

# All-Pairs: An Abstraction for Data-Intensive Computing

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To attack very large scientific problems, users must branch out beyond computation on a single machine. Most scientists are not grid experts. Thus, they make poor decisions when faced with grid software options, job infrastructure, data transfer, and other parameters. The users get poor performance, and the grid infrastructure gets abused.

We propose that **abstractions** can provide better performance and make grids easier to use for data intensive workloads. An example of an abstraction is **All-Pairs**.

## Why an Abstraction?

- Hard problems can be defined in terms of a simple model.
- Abstractions hide messy grid details from the user.
- Thus, preventing unintended consequences of their poor choices.
- The system can optimize the structure of the workload, the tools .

## Why is All-Pairs Hard?

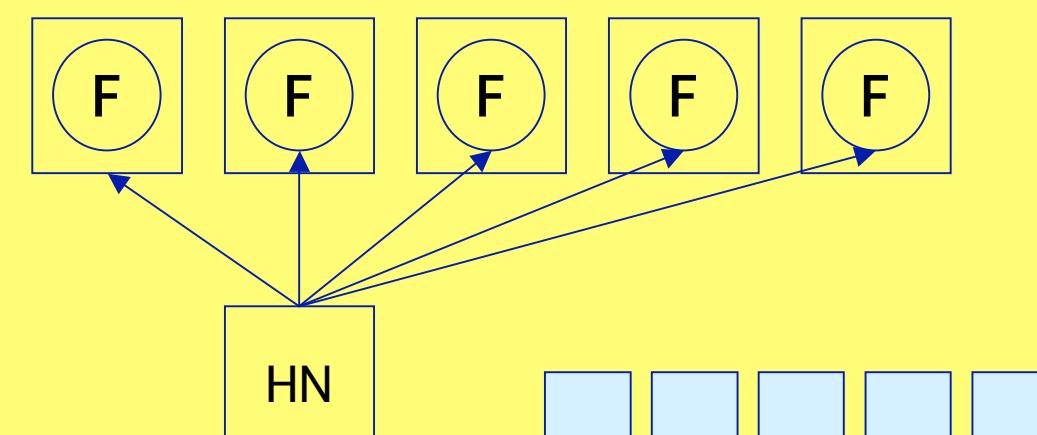
- What challenge does a bigger problem size pose?
  - Big problems mean higher minimum requirements, so fewer usable resources.
- How many CPUs to use?
  - Using more CPUs requires more data transfer in exchange for more parallelism.
- How much work do we give each machine at a time?
  - Large job sizes amortize grid overhead, but mean more evictions and badput.
- What else is different than the same problem done locally?
  - Common applications weren't designed for the grid, but users still want them.

## What Comes Next?

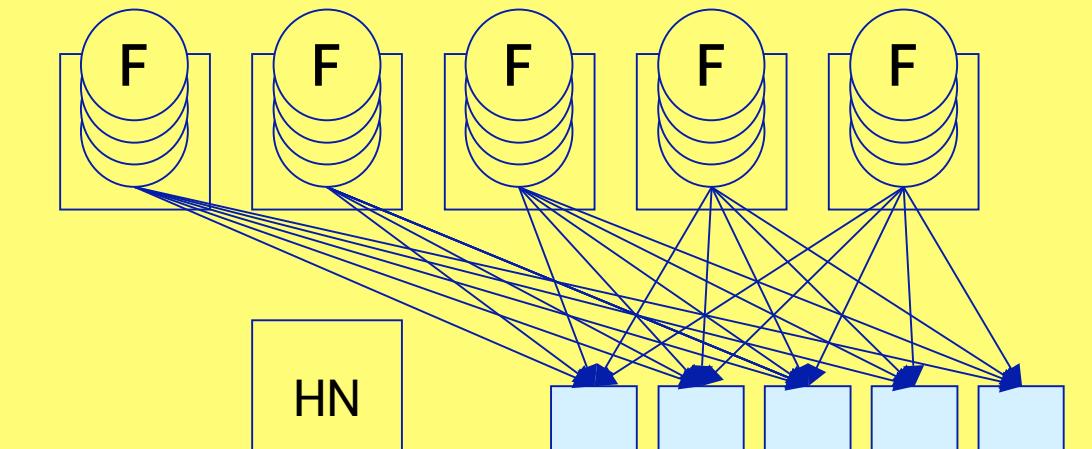
- Active Storage for data sets too large for any single node.
- A suite of abstractions and a language to define workloads.

## Non-Expert Grid User with 500 CPUs

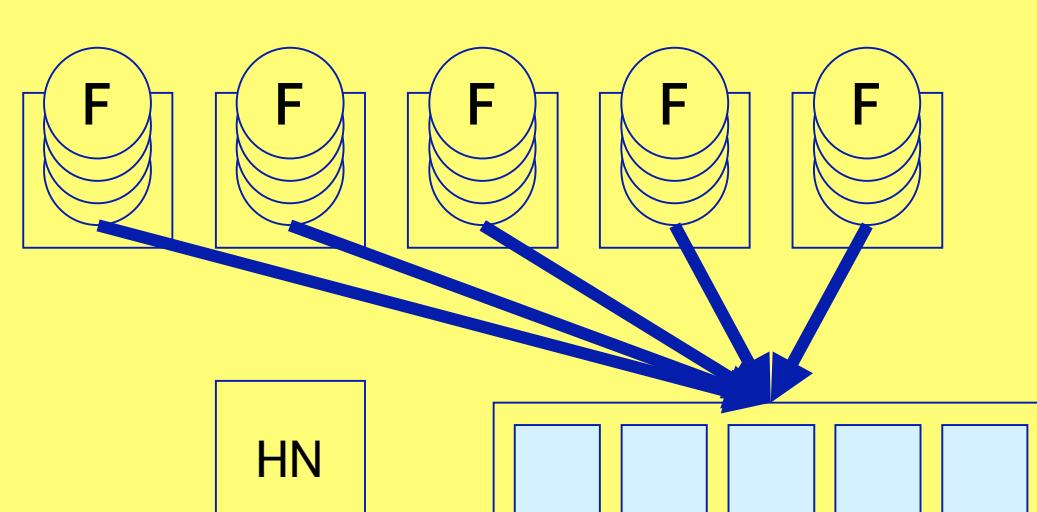
Try 1: Each F is a batch job.  
Failure: Dispatch latency >> F runtime.



Try 2: Each row is a batch job.  
Failure: Too many small ops on FS.



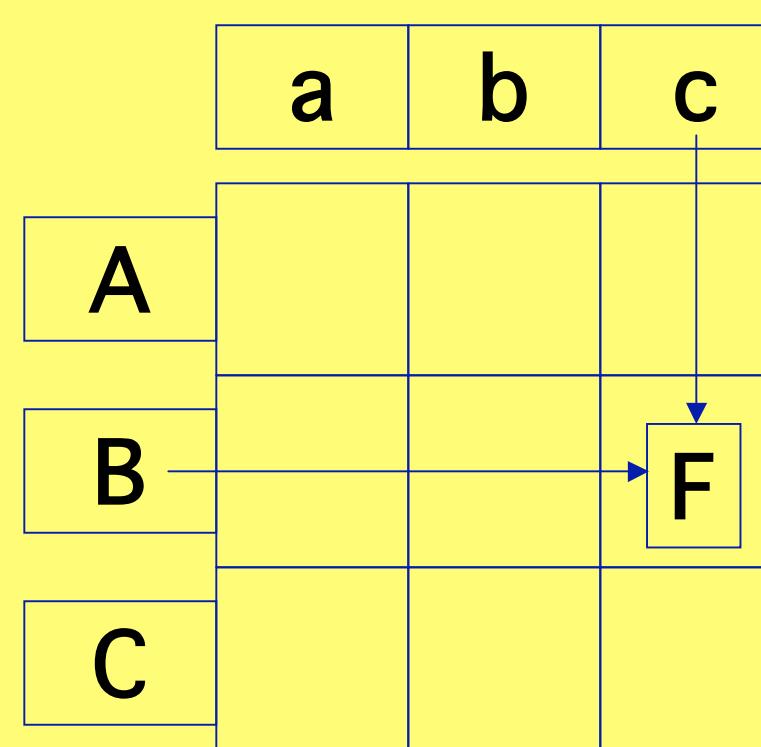
Try 3: Bundle all files into one package.  
Failure: Everyone loads 1GB at once.



Try 4: User gives up and attempts to solve an easier or smaller problem.



## All-Pairs Abstraction

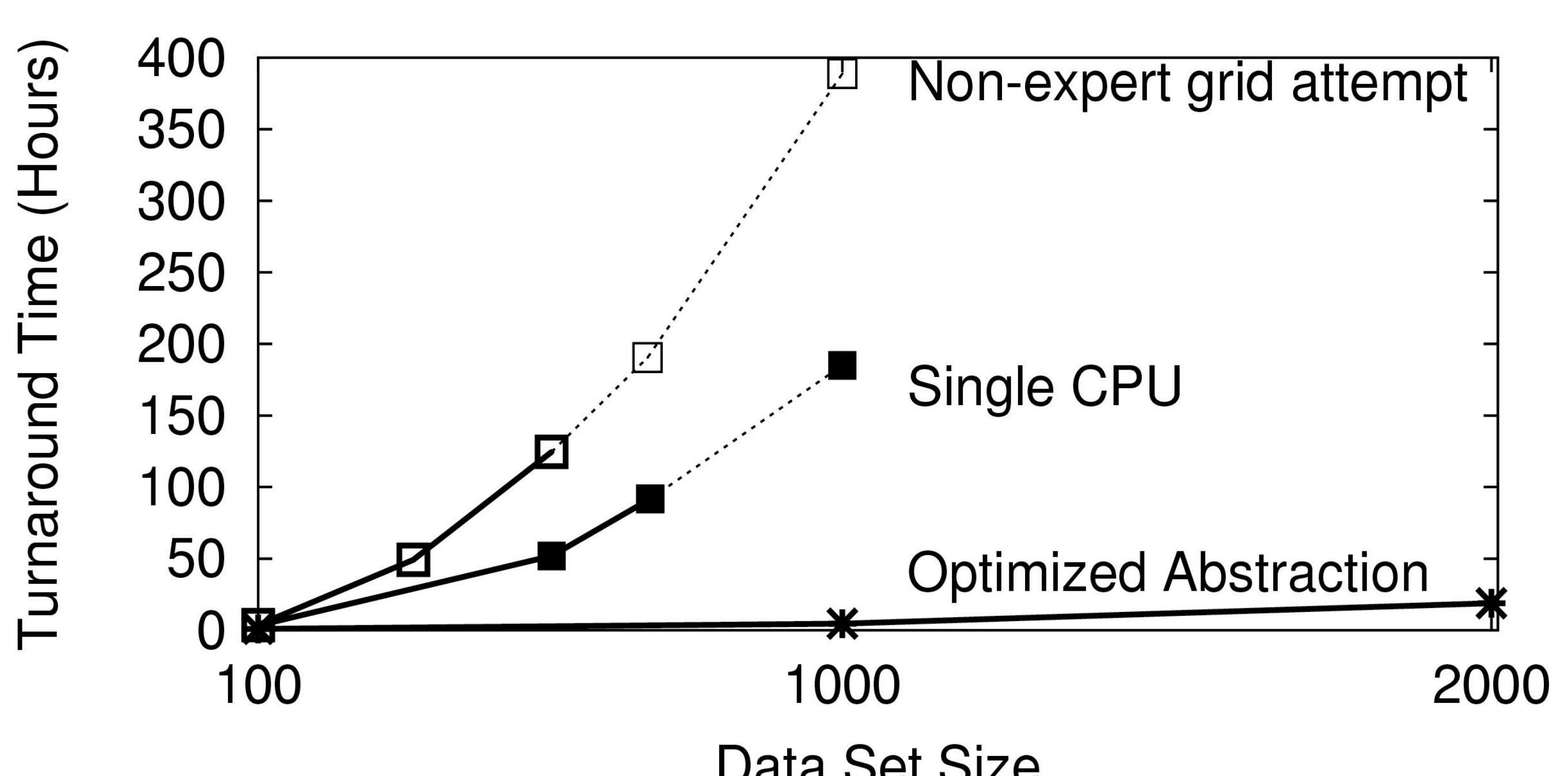


General All-Pairs Problem  
A function applied to all possible pairs of elements from two sets.



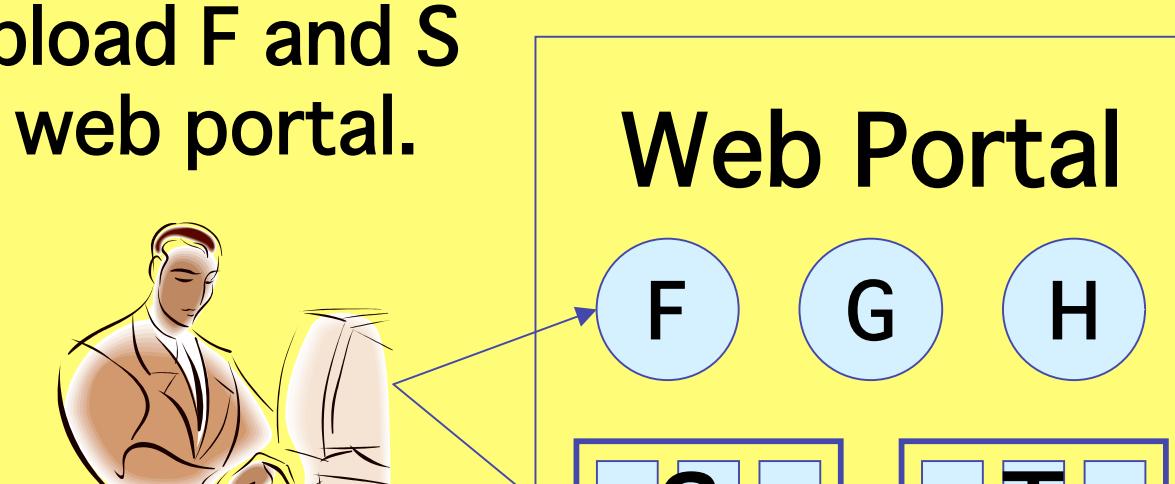
Biometric All-Pairs Face Comparison  
Other applications include data mining and computational biology.

## Initial Results on Biometric Workload



## Notre Dame All-Pairs Production System

- 1 - Upload F and S into web portal.



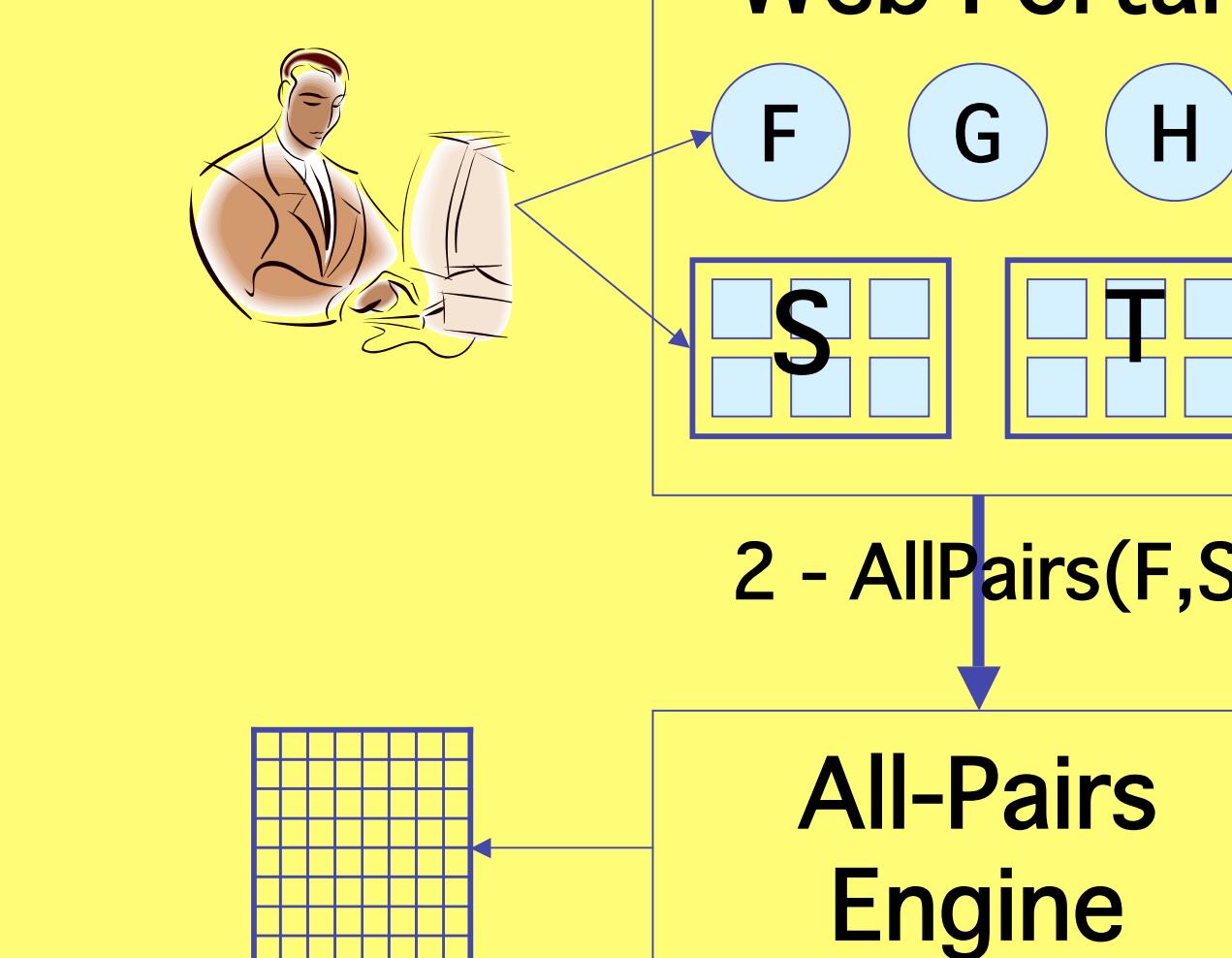
Web Portal

F, G, H

S, T

2 - AllPairs(F,S)

- 6 - Return result matrix to user.



All-Pairs Engine

F, S, T

3 - O(log n) distribution by spanning tree.

- 4 - Choose optimal partitioning and submit batch jobs.

3 - O(log n) distribution by spanning tree.

4 - Choose optimal partitioning and submit batch jobs.

5 - Collect and assemble results.

6 - Return result matrix to user.

7 - Optimize storage and bandwidth usage.

8 - Monitor and adjust system performance.

9 - Repeat steps 4-8 as needed.

10 - Shut down system when complete.

11 - Clean up temporary files and logs.

12 - Document system configuration and results.

13 - Archive system configuration and results.

14 - Repeat steps 1-13 for next iteration.

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