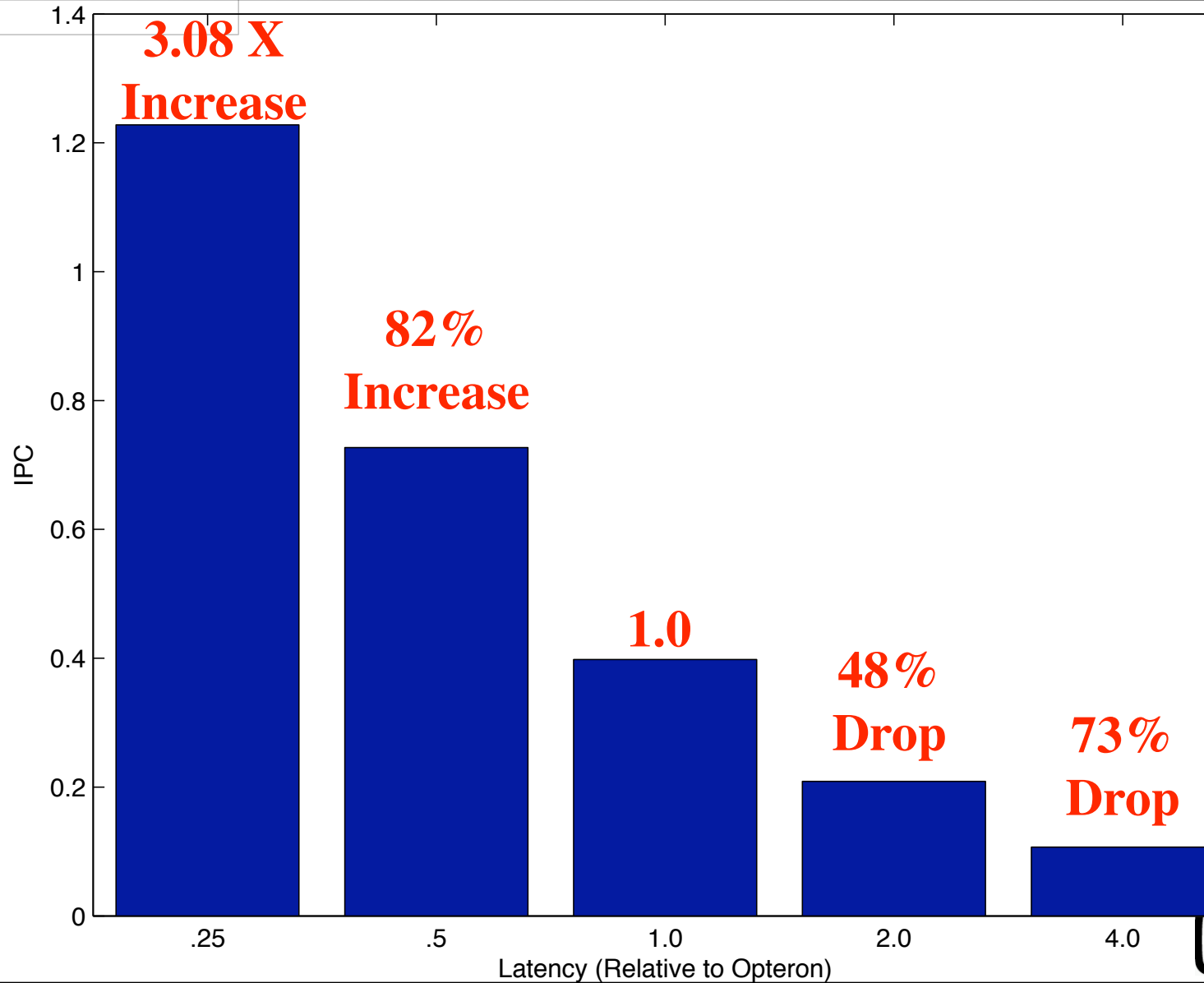
Cube3 CRS Latency/Bandwidth Sensitivity

7% Performance Difference



Latency

Cube3 CRS Latency Sensitivity





Other Benchmark Suites

- **Benchmarks**

- **SPEC CPU 2000**

- SPEC-FP and SPEC-Int
 - Primary suite studied by computer architects

- **LINPACK**

- Used to generate the Top 500 Supercomputer List
 - Known to be flawed



Sandia FP Benchmark Suite

- **CTH: Shock Physics**

- 2-gas

- Explosively Formed Projectile (EFP)

- CuSt AMR

- 4mm copper ball impacting a steel plate at 4.52 km/s and 90-degrees, uses adaptive mesh refinement

- LAMMPS: Classical Molecular Dynamics Simulation

- Lennard Jones Mixture (2048 Atoms)

- Chain (32,000 Atoms and 31,680 bonds)

- Cube3: Drives the Trilinos framework for linear solvers

- sPPM: 3d gas dynamics



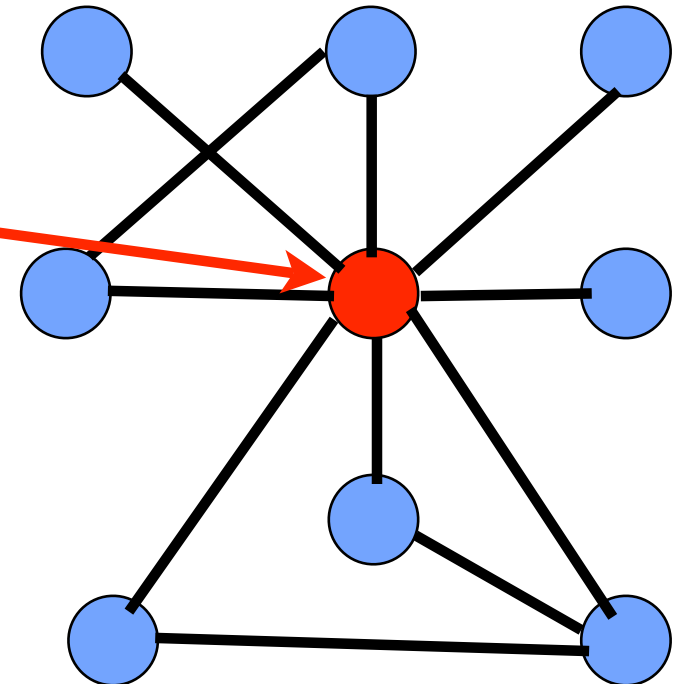
Sandia Integer Suite

- **Minimum Cut Graph Partitioning**
- **Concurrent Search**
 - **Serial Implementation is Depth First Search**
- **Shortest Path**
- **Isomorphism**
- **BLAST DNA Nucleotide Alignment**
- **zChaff: Satisfiability**



Proposed Benchmark: DFS of a Power-law Graph

- **Performs a Depth First Search on a “power law” graph**
 - Many low-degree vertices
 - Very few high-degree vertices
 - Small Diameter
 - Short distance between two vertices
- **Relevance**
 - Social Networks
 - Biology
 - Data Mining
 - Emerging Integer Applications





DFS Properties

- **Fundamental Building Block for Other Algorithms**
 - **Connected Components**
 - **Subgraph Isomorphism**
 - **Shortest Path**
- ***Parallel/Concurrent Versions available***
 - **Multithreaded**
 - **Can scale to as many or as few threads as required**
 - **Runs on the Cray MTA**
 - **Runs on conventional multiprocessors**
 - **Multicore Architectures**
 - **Memory Dominated**



Measuring Memory Characteristics

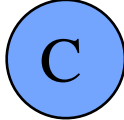

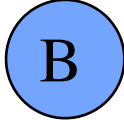
- ***Temporal Locality***
 - Miss Rate of a Fully Associative 64-kb (L1-sized) cache with machine word (4-byte) block sizes
- ***Spatial Locality***
 - the average ratio of bytes consumed in a 64-byte cache line over 1,000 instructions
- ***Data Intensiveness***
 - the total number of unique bytes consumed by the instruction stream
- Each measurement was performed on well studied 1 billion instruction traces for PowerPC
 - Murphy, Rodrigues, Kogge, and Underwood. *The Implications of Working Set Analysis on Supercomputing Memory Hierarchy Design*, ICS 2005.



Example

Given the following memory access sequence:
A, B, C, A, A, C

Temporal Working Set

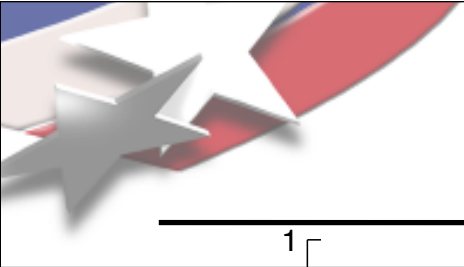
Most Recently Used Least Recently Used

Spatial Working Set

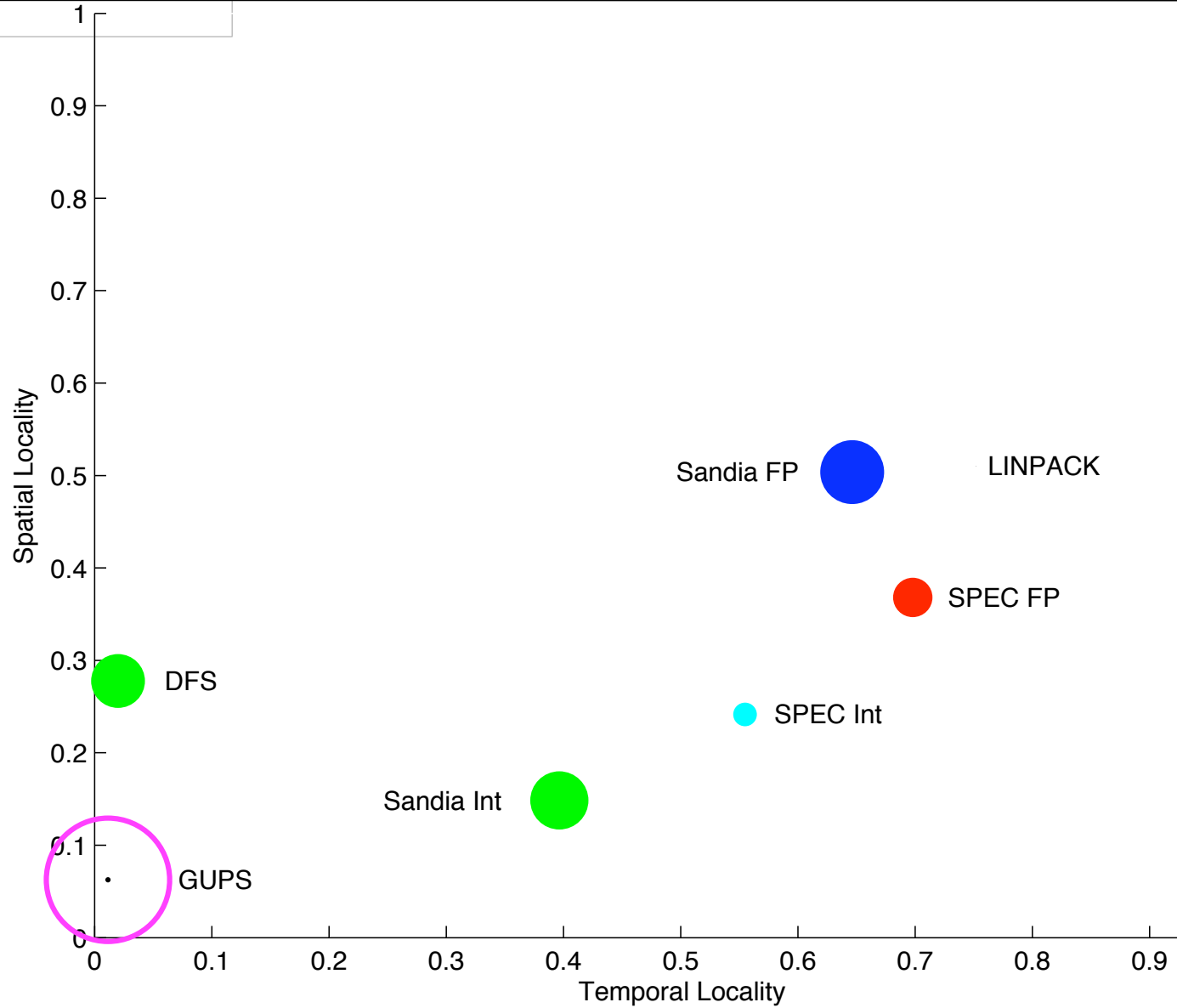
Data Intensiveness





Results

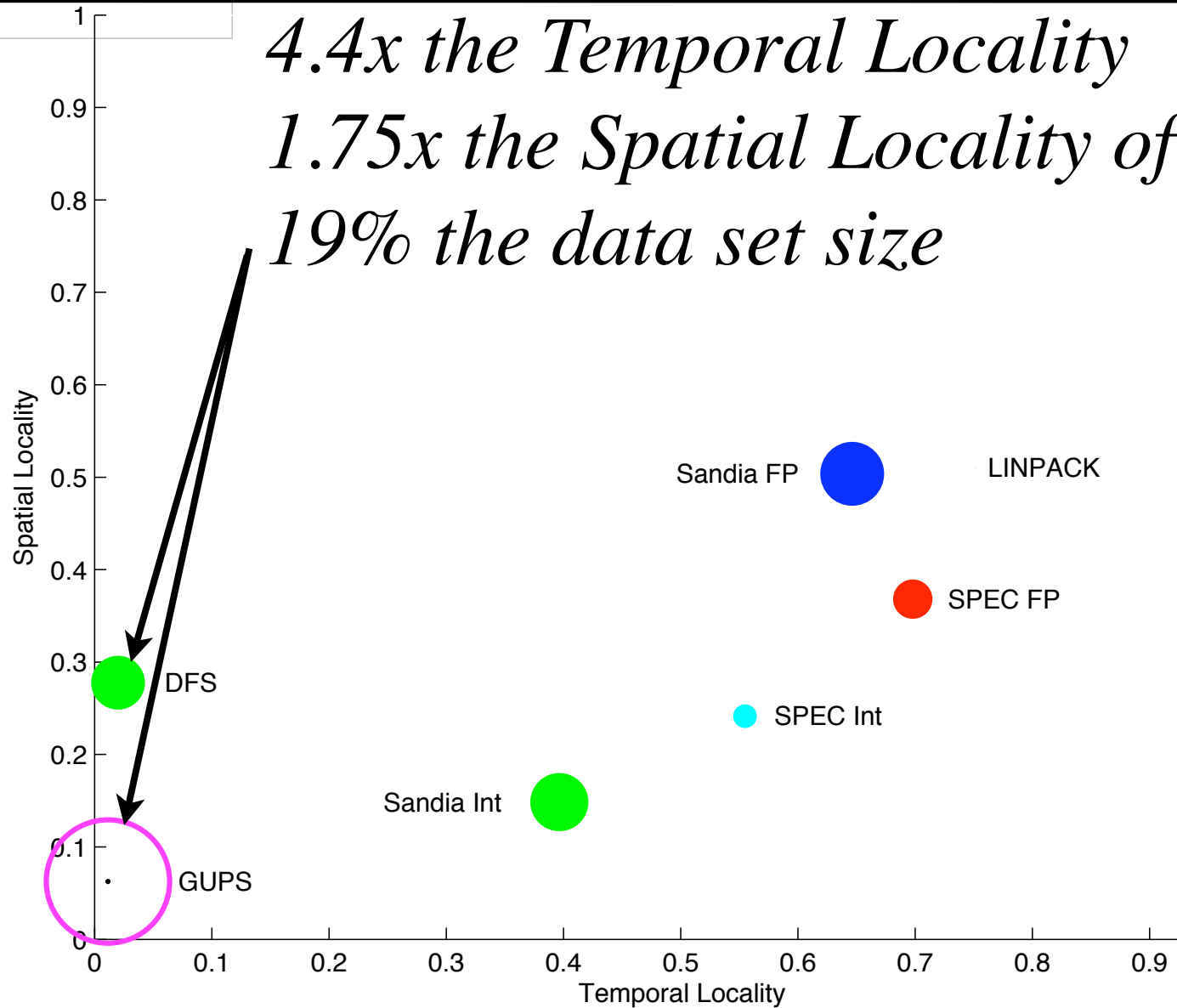
Benchmark Suite Mean Temporal vs. Spatial Locality



Results Compared to GUPS

Benchmark Suite Mean Temporal vs. Spatial Locality

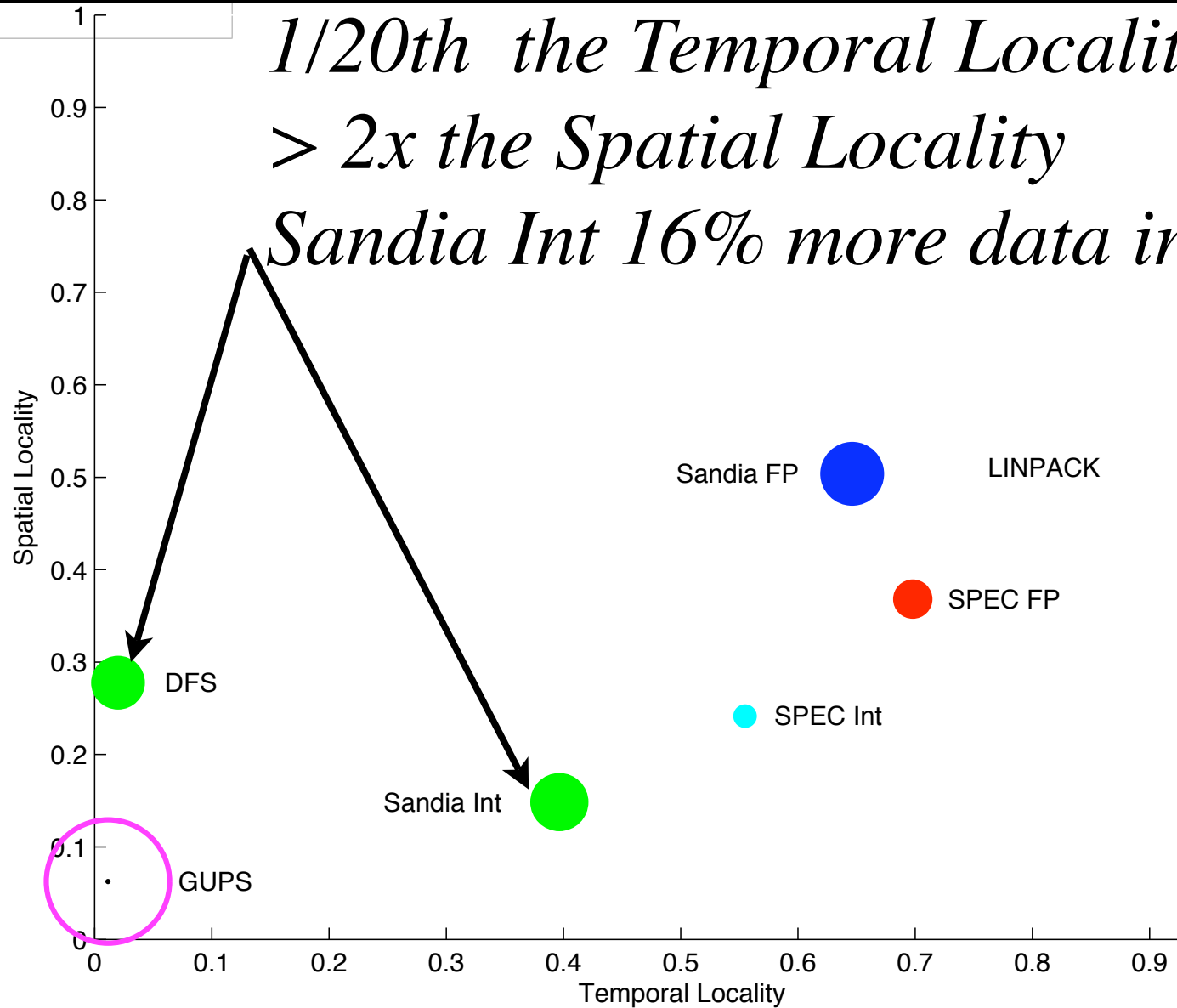
4.4x the Temporal Locality
1.75x the Spatial Locality of GUPS
19% the data set size



Results compared to Integer Applications

Benchmark Suite Mean Temporal vs. Spatial Locality

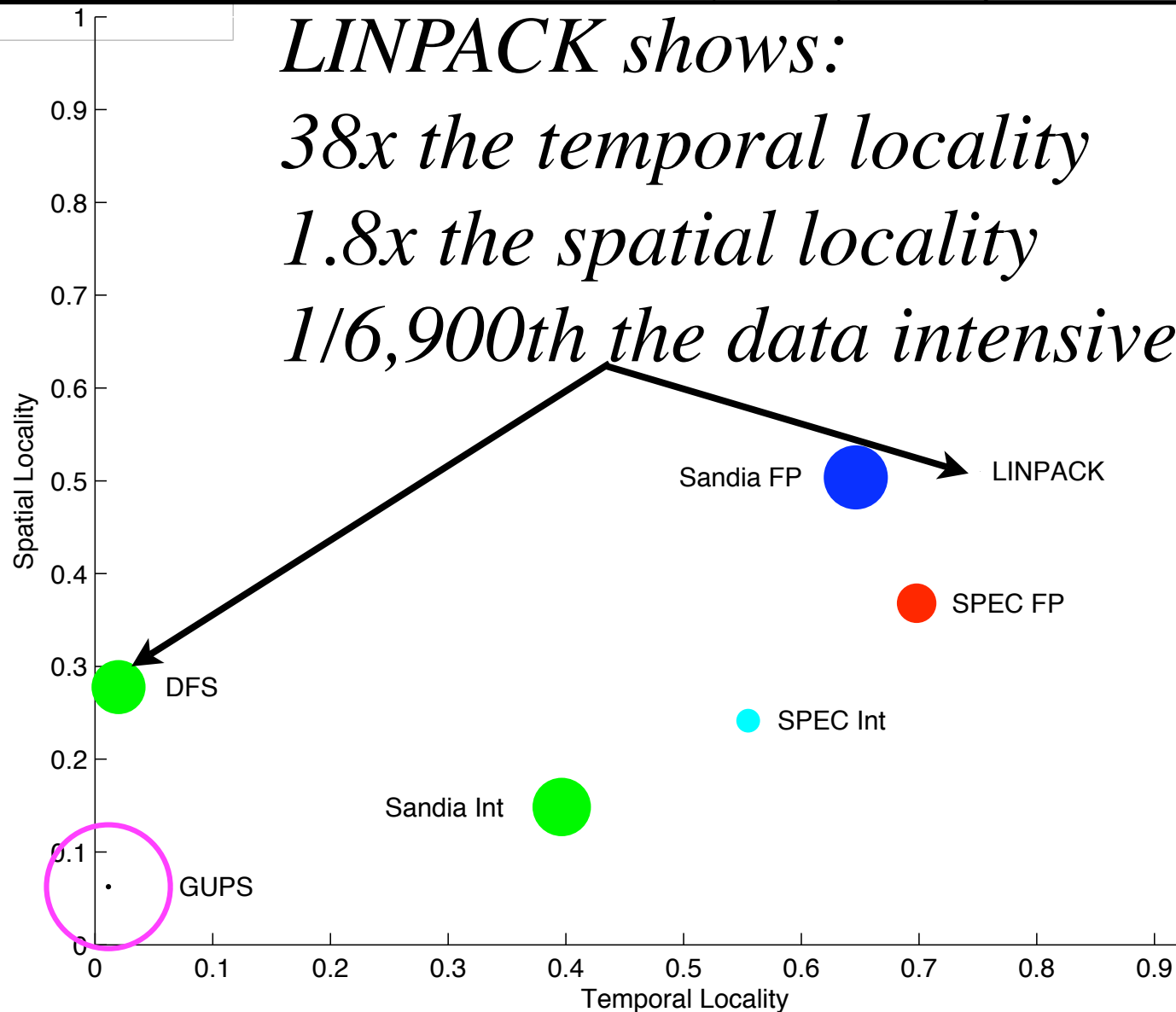
1/20th the Temporal Locality
> 2x the Spatial Locality
Sandia Int 16% more data intensive



Results compared to LINPACK

Benchmark Suite Mean Temporal vs. Spatial Locality

LINPACK shows:
38x the temporal locality
1.8x the spatial locality
1/6,900th the data intensiveness





Data Intensiveness

- **Critical “missing” measurement for differentiation**
- **Benchmarks are less data intensive**
 - 1.86x SPEC-FP
 - 5x SPEC-Int
- **Real Applications are more data intensive**
 - Sandia FP 41% more data intensive
 - Sandia Int 16% more data intensive



Conclusions

- **Memory-centric benchmark that performs a real and relevant computation**
- **Scalable**
 - in memory size
 - in number of threads with the parallel version
- **Quantitatively Different from Other Benchmarks**
 - Low Temporal and Spatial Locality
 - High Data Intensiveness
- **Represents an emerging class of HPC applications**
 - Integer rather than floating point based
 - Memory Dominated



**THANK
YOU**