

Active Storage For Large-Scale Data Mining and Multimedia

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Active Disks

for Data Mining



Outline

Network-Attached Disks

Industry Trends

Active Disks

Applications

Speedups

Ideal Application



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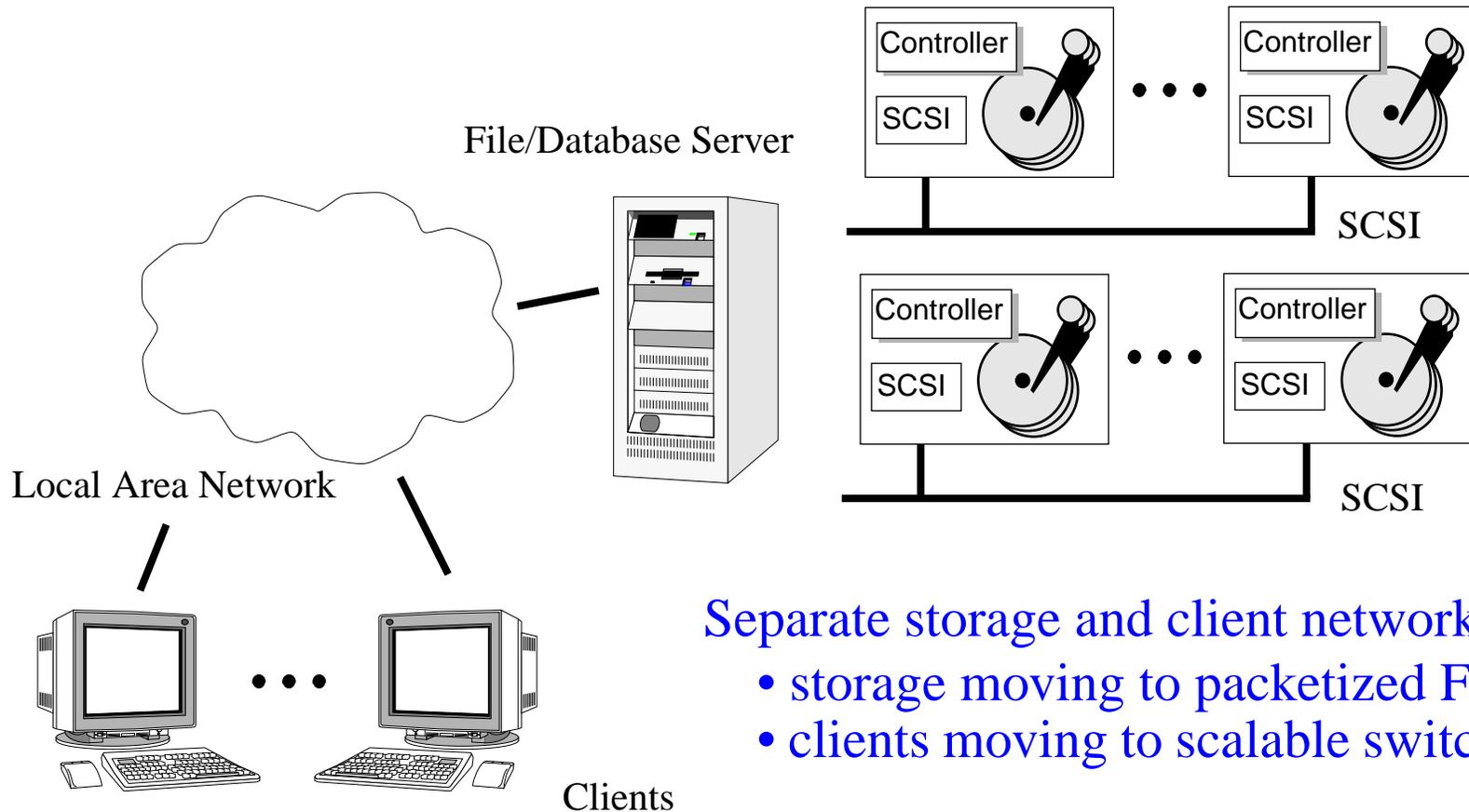
Active Disks

for Data Mining



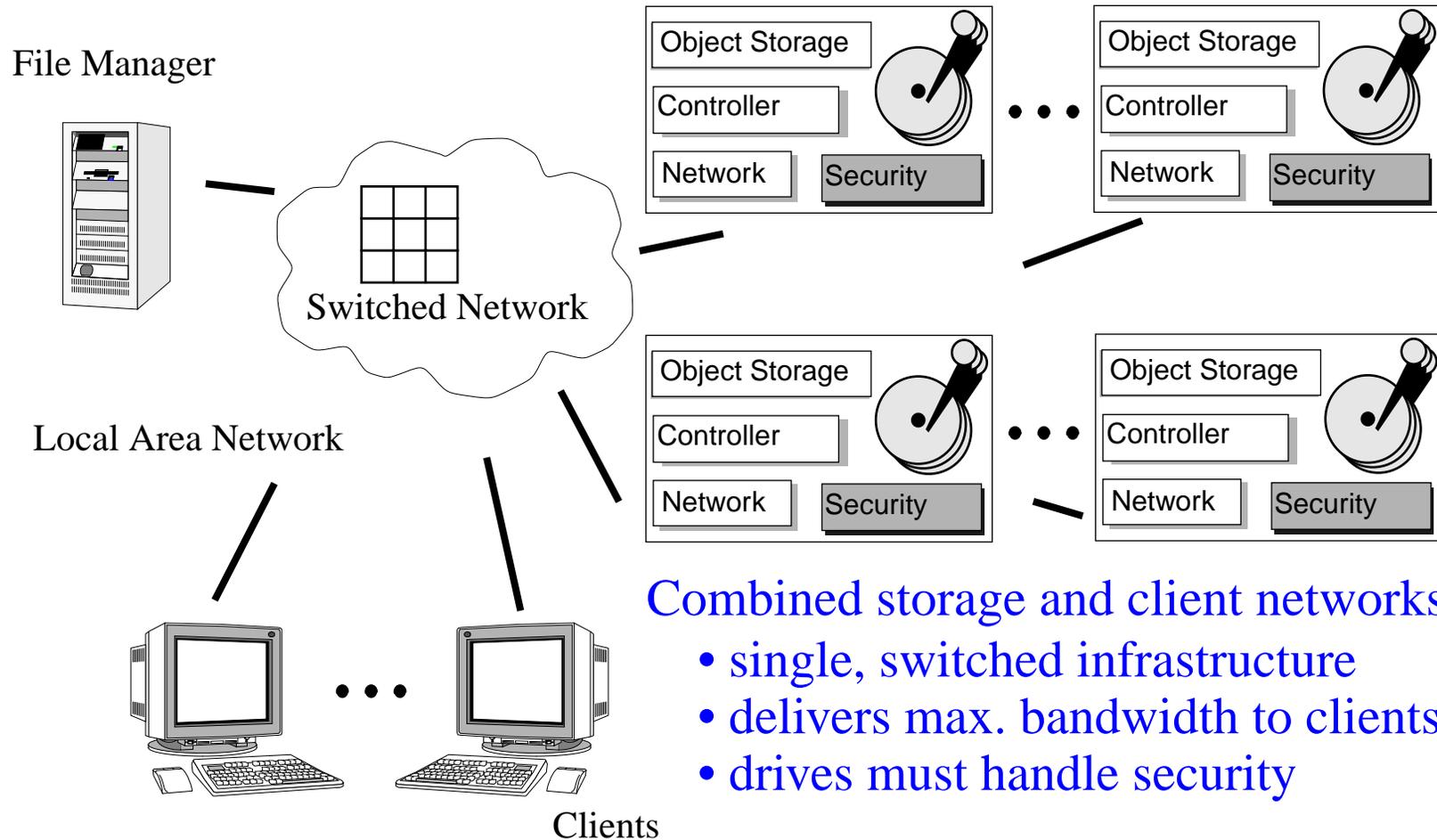
Today's Server-Attached Disks

Store-and-forward data copy through server machine



Network-Attached Secure Disks

Eliminate server bottleneck w/ network-attached



Combined storage and client networks

- single, switched infrastructure
- delivers max. bandwidth to clients
- drives must handle security



Storage Industry Trends

Drive interface is changing

- Drive bandwidth - now 15 MB/s and rising at 40% per year
- Disk-embedded, high-speed, packetized SCSI
- E.g. 100-1000 Mb/s Fibrechannel interconnect

Competition is increasingly based on code in the drive

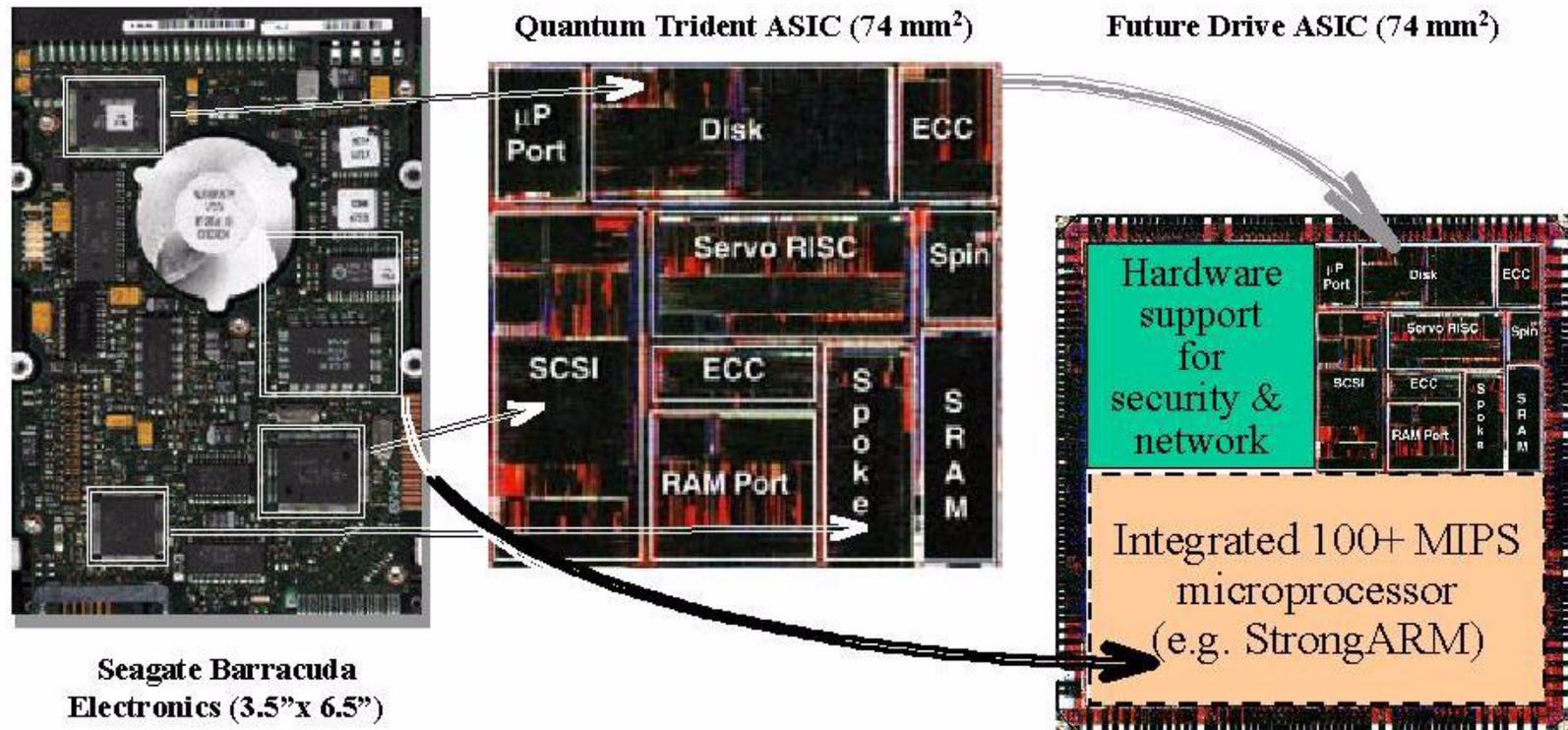
- RAID support to off-load parity update
- Dynamic mapping underneath SCSI
- Increasingly sophisticated prefetching/caching
- Cost of managing storage 3-7x storage cost per year

On-drive cycles are available

- RISC core coming in integrated function drive ASIC
- Control processor not on critical path



Excess Device Cycles Are Coming



Higher and higher levels of integration in drive electronics

- specialized drive chips combined into single ASIC
- technology trends push toward integrated control processor
- 100 MHz, 32-bit superscalar w/ 2 MB on-chip RAM available in '98



Opportunity

Sampling of large-scale database systems

System	Processing (MHz)		Data Rate (MB/s)	
	CPU	Disks	CPU	Disks
Compaq TPC-C	4x200=800	113x25=2,800	133	1,130
Microsoft Terraserver	4x400=1,600	320x25=8,000	532	3,200
Digital 500 TPC-C	1x500=500	61x25=1,525	266	610
Digital 4100 TPC-D	4x466=1,864	82x25=2,050	532	820

- assume disk offers equivalent of 25 host MHz
- assume disk sustained data rate of 10 MB/s

More cycles and MB/s in disks than in host



Active Disk Fundamentals

Basic advantages of an Active Disks system

- **parallel processing** - lots of disks
- **bandwidth reduction** - filtering operations common
- **scheduling** - little bit of computation can go a long way

Appropriate applications

- execution time dominated by data-intensive core
- allows parallel implementation of core
- small memory footprint
- small number of cycles per byte of data processed



Simple Performance Model

Execution = max(processing, transfer, disk access)

- **selectivity** is $\#bytes\text{-input} / \#bytes\text{-output}$
- assume fully overlapped pipeline (avoids Amdahl's law)

Processing time per byte

- Host: $\#cycles/byte / \#host\text{-cpu-speed}$
- Disks: $\#cycles/byte / (\#disk\text{-cpu-speed} * \#disks)$

Transfer time per overall byte

- Host: $1 / \#interconnect\text{-data-rate}$
- Disks: $(1 / \#selectivity) / \#interconnect\text{-data-rate}$

Disk access time per overall byte

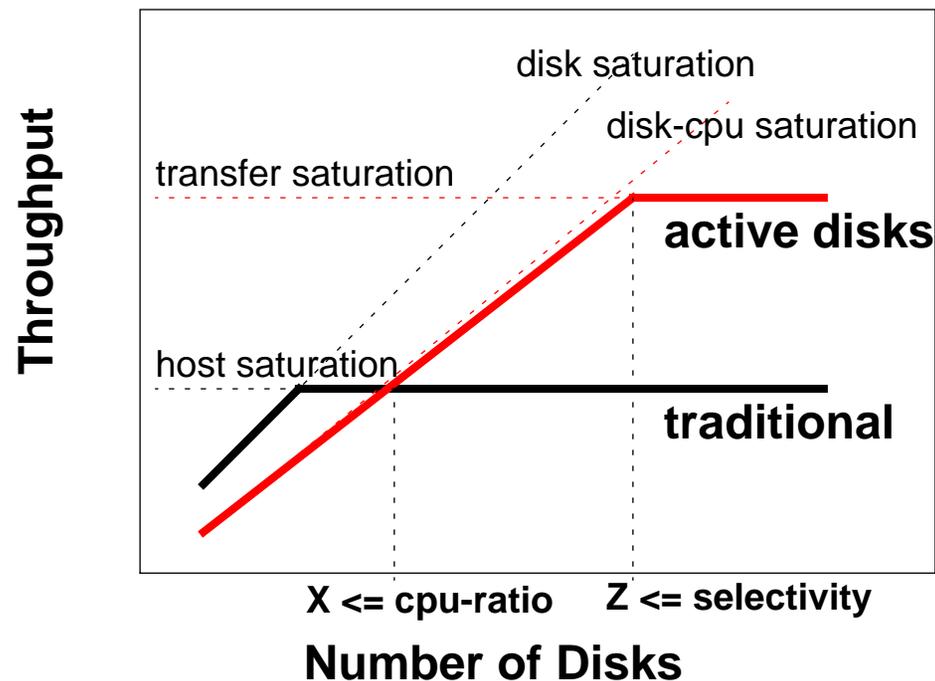
- Both: $1 / (\#disk\text{-data-rate} * \#disks)$



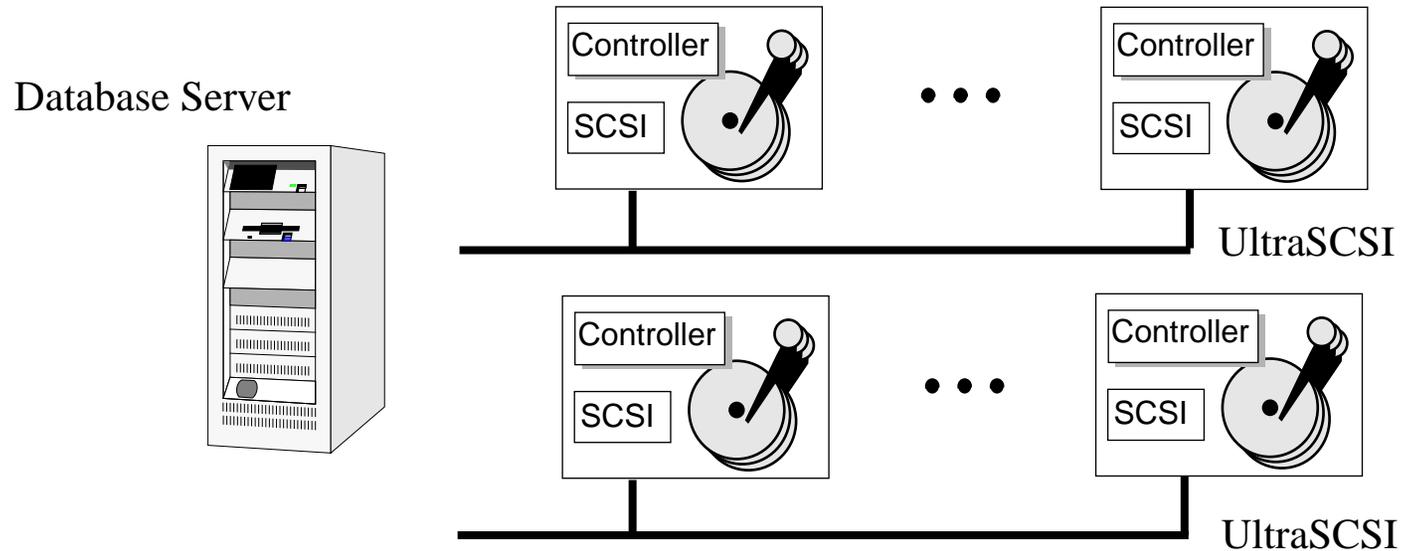
Throughput Model

Speedup

- $(\# \text{disks} * \text{disk-cpu-speed}) / \text{host-cpu-speed}$ [$X < \# \text{disks} < Z$]
- $> \text{selectivity} * (\text{host-cpu} / \text{disk-cpu-speed})$ [$\# \text{disks} > Z$]
- $(\text{host-cpu} / \text{disk-cpu-speed}) \sim 5$ per host cpu (2 generations)



Traditional Server

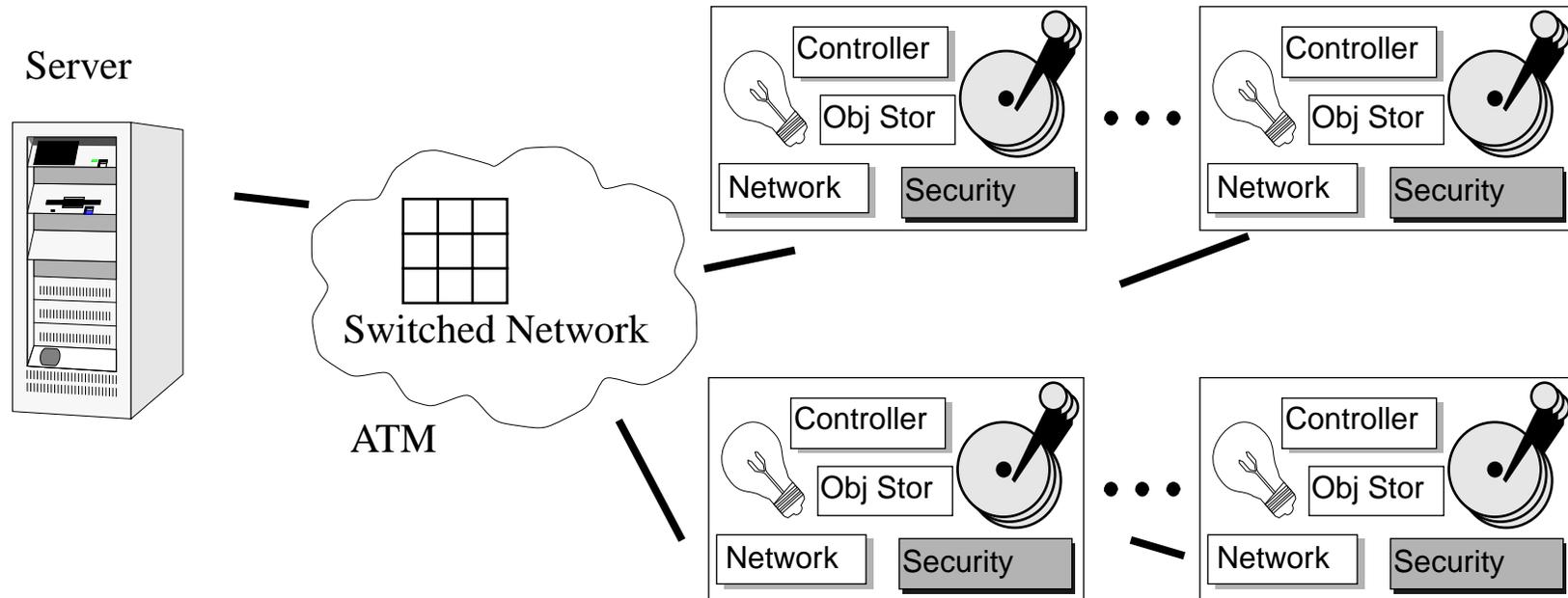


Digital AlphaServer 500/500

- 500 MHz, 256 MB memory
- disks - Seagate Cheetah
- 4.5 GB, 10,000 RPM, 11.2 MB/s



Server with Active Disks



Prototype Active Disks

- Digital AXP 3000/400 workstation
- 133 MHz, software NASD prototype
- Seagate Medallist disks



Data-Intensive Applications

Database - nearest neighbor search

- k records closest to input record
- with large number of attributes, reduces to scan

Data mining - association rules [Agrawal95]

- count of *1-itemsets* and *2-itemsets*

Multimedia - edge detection [Smith95]

- detect edges in an image

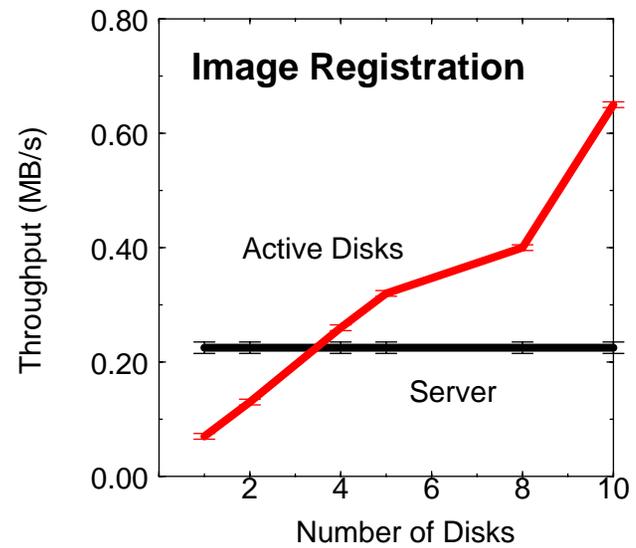
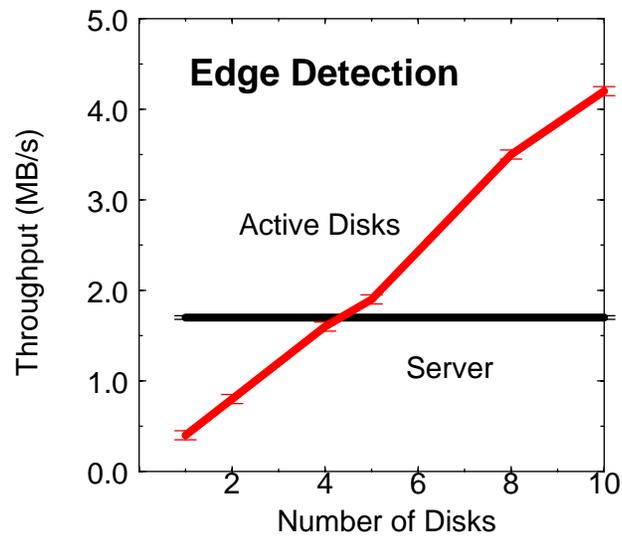
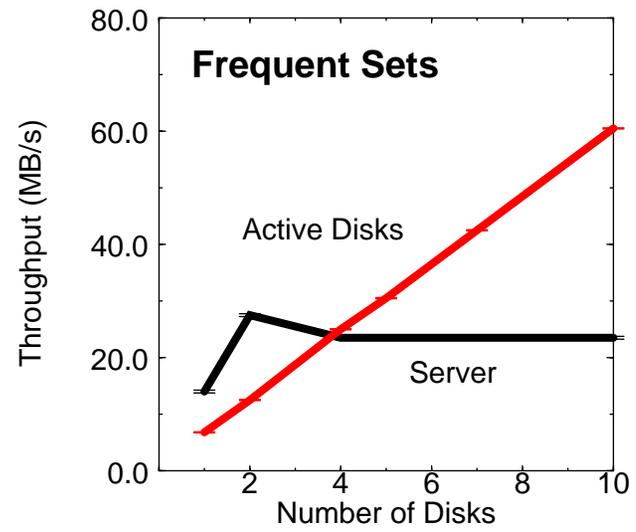
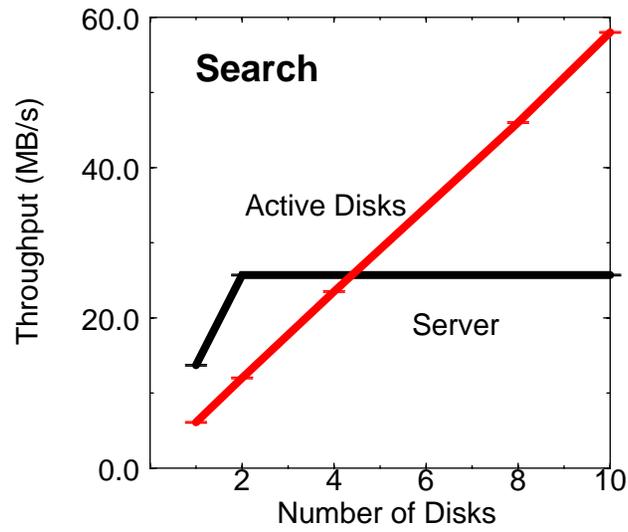


Multimedia - image registration [Welling97]

- find rotation and translation from reference image



Performance with Active Disks



Application Characteristics

Critical properties for Active Disk success

- **cycles/byte => maximum throughput**
- **memory footprint**
- **selectivity => network bandwidth**

application	input	computation (cycles/byte)	throughput (MB/s)	memory (KB)	selectivity (factor)	bandwidth (MB/s)
Select	m=1%	7	28.6	-	100	0.3
Search	k=10	17	11.8	0.6	100,000	0.0001
Frequent Sets	s=0.25%	15	13.3	220	14,000	0.001
Edge Detection	t=75	394	0.51	256	175	0.002
Image Registration	-	2387*	0.08	768	230	0.0003
Select	m=20%	7	28.6	-	5	5.7
Frequent Sets	s=0.025%	15	13.3	2,000	14,000	0.001
Edge Detection	t=20	394	0.51	256	3	0.2



Scheduling/Batching Applications

Parallel Sample Sort

- computation at drives saves one full network transfer
- data goes to the “right” place sooner
- instead of exchanging data among client nodes

Step	Parallel Sample Sort	Sample Sort for Active Disks
1	Sample data	Sample data using <code>sample()</code> on drives
2	Create distribution histogram	Create distribution histogram
3	Read data into clients from local disks	Read data into clients using <code>scan()</code>
4	Distribute data among clients by histogram	
5	Sort locally at each client	Sort locally at each client
6	Write back to local disks in sorted order	Write back to drives in sorted order



Future Directions

Executables downloaded into drives

- safe, secure, controllable, continuous media

Applications: schedule, semantic extension

- sort, join, collective I/O, video, web, storage mgmt

Compiler-assisted “Disklet” definition

- library, framework support, automatic partitioning

Active networking for storage

- NASD capabilities extended to network components
- in network: protocol conversion, caching, dynamic routing

