

# CS33001: DATA-INTENSIVE COMPUTING SYSTEMS

## Today

- Organizational Meeting
- Topics, Structure, Expectations
- Expected Coursework
- Ground Rules

## Announcements

- Assignments for Next meeting (Friday)

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# LOGISTICS

## Meetings:

- MF 130-250pm, Ry 277
- Format: Interactive Discussion (invited speakers, fostered paper discussions, project brainstorming/presentations/reviews)

## Grading:

- In-class Participation (25%)
- Writeups (25%)
- Projects (50%)

## Course Web:

- <https://sites.google.com/site/uchicagolssg/lssg/people/andrew-chien/chien-teaching/dicsys2013>

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## OBJECTIVES

- Explore the technical challenges of data-intensive computing systems,
- including canonical driving problems, research systems, and emerging technologies.
- Develop a broad familiarity with the state of the art, including leading edge research in the area, and
- Hands-on experience with a range of systems which together provide a solid preparation for research in the area.

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## TOPICS: DATA-INTENSIVE COMPUTING SYSTEMS

**Application Archetypes and Major Infrastructures**

**Storage, Traditional Filesystems, and Databases**

**Big Data Computing Middleware**

**Key-value Stores**

**NoSQL Databases**

**Background on Novel Storage Technologies (storage-class memory)**

**Systems that integrate such Novel Tech into System Architectures**

**Systems that integrate computing into the storage hierarchy**

**+ invited speakers**

**+ project discussions**

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## COURSEWORK

### Weekly:

- Read a set of technical papers, write summaries of the papers (3 paragraphs), write critiques of the papers – 3 good things and why, 3 weakness and why
- Lead a discussion of 1/Nth of the papers (N=# of students in class)
- Participate in a discussion of ALL of the papers
- Participate in a discussion of the larger research issues/opportunities/challenges for that topic

### Project:

- Using one of the identified DI-computing systems infrastructures, define and complete an innovative data-intensive computing systems project
  - “may (but need not) give an insight for an application, but must shed light on a data-intensive computing systems question”
- Present and Document the Project in Compelling Fashion

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## DATA-INTENSIVE COMPUTING INFRASTRUCTURES

### Encouraged:

- Presto/Blockus (my group w/ HP)
- Cleversafe (systems group + local startup)
- Graphlab/GraphChi (low-level graph computing engine)

### Other possibilities:

- Staples of Data-intensive computing: Hadoop, VoltDB/ HadoopDB, Cassandra, Memcached, MongoDB
- Other interesting infrastructures?

**Challenge: Identify early and qualify robustness and capabilities**

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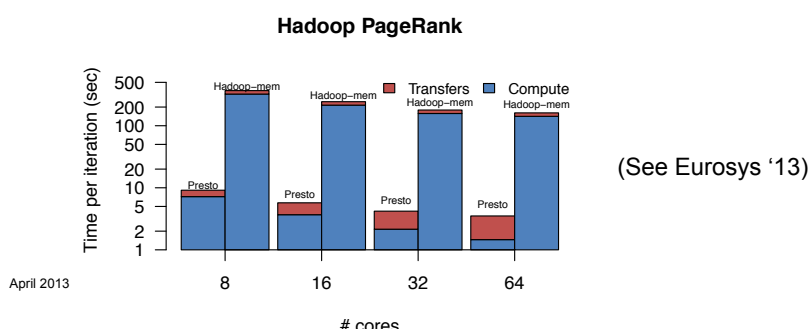
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## BLOCKUS: SCALABLE “BIG DATA” ANALYTICS IN R

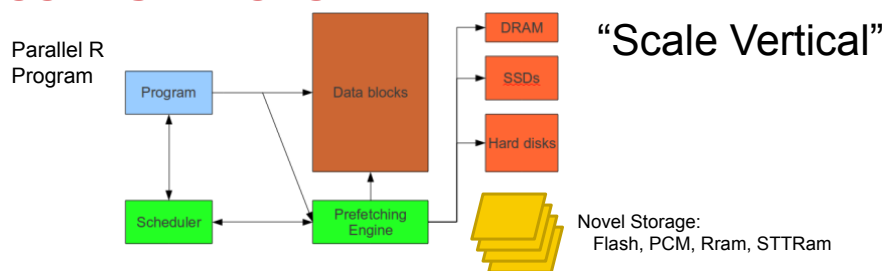
Leverage rich, widely-adopted R Programming environment

- + simple parallelism extensions: Data parallel, versions, change-triggered execution

Scale-out: demonstrated scalable performance on clusters (Presto)



## BLOCKUS: SCALING TO BIG COMPUTATIONS WITH NVRAM



**Idea: Use parallel R programs (Presto), and resulting partial execution order to scale up on data sets larger than the physical memory (i.e. 500GB data set on computer with 10GB memory)**

- Exploit high bandwidth and low-latency of NVRAM
- Exploit workload and algorithm information
- Exploit structured parallelism

**Pursuing 10-100x improvements, on a large class of programs (Data Mining, Bioinformatics, Large graphs)**

- Automatic data movement;

Completing 1<sup>st</sup> generation NVRAM experiments

# CLEVERSAFE

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## Cleversafe Company Info

- Privately held company, founded in 2004 at IIT by Chris Gladwin
- Sell software and/or hardware solutions to store data
- Based on the idea of Forward Error Correction applied to storage
- Customers needing to reliably store between 1 PB - 10 EB of storage at low cost
  - Example: Shutterfly - currently stores 30 PB
- Customers needing a very secure storage solution
  - Example: Intelligence Agencies foreign unsecure data centers
- Unique capability for multi-site deployments



## The Math behind Information Dispersal



Reed-Solomon is Linear Algebra - solving a system of equations

Based on forward error correction

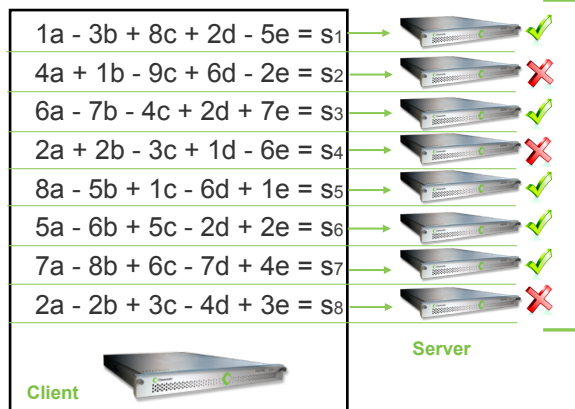
Compute some redundant information that can correct a future loss

Reed-Solomon as an Forward Error Correction (FEC) code

Perfectly efficient in storage space

Supports any desired fault tolerance

Example encoding,  $k=5$ ,  $n=8$



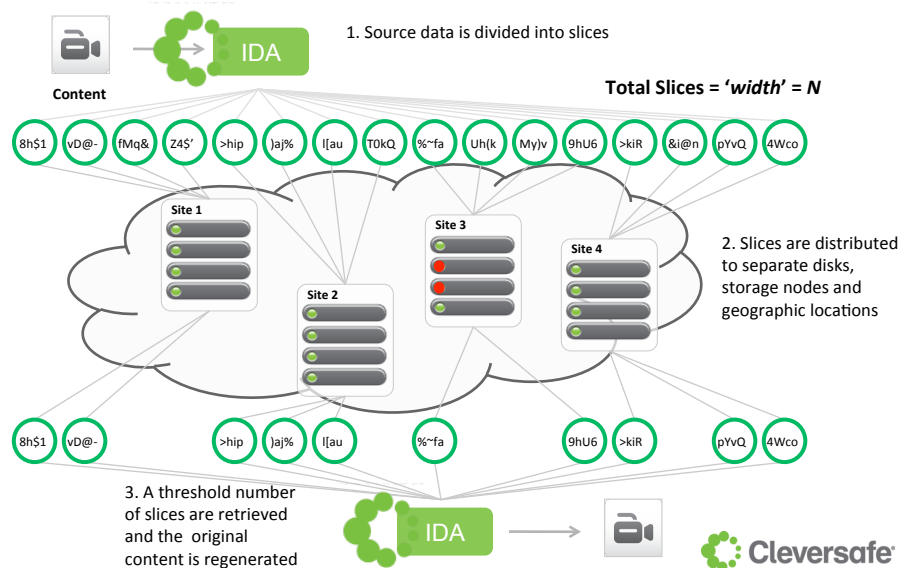
- Solving for  $k$  variables
- Requires knowing any  $k$  results
- Therefore we can lose  $(n-k)$  results
- Data overhead on the disk and on the wire is  $(n/k)$



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## How Dispersed Storage Technology Works

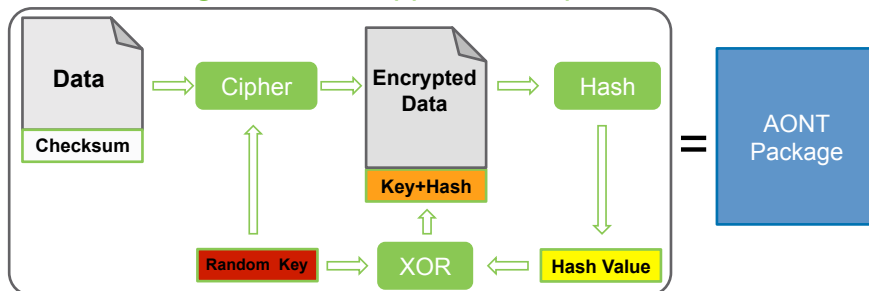


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## Security - Cleversafe

All or Nothing Transform applied to dispersal



**Confidentiality** – individual slices are useless

**Integrity** – data can be verified after reconstruction

**Availability** – threshold of slices reconstruct original



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## Scalability / Performance

- Allow building exabyte scale systems
- Achieved by assigning a namespace range to each server - no central index of data
- Each server stores data assigned to it on multiple disks
- 12 disks x 3 TB = 36 TB
- 84 disks x 4 TB = 336 TB
- Typical system has 100+ server nodes
- Related to scalability is performance – the larger the system, the higher the performance requirement
  - System scales horizontally – so as size grows, performance grows linearly
  - Requires no single point of contention for IO



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## GRAPHLAB/GRAPHCHI

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## PowerGraph/Graphlab/ GraphChi

Distributed Graph-Parallel Computation on Natural Graphs

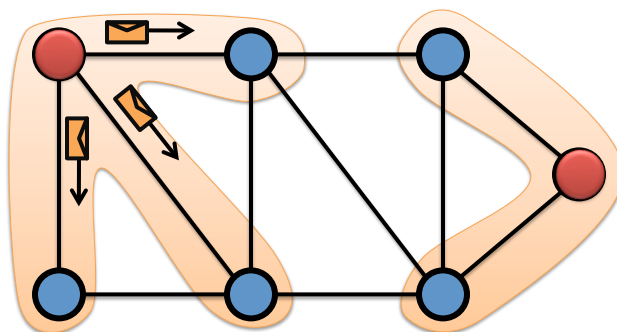
Existing *distributed* graph  
computation systems perform  
poorly on **Graphs, Natural  
Graphs, IO Systems.**

**Carnegie Mellon University**



## The Graph-Parallel Abstraction

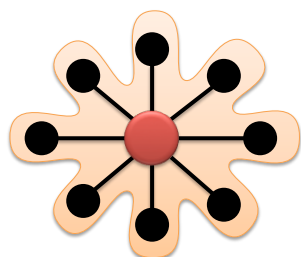
- A user-defined **Vertex-Program** runs on each vertex
- **Graph** constrains **interaction** along edges
  - Using **messages** (e.g. **Pregel** [PODC'09, SIGMOD'10])
  - Through **shared state** (e.g., **GraphLab** [UAI'10, VLDB'12])
- **Parallelism**: run multiple vertex programs simultaneously



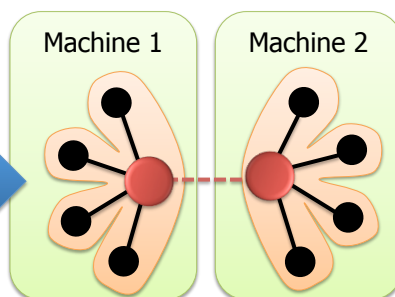
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## PowerGraph

Program  
For This



Run on This



- Split **High-Degree** vertices
- **New Abstraction** → Equivalence on Split Vertices

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## BACKGROUND READINGS

- **Presto: Distributed Machine Learning and Graph Processing with Sparse Matrices, Eurosys 2013, April 2013.**

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## READINGS

For Friday, 4/4

EMCs Digital universe 2011,2010 ([www.emc.com/leadership/programs/digital-universe.htm](http://www.emc.com/leadership/programs/digital-universe.htm))

- <http://www.emc.com/collateral/analyst-reports/idc-extracting-value-from-chaos-ar.pdf>
- <http://www.emc.com/collateral/analyst-reports/diverse-exploding-digital-universe.pdf>

HP Data Dwarfs([www.hpl.hp.com/techreports/2010/HPL-2010-115.html](http://www.hpl.hp.com/techreports/2010/HPL-2010-115.html))

For Monday, 4/9 (Erik Bodzsar, Guest lecture)

Presto <https://sites.google.com/site/uchicago/ssg/ssg/research/blockus>

For Friday, 4/12

Data-Parallel

- Page Rank <http://ilpubs.stanford.edu:8090/422/1/1999-66.pdf>
- Map Reduce <http://research.google.com/archive/mapreduce.html>

For Monday, 4/15 (Andrew Baptist, Guest Lecture)

Cleversafe

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## PROJECT ASSIGNMENT FOR NEXT WEEK (FRIDAY 4/12)

Output: 4 slide  
summary

- Which & why
- What you did
- Answer to Q's

Identify a challenging data-intensive computing project and read up on it

- What defines it as a data-intensive computing project? (as opposed to something-else intensive)
- What are some of the unique technical challenges it represents? Systems challenges?
- What is the value of having all that data? Summaries? (there's clearly a cost)
- What are some unique opportunities it represents? Where do the timeliness/quality/yield requirements come from?
- If significant improvements were possible? (speed/quality/cost) What if any new opportunities would it unlock?
- What computing infrastructure are they using? Is it efficient? Is it accessible?

Download, install, and run a data-intensive computing infrastructure

- A widely used one? (MongoDB, Hbase/H\*, Graphlab, Cassandra)
- Or get started with Presto/Blockus or Cleversafe
- What is it capable of?
- What types of problems is it particularly well suited to? Intended workload?
- Does it scales? (in data? In speed/capability?) does it scale down?
- Robustness/Resilience of the system – hw/sw, operating point/usage, does it degrade or collapse?
- Recovery and Diagnosis – what can you recover in a failure? And what can you deduce about the cause of the failure?
- What kind of hardware was designed for? (clusters, HPC) – communication, reliability, system balance issues. Distribution?
- Is it efficient? (cost, energy, algorithmically, human effort)

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## GROUND RULES FOR THE COURSE

**No “tourists” – come and come regularly**

**Active participation – come prepared, and come with something to say, and with questions to be answered**

**Push the envelope – beyond the questions framed in the papers, ideas in projects, to their logical extreme or conclusion**

**No “sacred cows” – any and all technical (and even ecosystem) topics can be opened and discussed (Andrew will shape discussion based on “productivity”)**

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