

Introduction to MadSys

YONGWEI WU

<http://madsys.cs.tsinghua.edu.cn/publications.html>

What is MadSys?

- MadSys (Mad System) group is doing cutting-edge **system research**, especially focuses on the design, implementation, evaluation and application of the **parallel and distributed systems**. The group belongs to the **High Performance Computing Institute of Tsinghua CS Department**.
- Our research interests include Runtime Environment, Data Storage/Management, Virtualization, Resource Management, Distributed Scheduling, Performance Analysis, Reliability/Fault Tolerant and other related topics.

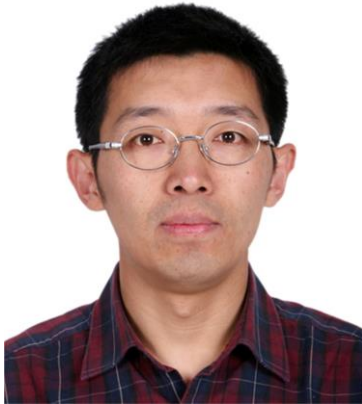
Group Members:



Yongwei Wu
Professor, Vice Head



Kang Chen
Associate Professor



Jinlei Jiang
Associate Professor

6-8 PhD Students
8-10 Master Students

Recent Research Fields

- **Distributed Storage**
- Graph Computing
- Non-volatile Memory Systems
- Cloud Computing

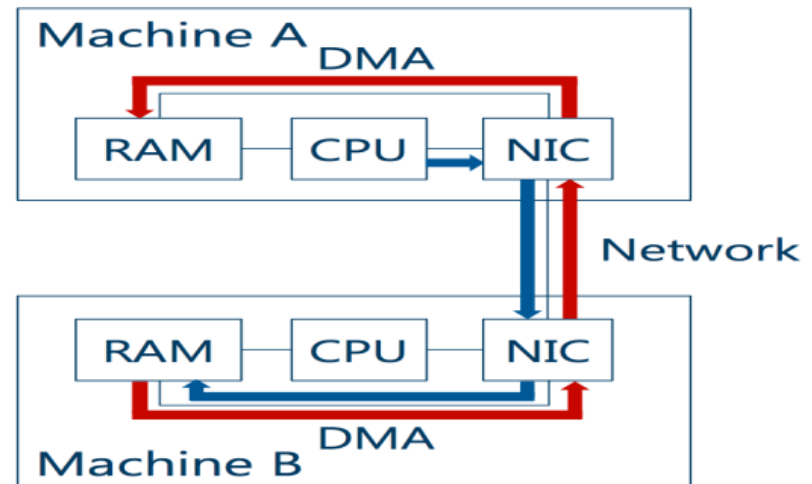
Distributed Storage

Our Research

1. RFP: Investigated the correct way of using RDMA for distributed (storage) systems
2. Triones: How to store data over multiple cloud providers for some specific benefit.
3. MeePo: Build a system for real-time group-data-sharing on demand in enterprise network
4. TStor: High-Scale (32+16/64+32) Erasure Code Enabled Distributed File System

1.1 RDMA devices are fast

- Apply Infiniband and RDMA into distributed storage systems
- InfiniBand: high performance networking hardware
- RDMA: Remote Direct Memory Access protocol
 - CPU/kernel bypassing and zero-copy
 - 2X~4X performance improvement compared with TCP/IP



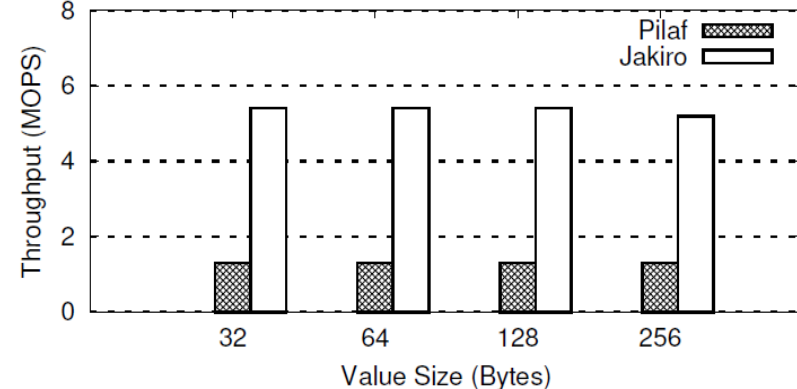
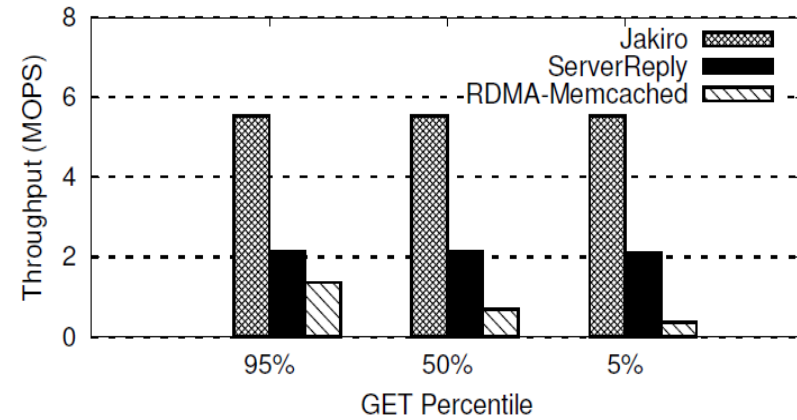
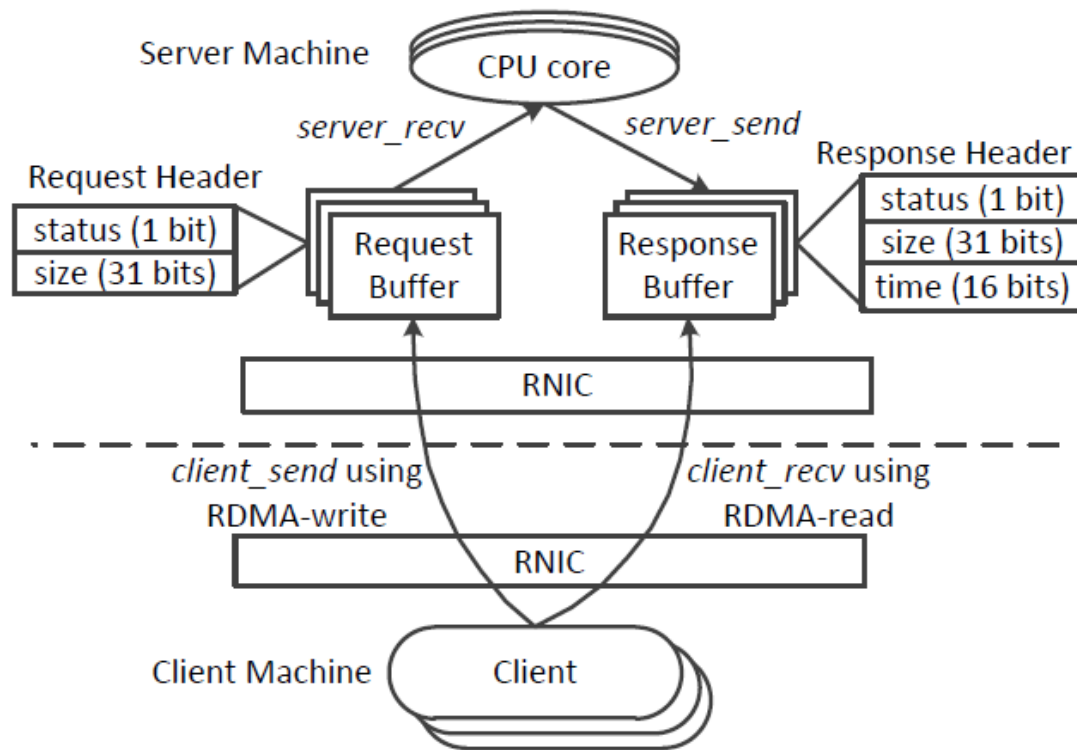
1.2 Good Performance vs. Programmability

- Currently, two design paradigms are used using RDMA
- Server-Reply Paradigm
 - Just replace traditional TCP/IP socket interfaces with RDMA verbs
 - Good programmability but poor performance
- Server-Bypass Paradigm
 - Make use of bypassing features of RDMA and totally change the way TCP/IP works
 - Good performance but poor programmability

System developers have to trade-off between performance and programmability while choosing their way of programming from server-reply and server-bypass paradigms.

1.3 Remote Fetching Paradigm

- We present Remote Fetching Paradigm
 - Server process requests; Clients fetch results from server remotely
 - Achieve good programmability and high performance
 - **1.6X~4X** performance improvement over server-reply and server-bypass paradigms



RFP

2.1 How to store data over multiple cloud providers

- Data grows exponentially in distributed storage systems
 - Cost of native data centers increase dramatically
- Non-private data is being transferred to public multi-cloud storage
 - Storage resources of public cloud storage providers (such as Amazon-S3 or Rackspace-Cloudfiles) are more cheaper
- Erasure Coding could be used to further reduce storage cost
 - Multi-cloud storage consists of erasure coding parameter (n,k) and n cloud storage providers
 - Tolerate the errors or unavailability of k providers

2.2 Why not build a model?

- Factors in multi-cloud storage with erasure coding are much complex

Vendor
Lock-in

$$V = \frac{1}{n}$$

Fault-Tolerance
Level

$$F = n - k$$

Latency

$$L_{X_s,r} = \frac{1}{k} \times \max_{1 \leq i \leq N} \{x_i \times l_{i,r}\}$$

Availability

$$A = 1 - \sum_{m=n-k+1}^n \sum_{j=1}^m \prod_{i \in \mathbb{N}_j} (1 - a_i) \prod_{i' \in \mathbb{N}'_j} a_{i'}$$

Cost

$$\left\{ \begin{array}{l} C = \sum_{j=1}^5 \sum_{i=1}^T \int x_i \times (Y_1 + Y_2) dt \\ Y_1 = \sum_{g=0}^{G_{i,j}-1} (D_{i,j,g} \times U_{i,j,g}(t)) \\ Y_2 = \left(Y_3 - \sum_{g=0}^{G_{i,j}-1} D_{i,j,g} \right) \times U_{i,j,G_{i,j}}(t) \\ Y_3 = \left(M_j \times R_j(t) + R'_{i,j} \right) \\ \vec{M} = \left(\frac{1}{k}, \frac{1}{n}, \frac{1}{k}, \frac{k}{n}, 1 \right) \end{array} \right.$$

- Previous works do not consider the optimization issue, so they cannot optimally use cloud storage resources, which are charged by providers

2.3 Understand the problem systematically

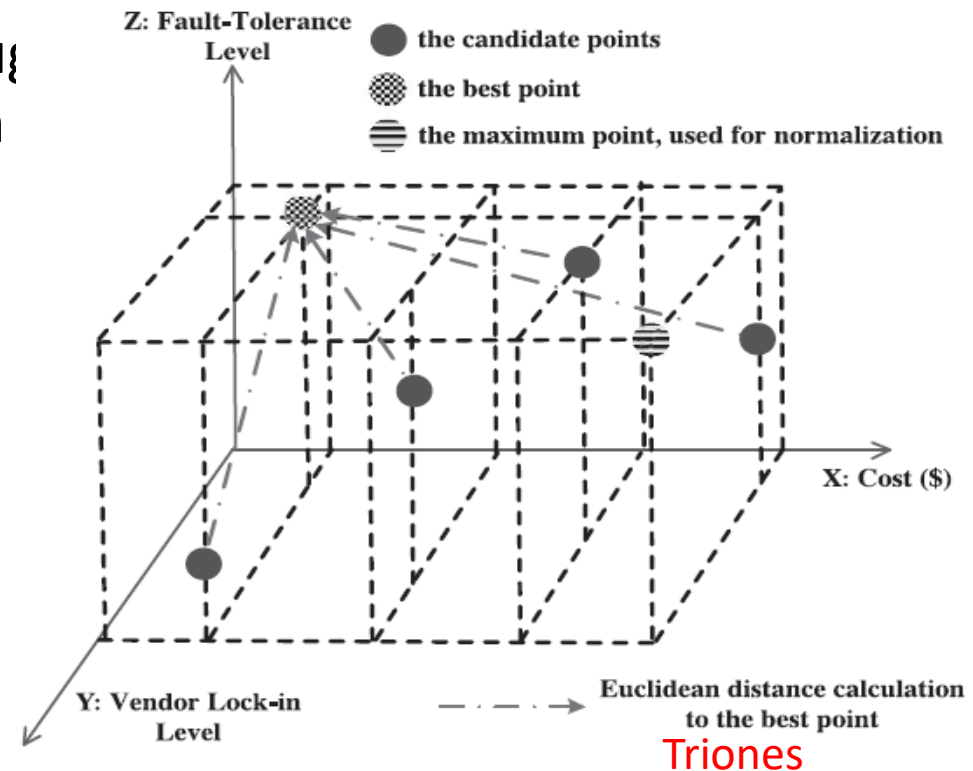
- We present Triones, a systematic model to address optimization issue in multi-cloud storage, and get your specific target: much lower latency with a little higher cost.
 - Non-linear programming to define data placement in multi-cloud storage
 - Get the optimum result through optimization

$$\left\{ \begin{array}{l}
 \text{Minimize} \quad : \quad f_1(X, P) \\
 \quad \quad \quad : \quad f_2(X, P) \\
 \quad \quad \quad : \quad \dots \\
 \text{Subject to} \quad : \quad f'_1(X, P) < Con_1 \\
 \quad \quad \quad : \quad f'_2(X, P) < Con_2 \\
 \quad \quad \quad : \quad \dots
 \end{array} \right.$$

$$X = \{x_1, x_2, \dots, x_N, k\}$$

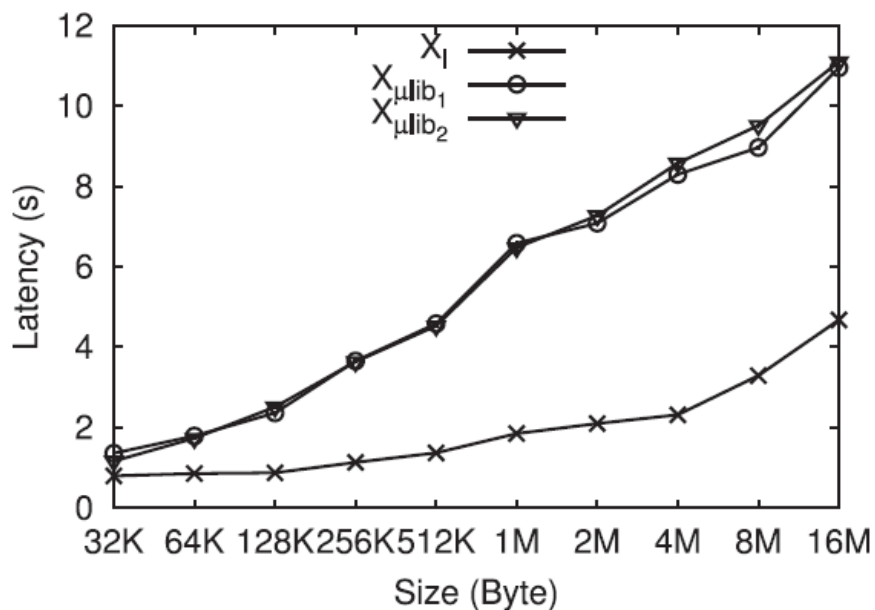
$$P = [\vec{P}_1, \vec{P}_2, \dots, \vec{P}_N]^T$$

$$\vec{P}_i = (H_{i,1}, H_{i,2}, \dots, H_{i,K})$$

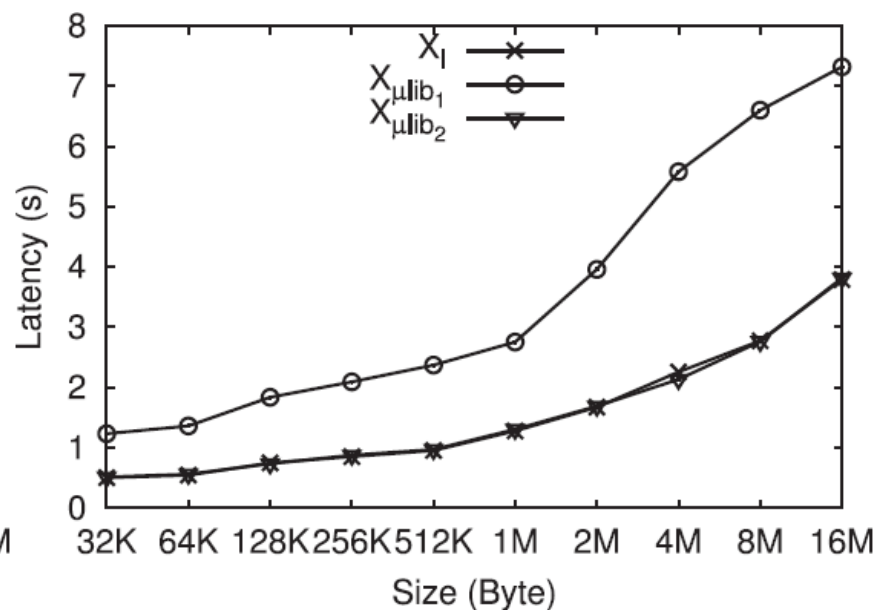


2.4 The Effectiveness -- Latency

- Compared with random models, Triones reduces access latency by 50%



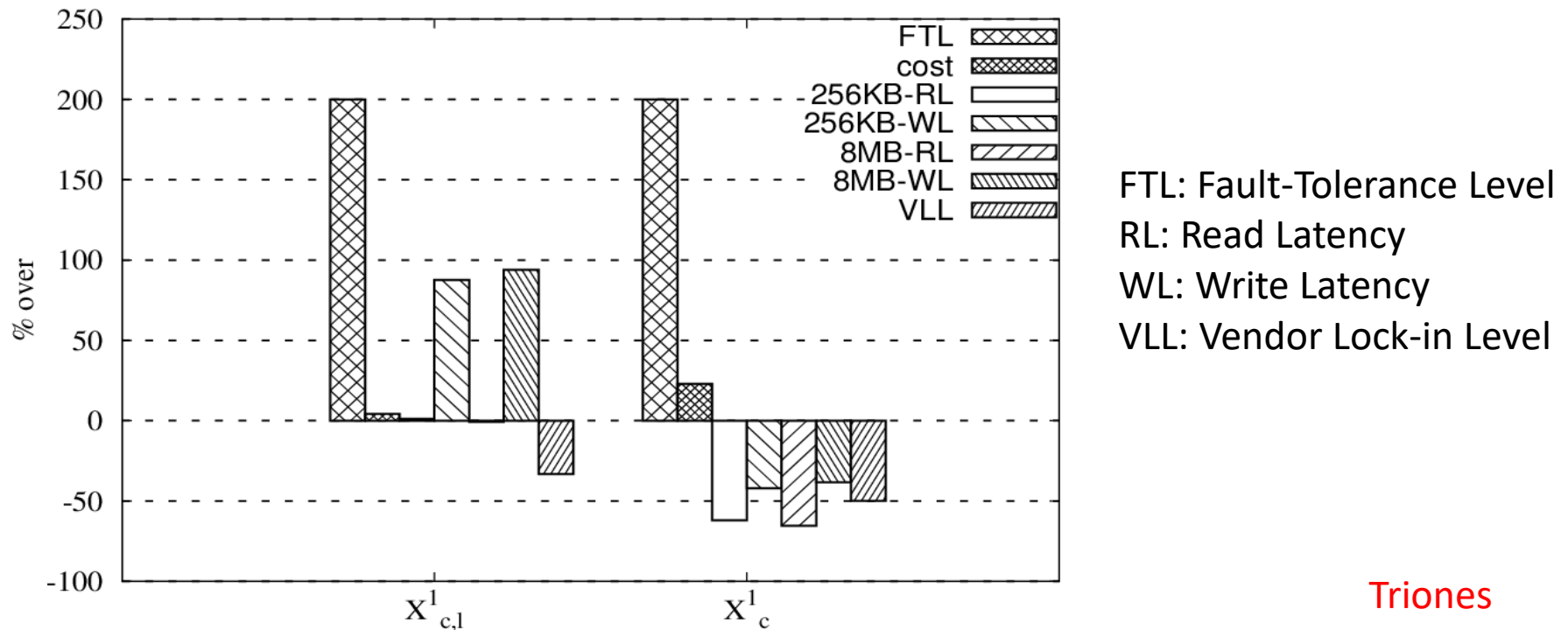
(a) Write



(b) Read

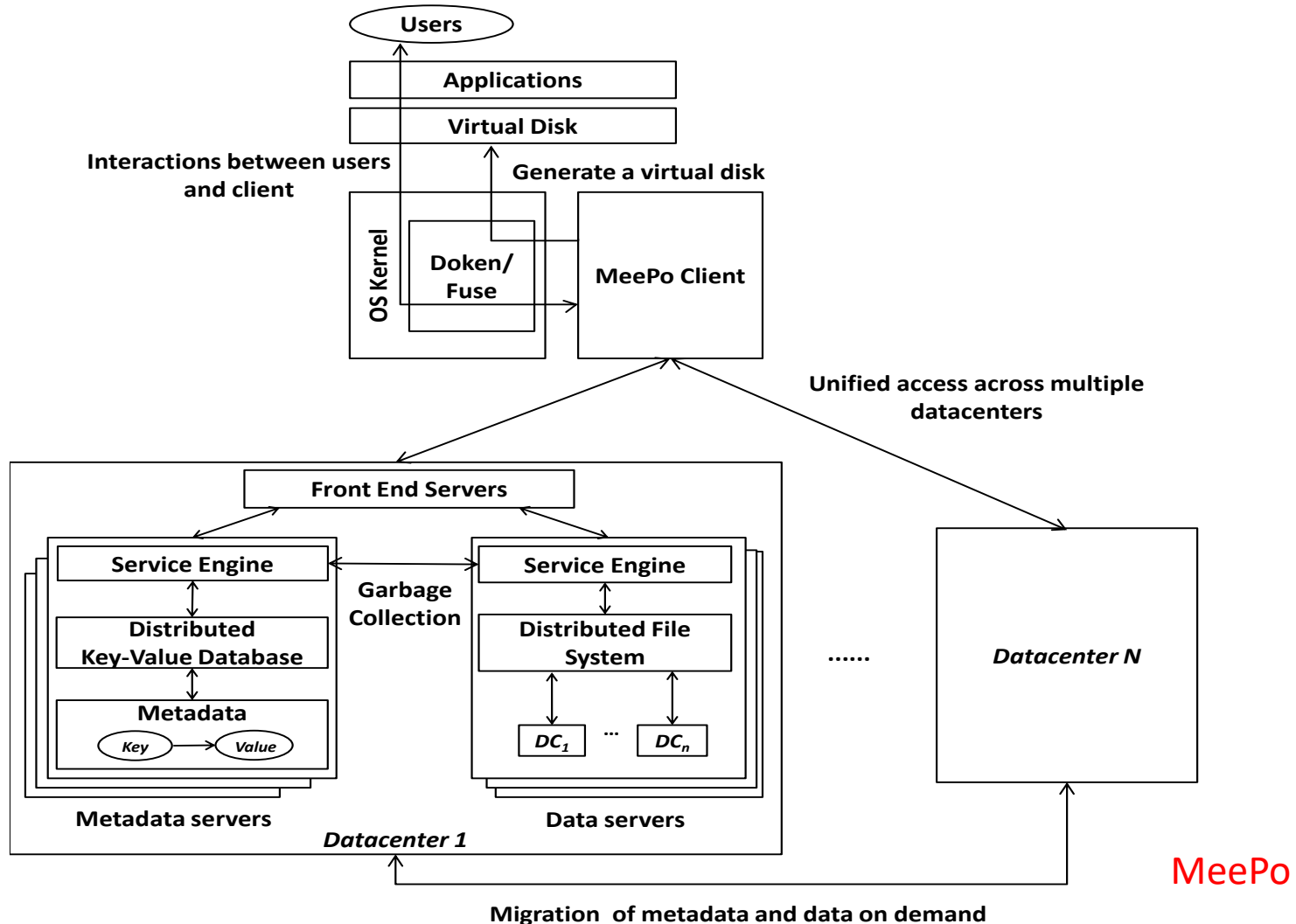
2.5 The Effectiveness -- Cost

- Compared with models for single-objective optimization, Triones improves fault-tolerance level by 200%, reduces vendor lock-in level by 49.85%, and reduces access latency by 30% to 70%, with only 22.97% more cost



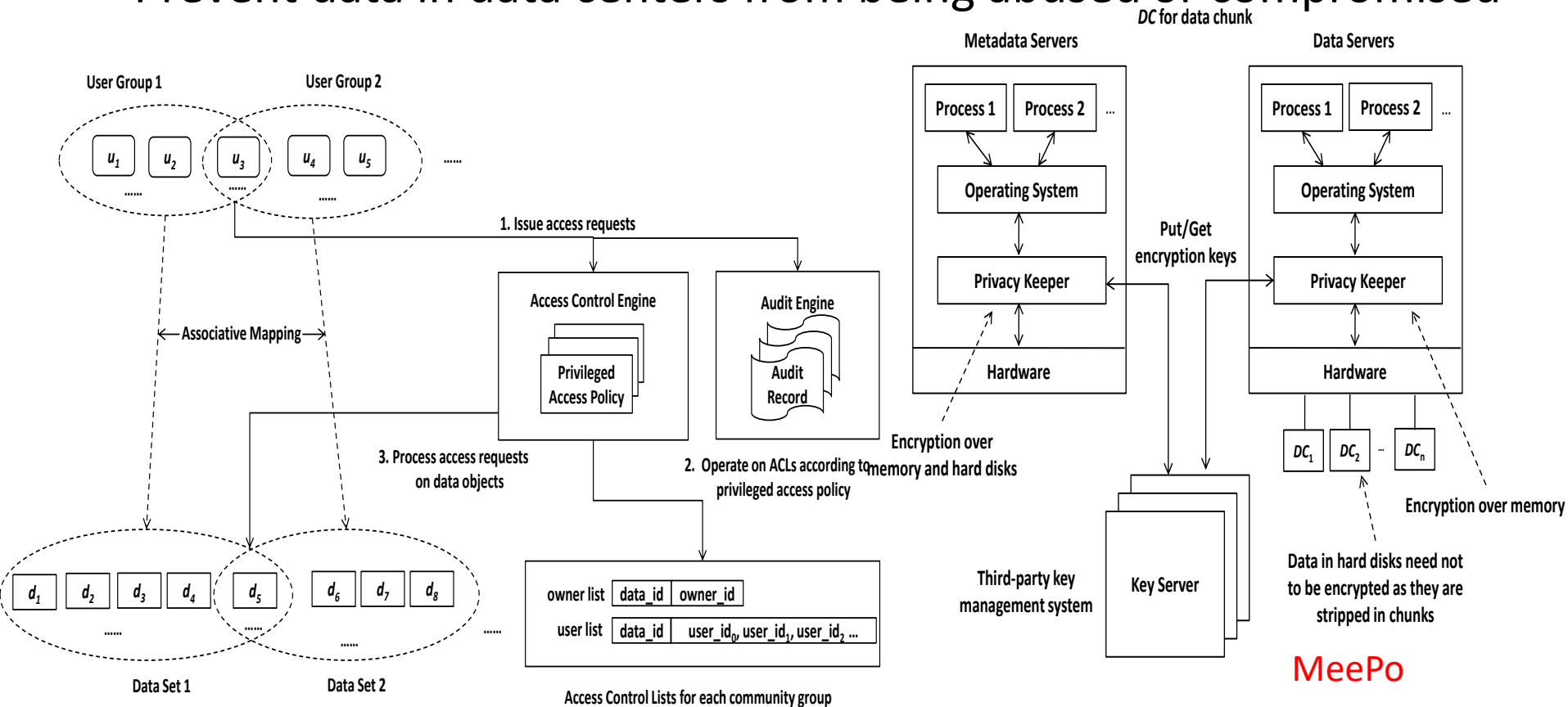
3.1 Group Data Sharing Storage System

- We have designed and implemented MeePo to support group data sharing in enterprise with enterprise internal LAN



3.2 The MeePo Architecture

- Virtual Disk Mechanism
 - Sharing data is as convenient as operating files in native disks
- Privilege-Based Access Control
 - Prevent sharing data in groups from being disrupted
- Privacy Protection in Date Center
 - Prevent data in data centers from being abused or compromised



3.3 The MeePo System

• MeePo

- Deployed in **51** universities/research institutes and **20** companies
- The number of users registered or being served reaches **1,500,000**, the number of groups created reaches **6,000**
- At Tsinghua University: **30,000** users, **600** groups, **500TB+** data



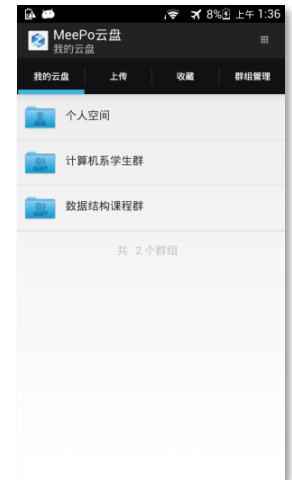
Web Interface



For Windows (Similar for Linux, MacOS)



iOS

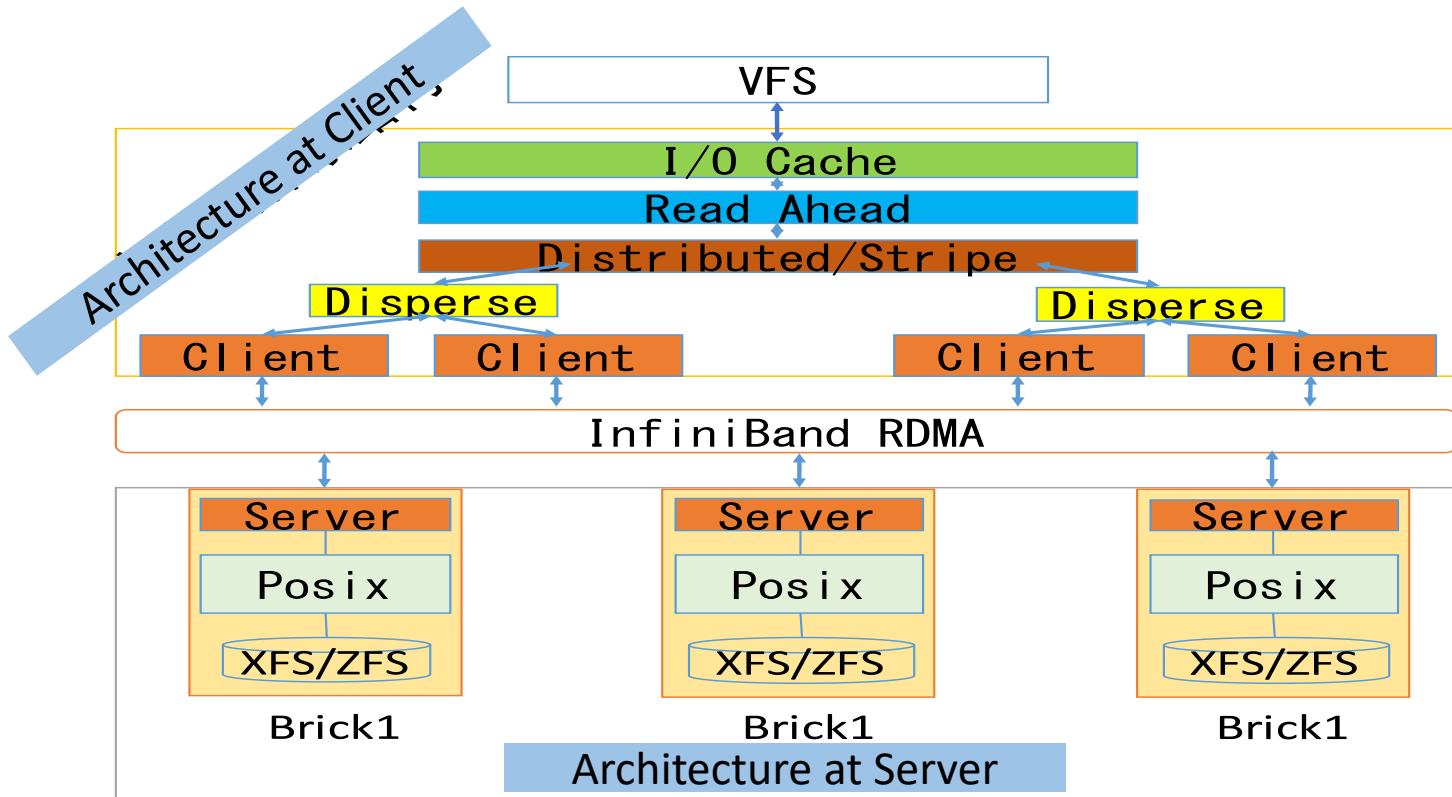


Android

MeePo

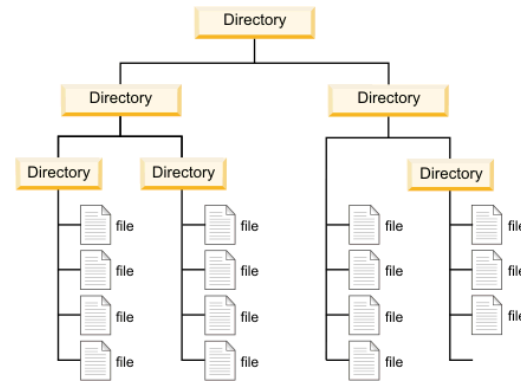
4.1 Enable Large Scale Encoding/Decoding

- (N+32)-level protection, providing very high availability . Computing complexity is increased exponentially.
- Improving Encoding/Decoding Performance
 - Using parallel encoding/decoding, AVX2 instructions, Binary Division
- The throughput reaches 1GB/s (High availability without performance degradation)



4.2 Tstor Architecture

- File data is saved as data blocks
- The data block is encoded into data slices through the erasure code
- Data Slice is saved to physical disk by data server
- Data slices of the same data block are distributed to different disks
- TStor forms three layers: physical disks (saves data slices), floating data blocks, and file systems



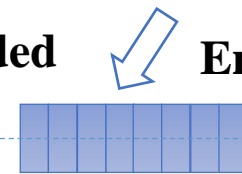
File System

File is divided into data blocks

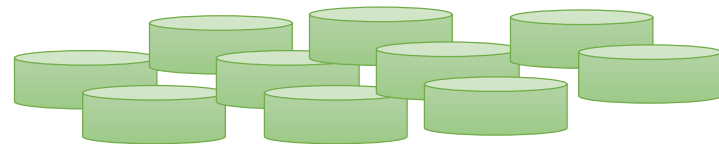


Floating Data Blocks

Data block is encoded into data slices



Data slices are saved to the disks



Physical Disks

4.3 Tstor: Enable Large Scale Encoding/Decoding

Model	Object Write	Object Read	NFS Write	NFS Read
32 + 16	1.2GB/s	969MB/s	880MB/s	845MB/s
16 + 8	1.3GB/s	775MB/s	997MB/s	707MB/s
8 + 4	1.4GB/s	702MB/s	882MB/s	655MB/s

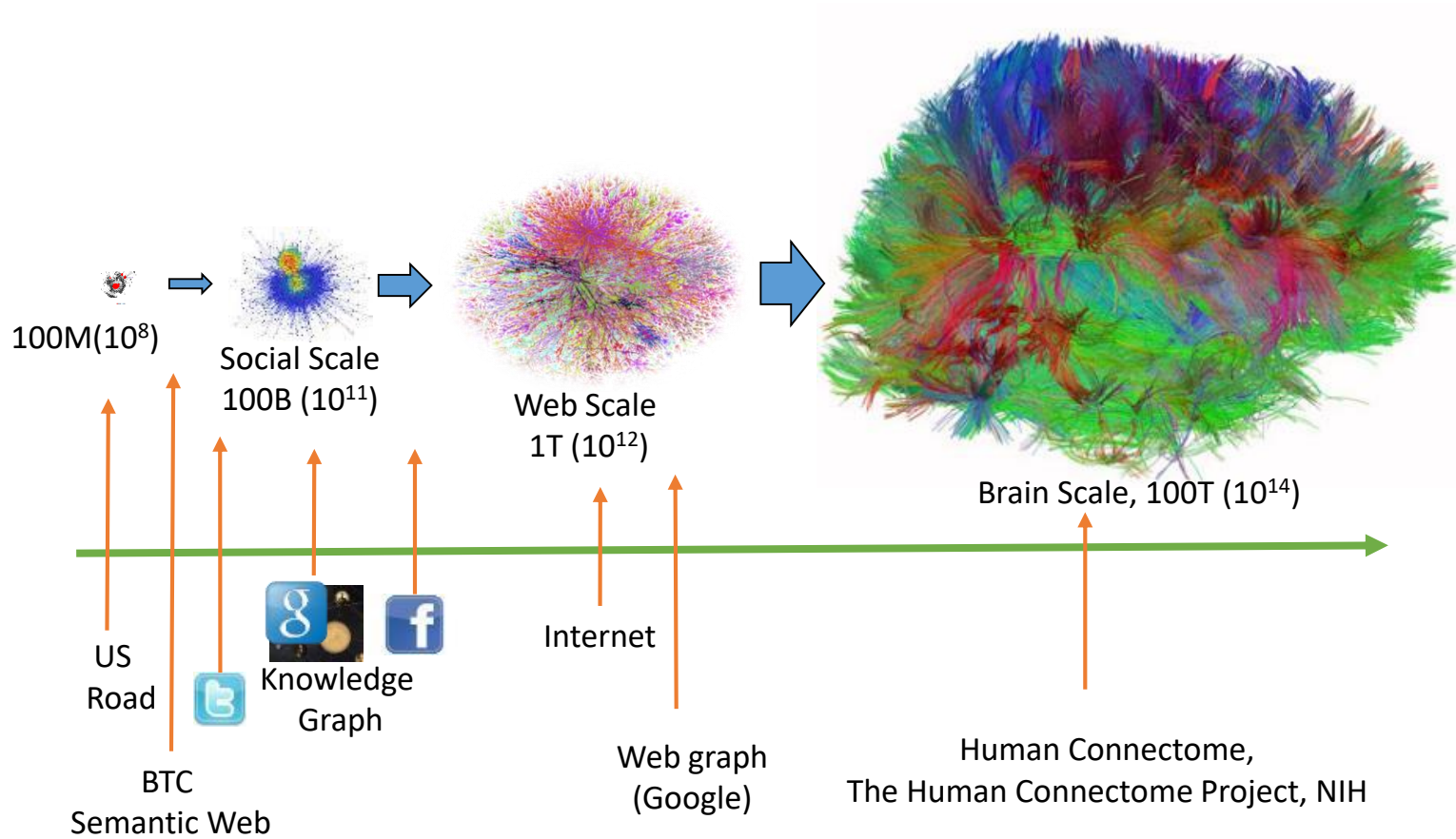


Data Recovery
Capability: 1.18
GB/s, 8TB SATA
DISK/2 hours
(15 hours for
4+2 model)

持续移除硬盘，系统继续运行

Graph Computing

Why Graph Computing Matters?



Data-Parallel V.S. Graph-Parallel



Map Reduce



Feature
Extraction

Cross
Validation

Computing Sufficient
Statistics

Graphical Models

Gibbs Sampling
Belief Propagation
Variational Opt.

**Semi-Supervised
Learning**

Label Propagation
CoEM

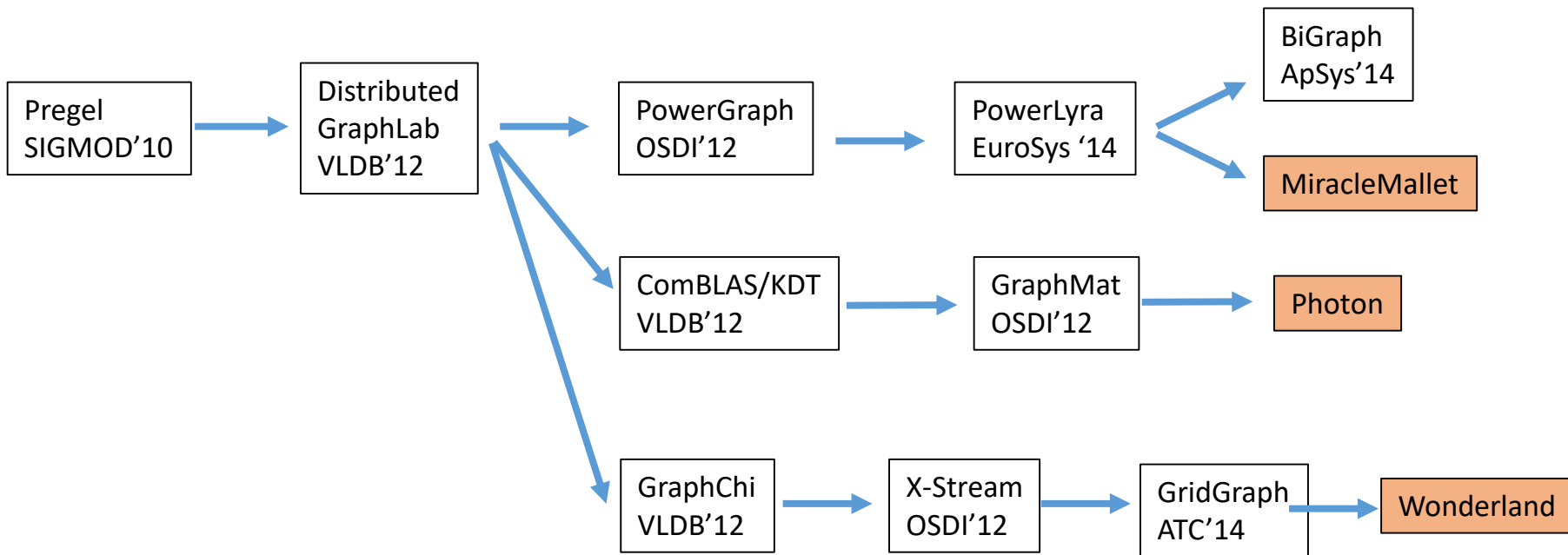
**Collaborative
Filtering**

Tensor Factorization

Data-Mining

PageRank
Triangle Counting

What's going on with Graph Computing?



* Ones in orange are our work

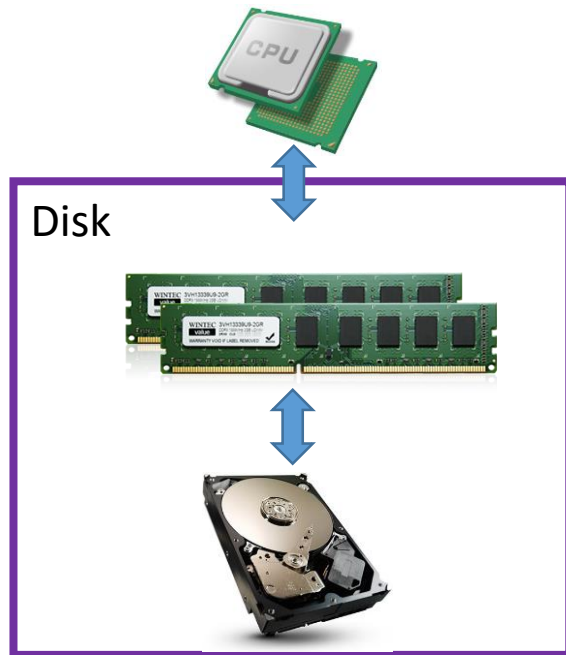
Our Research

- MiracleMallet: 3D Graph Partitioning, Exploring the hidden dimension in graph processing for high performance computing
- Photon: Improving the Data Locality of Graph Computing. The current data layout incurs large amount of interleaved memory access. Making optimization for the locality of source vertex of each edge will often hurt the locality of target vertex or vice versa.
- Wonderland: Existing graph abstraction techniques typically assume either fully in-memory or distributed environment. Wonderland is based on graph abstraction

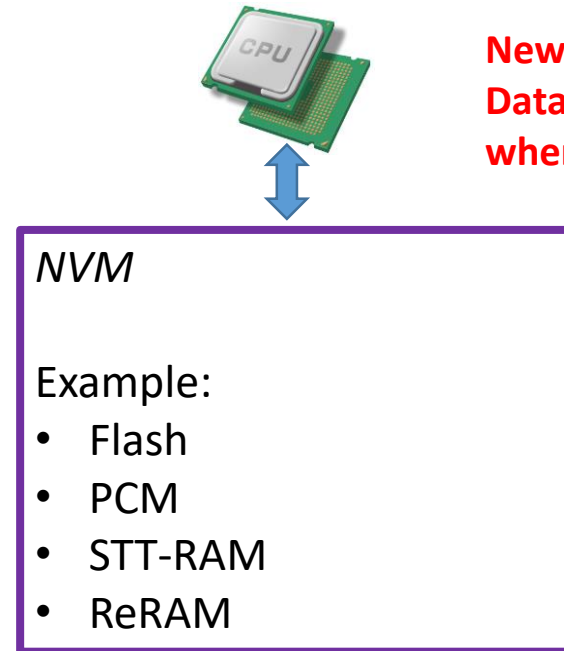
Non-Volatile Memory Systems (NVM)

Data Consistency for NVM

Traditional Memory-Disk architecture



Non volatile memory(NVM) architecture

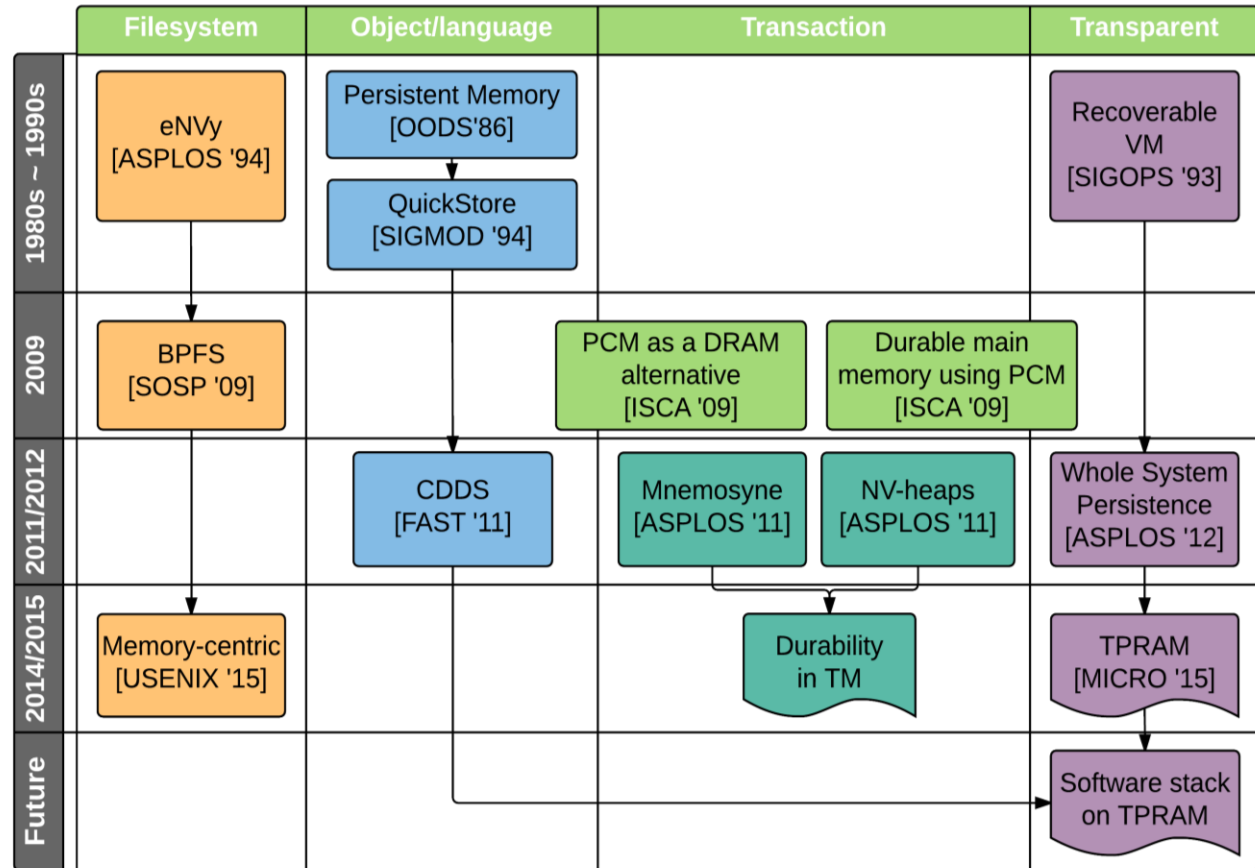


Our Research

[2] Data consistency for transaction memory. Our solution supports higher throughput and lower latency

[3] Providing software-transparent API for better programmability and proposing an efficient consistent dual-scheme check pointing mechanism for performance

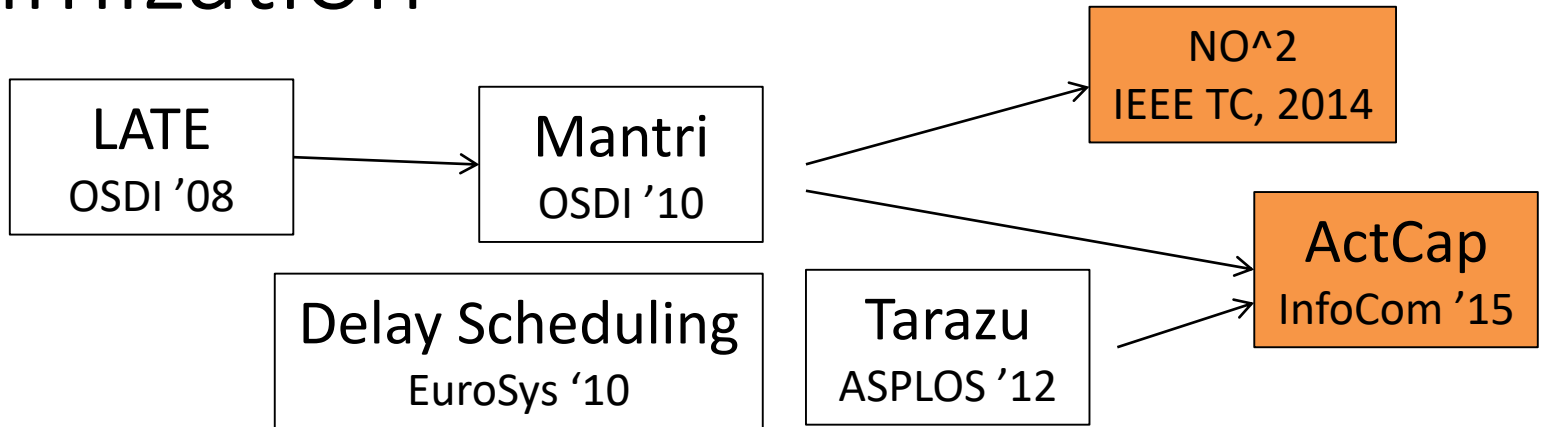
[1] Data consistency for file system, which used on mobile system, decreasing response time and energy consumption



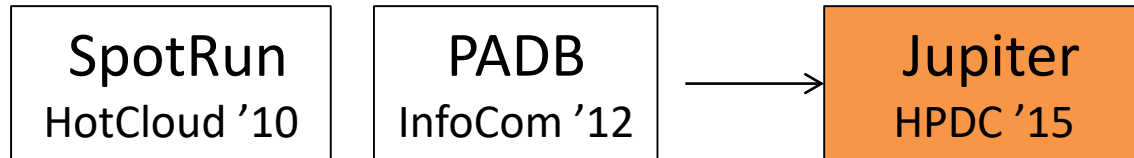
Cloud Computing

Our Research on Cloud Computing Optimization

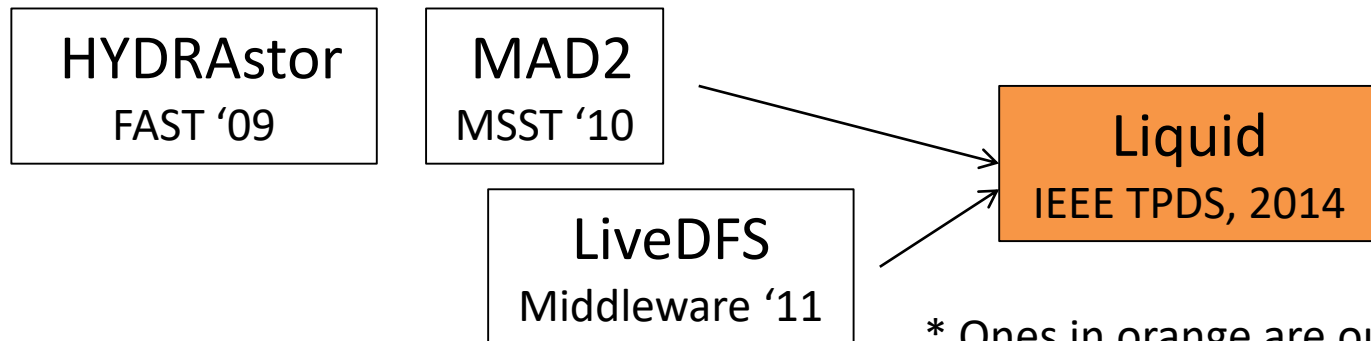
Parallel Computing for Heterogeneous Environment



Reliable Systems from Spot Instances



Storage Management for Cloud Images



* Ones in orange are our work

Facility

Facilities

- 2.5 PB Storage Cluster
- High Performance Distributed Computing Cluster (with Infiniband and RDMA)
- Tiny Cluster
- Many Core Machine
- Flash & SSD



Storage Cluster

- 2.5 PB Storage Cluster



- 10 Servers
- 36TB each Server



- 18 Servers
- 36TB each Server
- Connected by 40Gbps Infiniband



Computing Cluster

- High Performance Distributed Computing Cluster (8 Servers)



- 1Gbps Ethernet
- **20Gbps Infiniband**
- Mellanox MT27500 NIC
 - RDMA
- Dell R720
- 2 CPU
- Intel Xeon CPU E5-2640 v2
 - 32 logical cores
 - 20MB LLC
- 96GB RAM

Tiny Cluster

- Tiny Cluster



- *Intel Core i7*
- 16GB RAM
- 512GB SSD

One Node with 120 cores

- Many Core Machine



- *IBM System x3950 X6*
- NUMA architecture
- **120 physical cores**
- 8CPU
- *Intel Xeon E7-8870 v2*
 - 15 physical cores
 - 30MB LLC
- **1TB RAM**
- 2TB SSD

Experiment Environment

- PCIE SSD



- *Intel SSD DC P3600 1.2 TB*
 - 2.6GB/s
 - 160k IOPS
 - 20us latency



- *Fusion IO Atomics SX300*
 - 2.6GB/s
 - 285k IOPS
 - 15us latency

Thank You
and for more
information

<http://madsys.cs.tsinghua.edu.cn/>