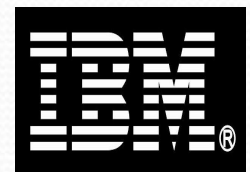


Performance Analysis of a Multi-Tenant In-memory Data Grid

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^ΨNorth Carolina State University

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Key-Value Store Users

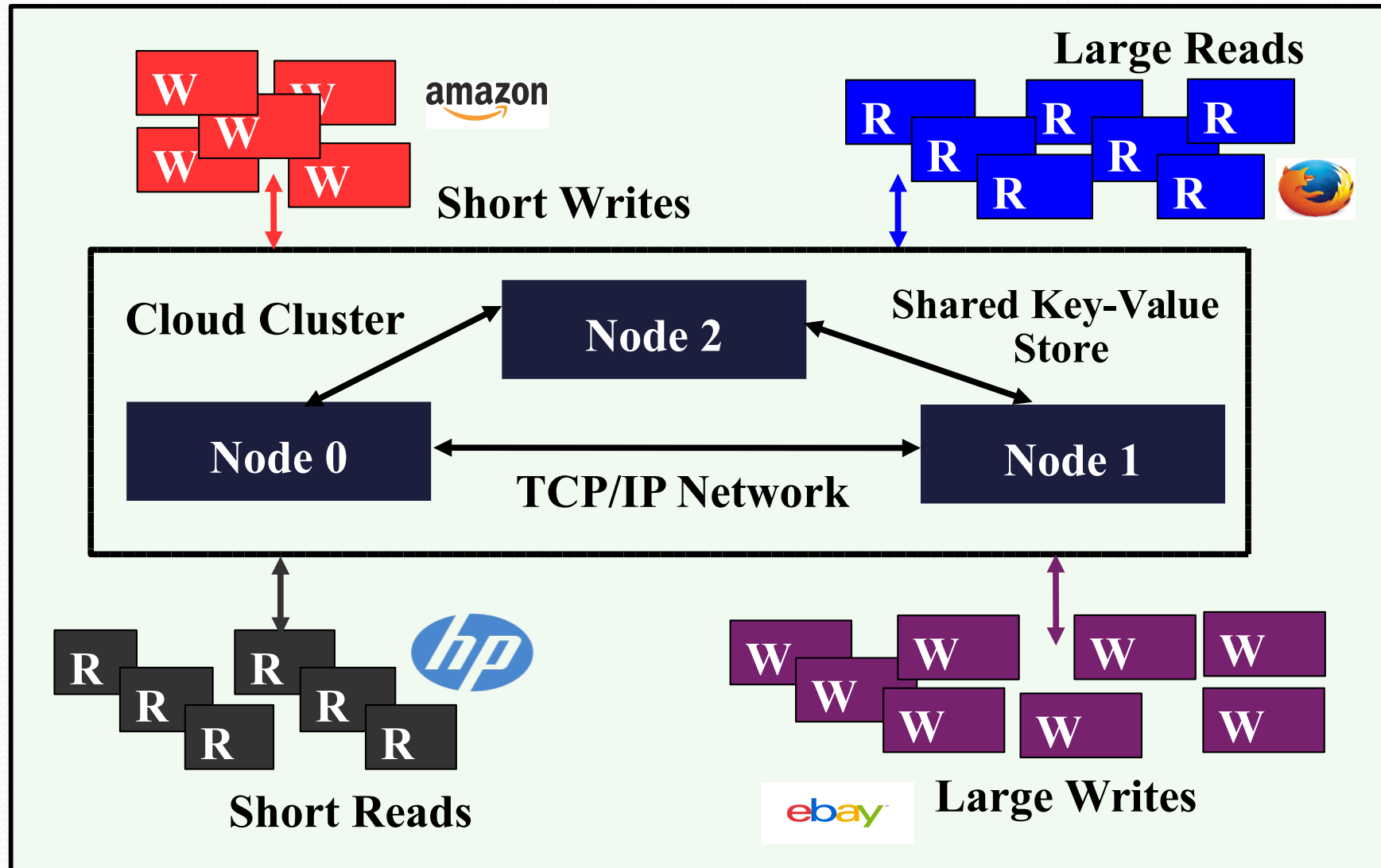
| Key-Value Stores | Open Source |
|-------------------|-----------------|
| <i>BigTable</i> | <i>No</i> |
| <i>Pnut</i> | <i>No</i> |
| <i>DynamoDB</i> | <i>No</i> |
| <i>MongoDB</i> | <i>Yes</i> |
| <i>Voldemort</i> | <i>Yes</i> |
| <i>HBase</i> | <i>Yes</i> |
| <i>HyperTable</i> | <i>Yes</i> |
| <i>ZBase</i> | <i>Yes</i> |
| <i>Cassandra</i> | <i>Yes</i> |
| <i>MemcacheD</i> | <i>Yes</i> |
| <i>Redis</i> | <i>Yes</i> |
| <i>Hazelcast</i> | <i>Yes</i> |
| <i>Comet</i> | <i>Academic</i> |
| <i>Silt</i> | <i>Academic</i> |



Wide Commercial and Academic Usage

Motivation

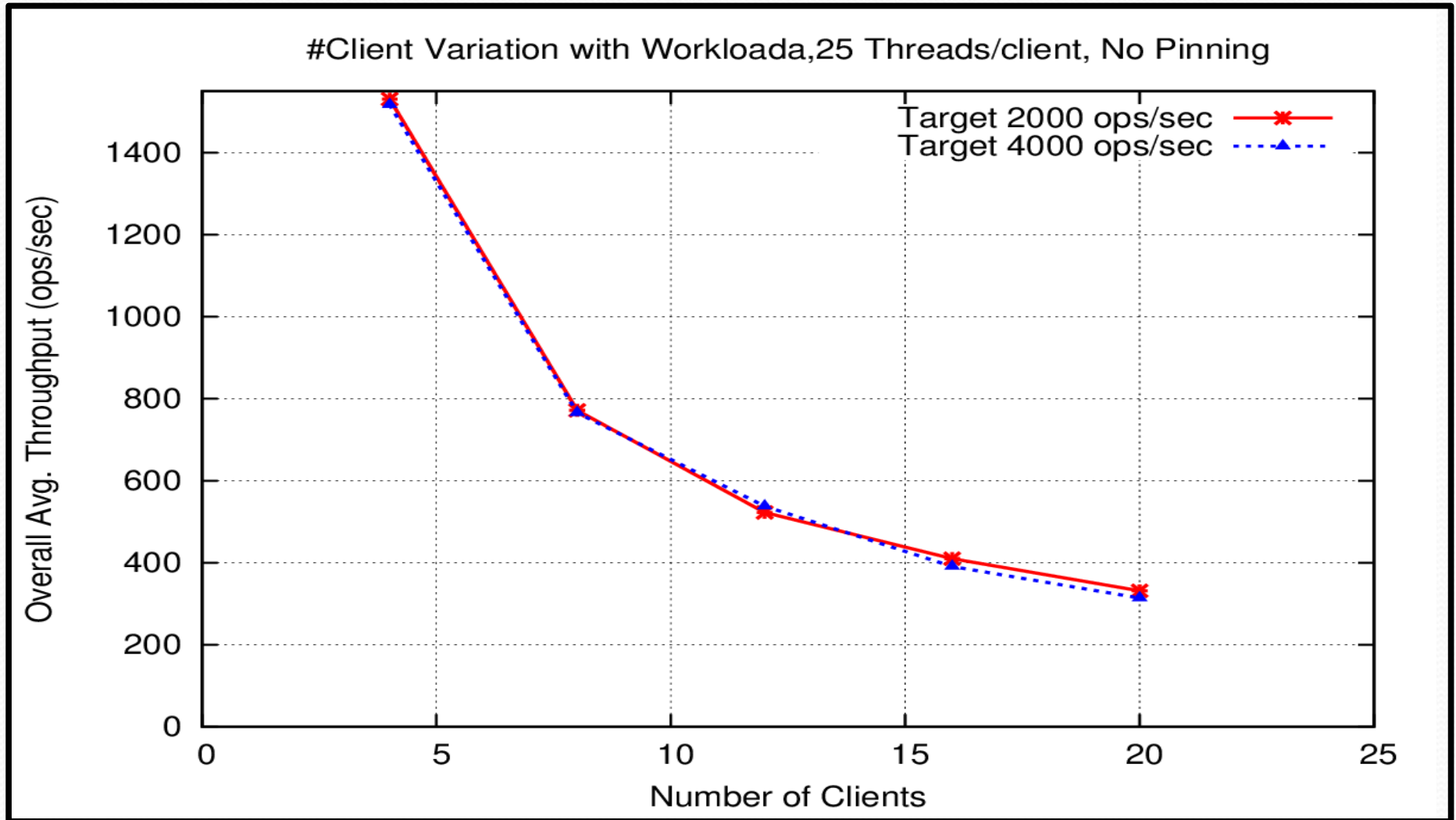
- ✓ Variable Unpredictable Workload Dynamics
- ✓ Problem ? Multi-Tenant Interference



Objectives

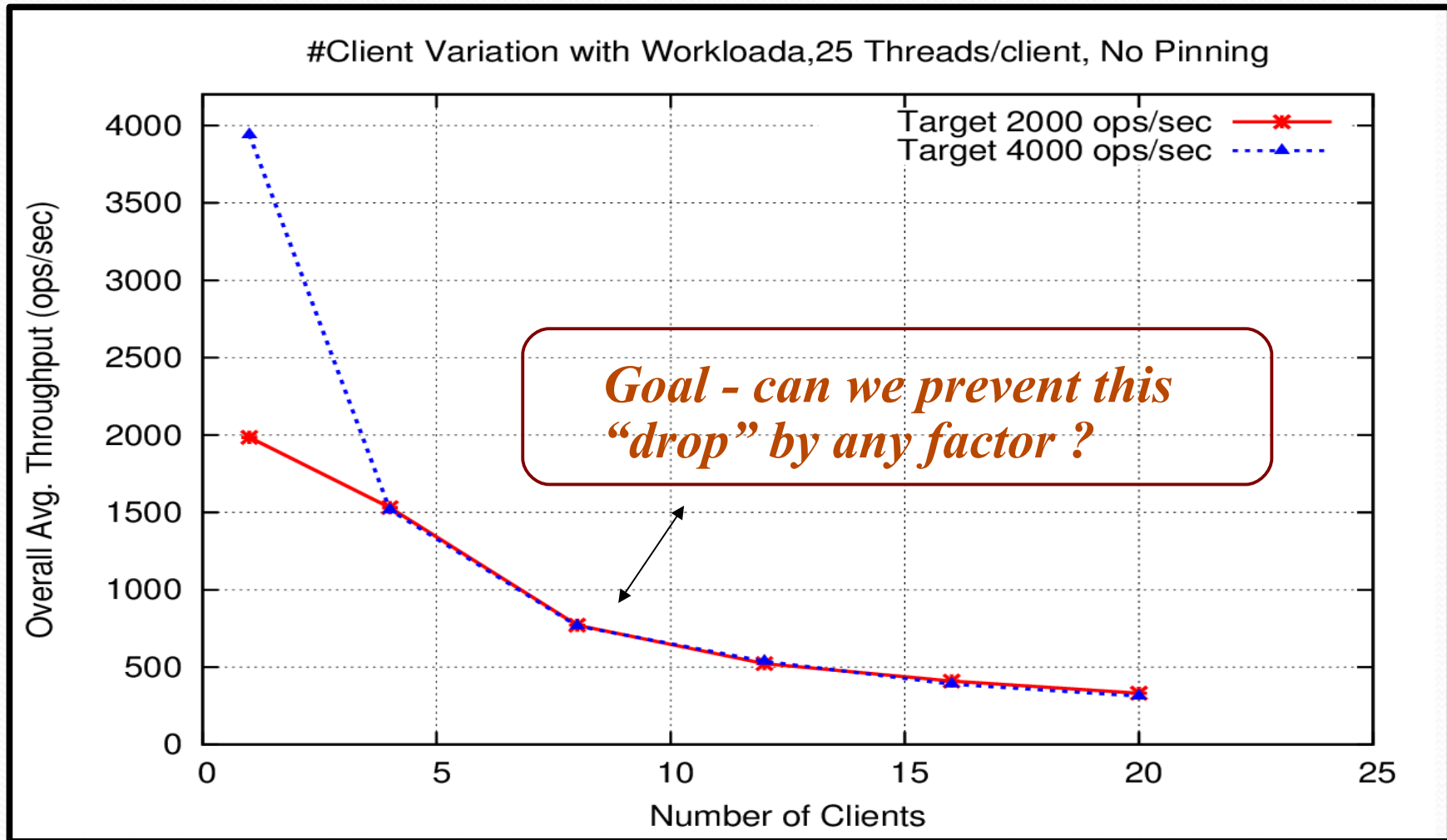
- *Understand Hazelcast in the context of multi-tenancy.*
- *How high is the performance degradation ?*
- *Observe performance characteristics with varying number of clients, workload type, target throughput, thread count.*
- *What causes degradation ? Investigate performance bottlenecks in Hazelcast to eliminate contention.*

Problem



- ✓ *Decrease in throughput (ops/sec) with increase in number of clients*
- ✓ *Presence of **contention** leading to performance degradation*

Problem

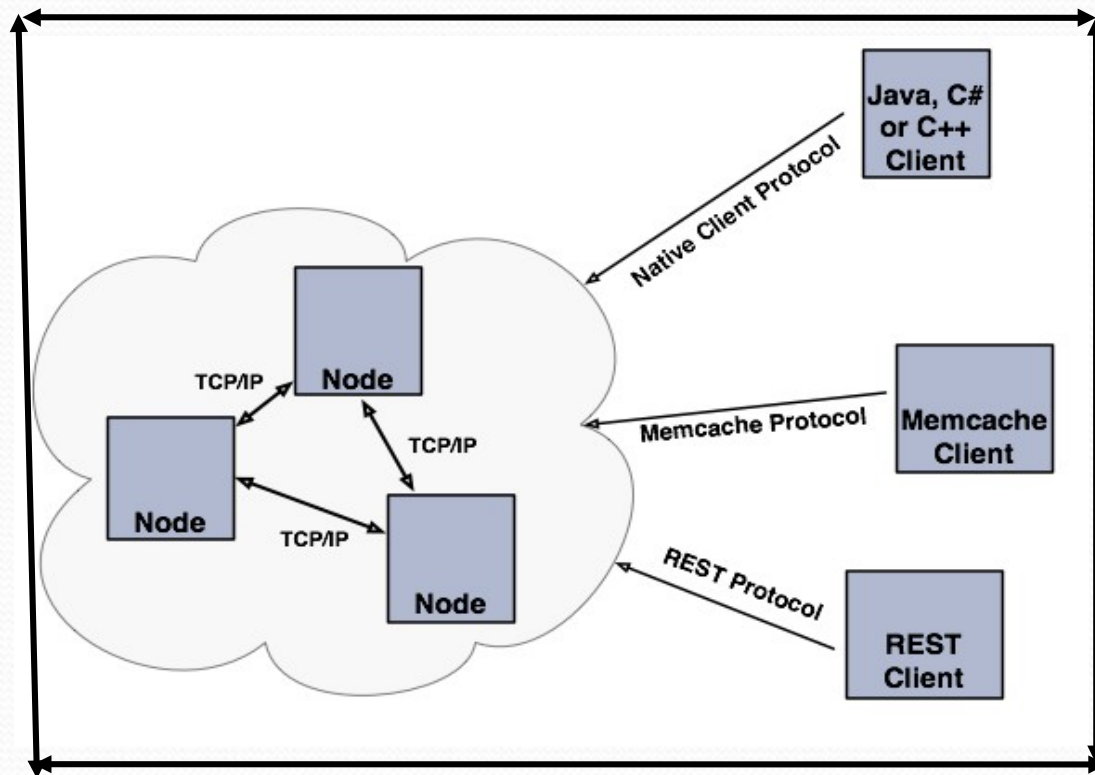


Problems ? Resource Contention, Performance Degradation

Aim – Understand the source of contention, Find out performance bottlenecks in Hazelcast, How to alleviate contention ??

Hazelcast Architecture

Client to Cluster

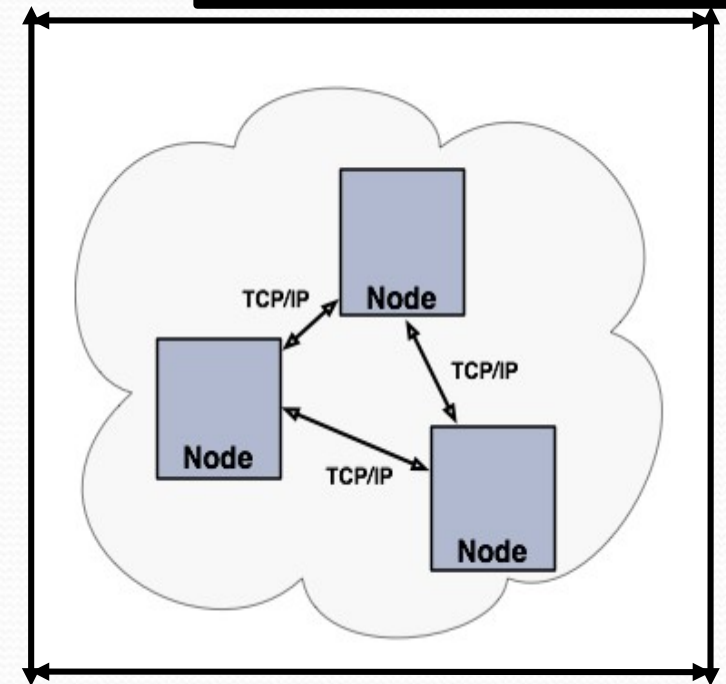


Hazelcast

Client – No data
Default – 271 Partitions

- ✓ Open-source In-memory Data Grid
- ✓ Decentralized Architecture
- ✓ TCP/IP based communication between nodes

**Node contains Data
Primary & Replica**

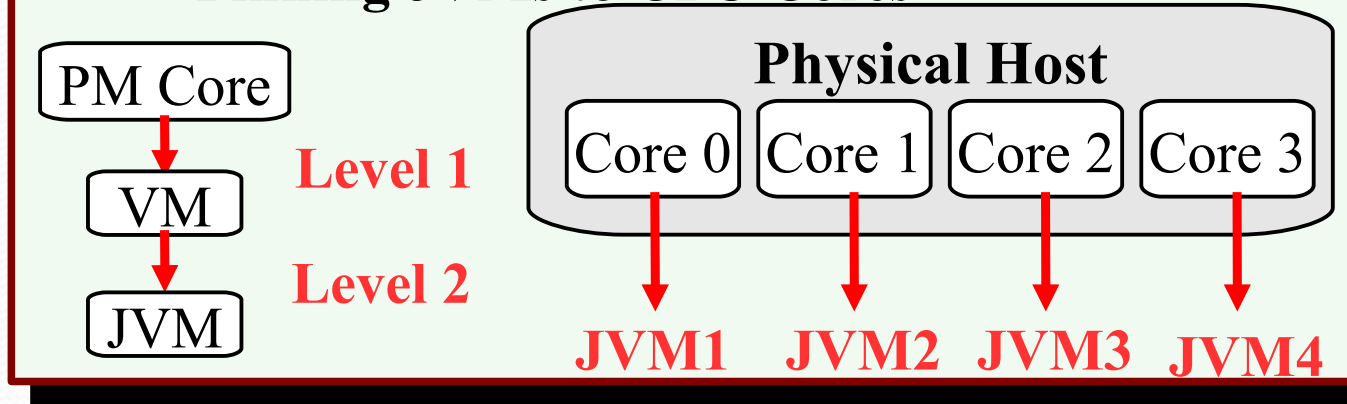


Peer to Peer

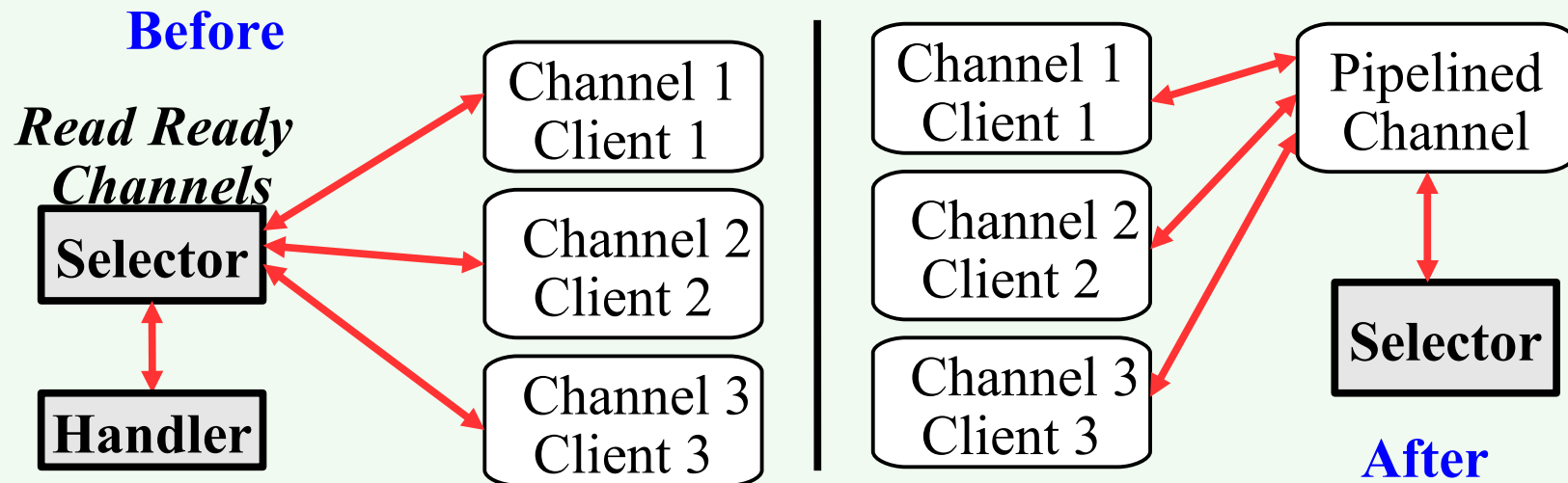
Solution Approach

- ✓ Pin JVM to CPU Cores
- ✓ Coalesce Socket Channels

Pinning JVMs to CPU Cores



Pipelining of Client Socket Channels



Implementation

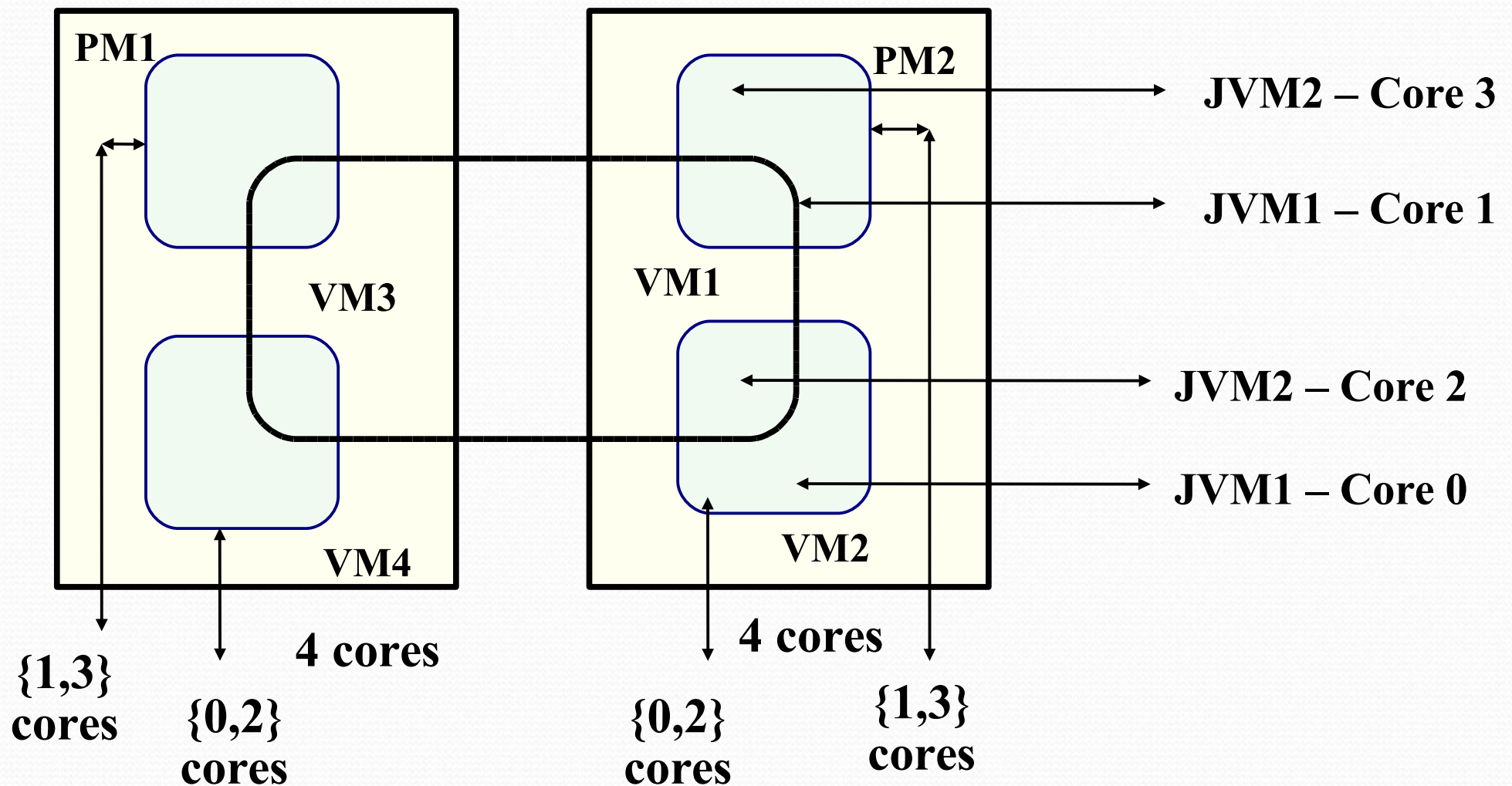
Software

- Java
- Netty Library Used
- Evaluation - YCSB – Yahoo Cloud Serving Benchmark

Hardware/OS Platform

- Nodes on HGCC Cluster
 - Quad-core Xeon 2.53GHz CPU, 8GB memory
- VMs running with Ubuntu 12.04 32bit with 4 GB memory and 2 vpcus on 2 HGCC nodes

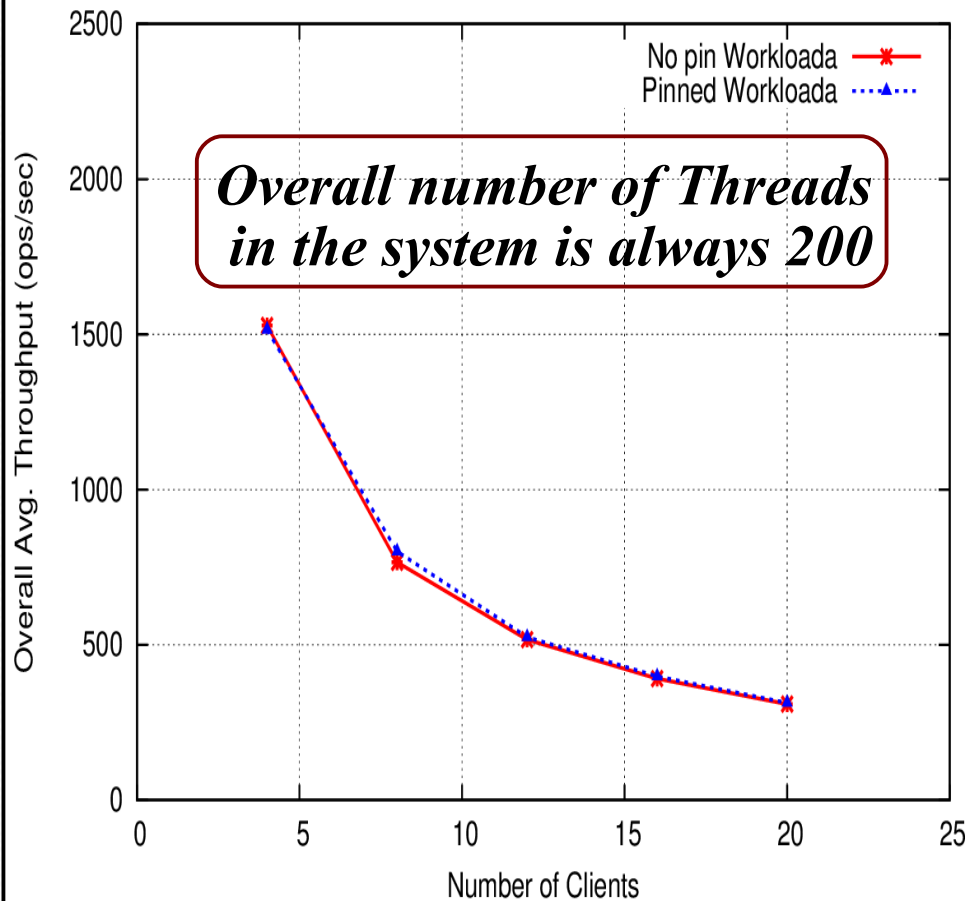
Experimental Set-Up



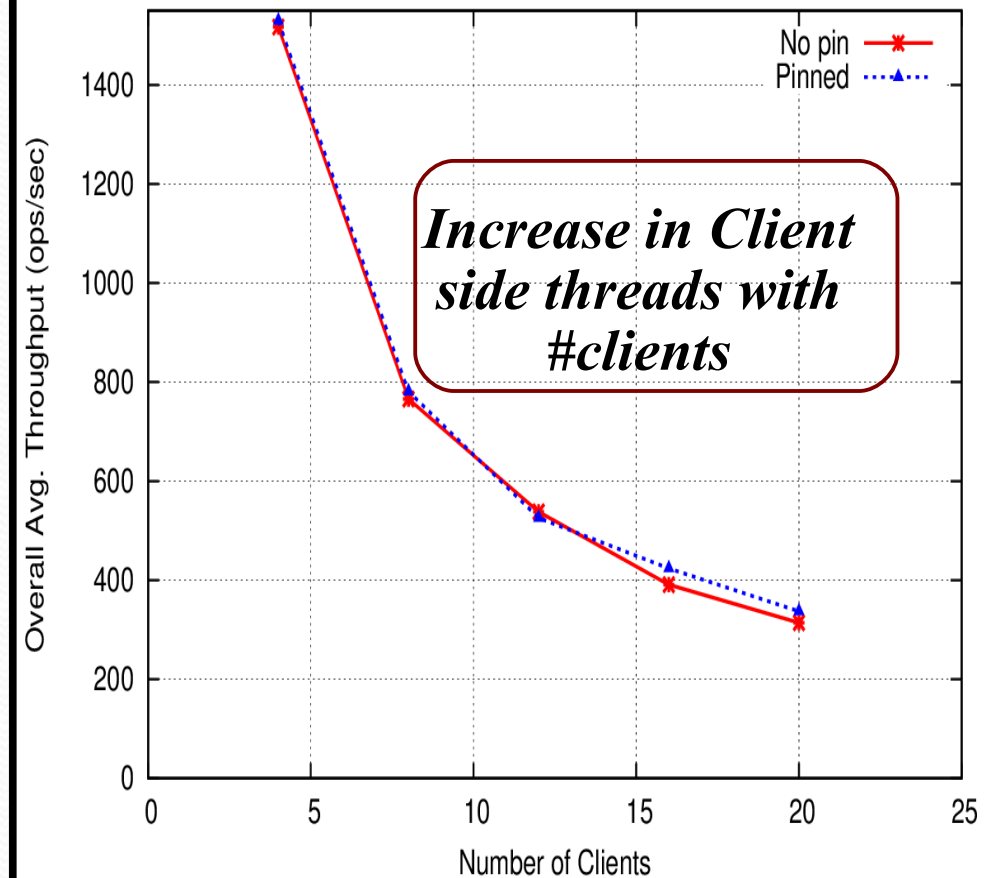
- ✓ 8 Instance Hazelcast Cluster with 4 VMs on 2 PMs
- ✓ 2 instances (JVMs) on each VM, pinned to a specific core

Client Count Variation

#Client Variation, Total 200 Threads, Target 4000 ops/sec

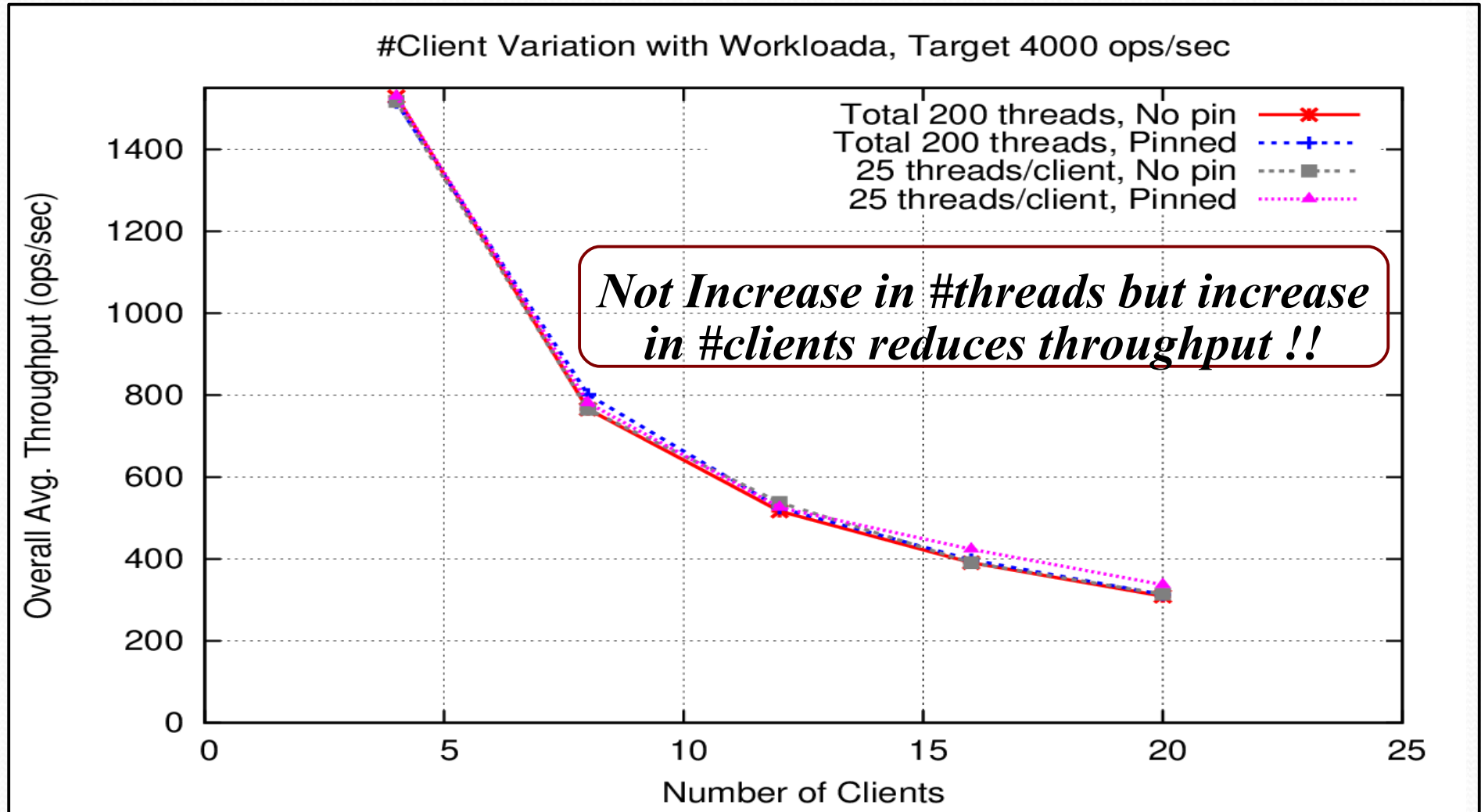


#Client Variation with Workload, 25 Threads/client, Target 4000 ops/sec



- ✓ *Total number of client side threads used to generate workload fixed to 200 & then varied (increased)*
- ✓ *No difference in performance between with and without pinning*

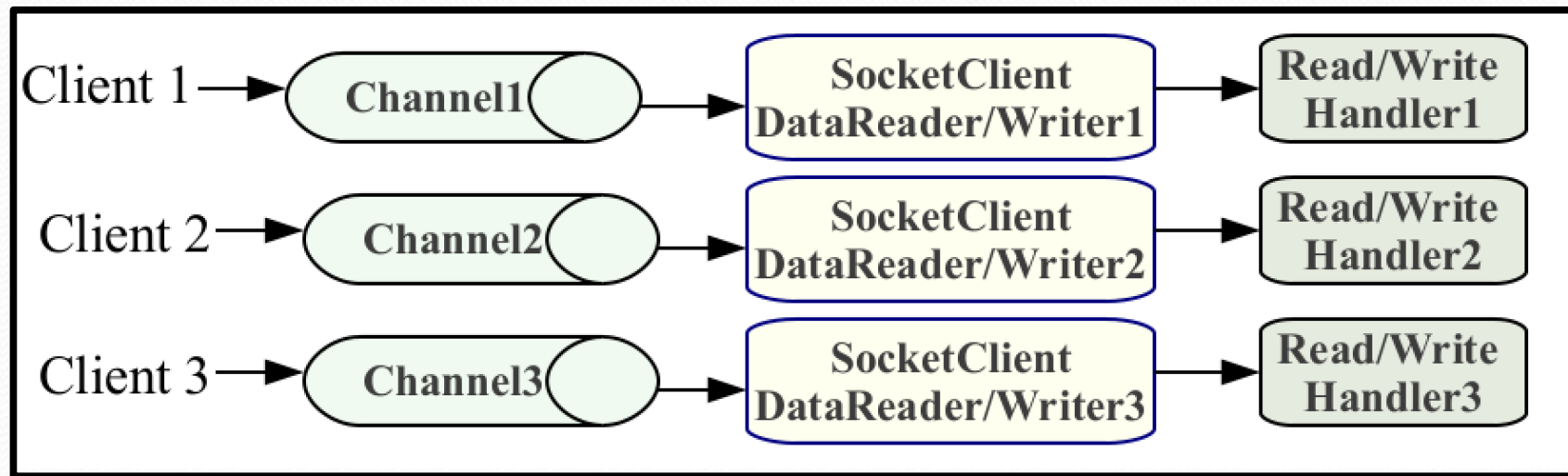
Client Count Variation



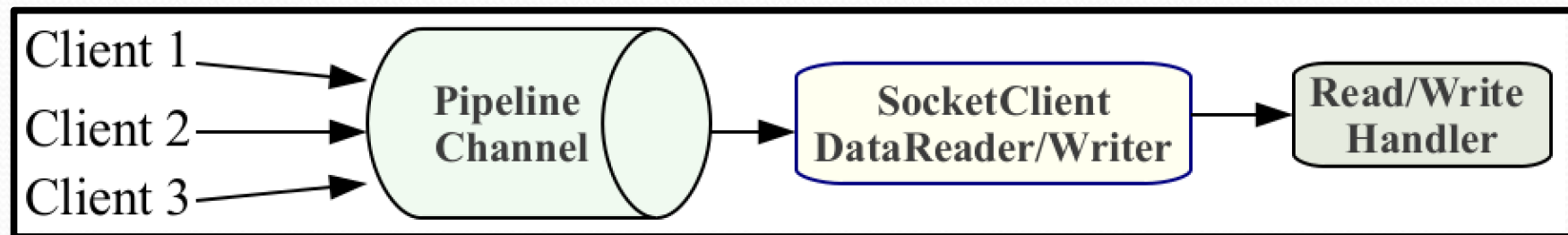
- ✓ *Pinning does not help in performance improvement*
- ✓ *Thread migration/Context switches across cores is not high enough to affect performance*

Multiplexing Socket Channels

Before



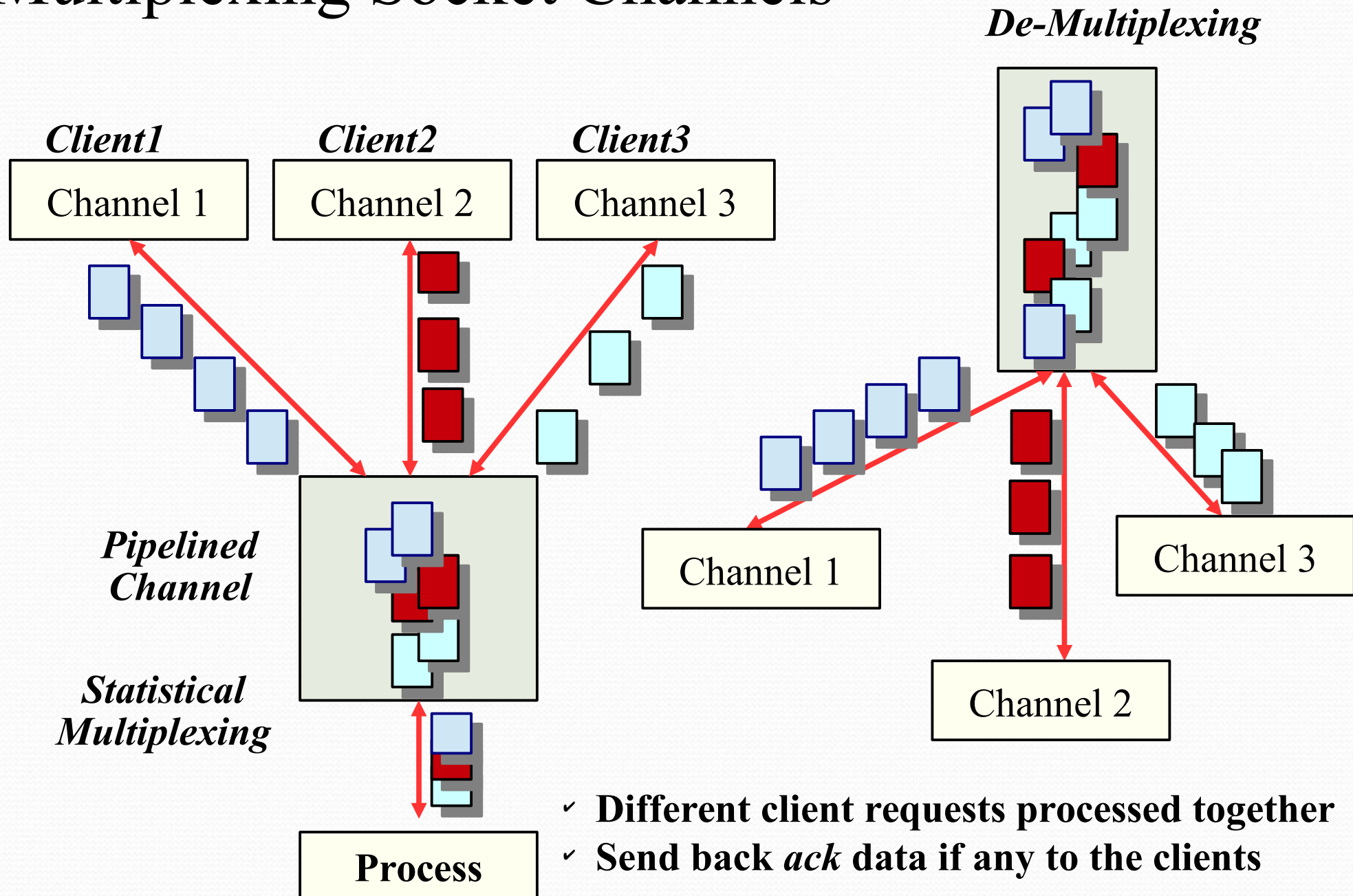
- ✓ Each client has a separate channel, objects/threads created along the way



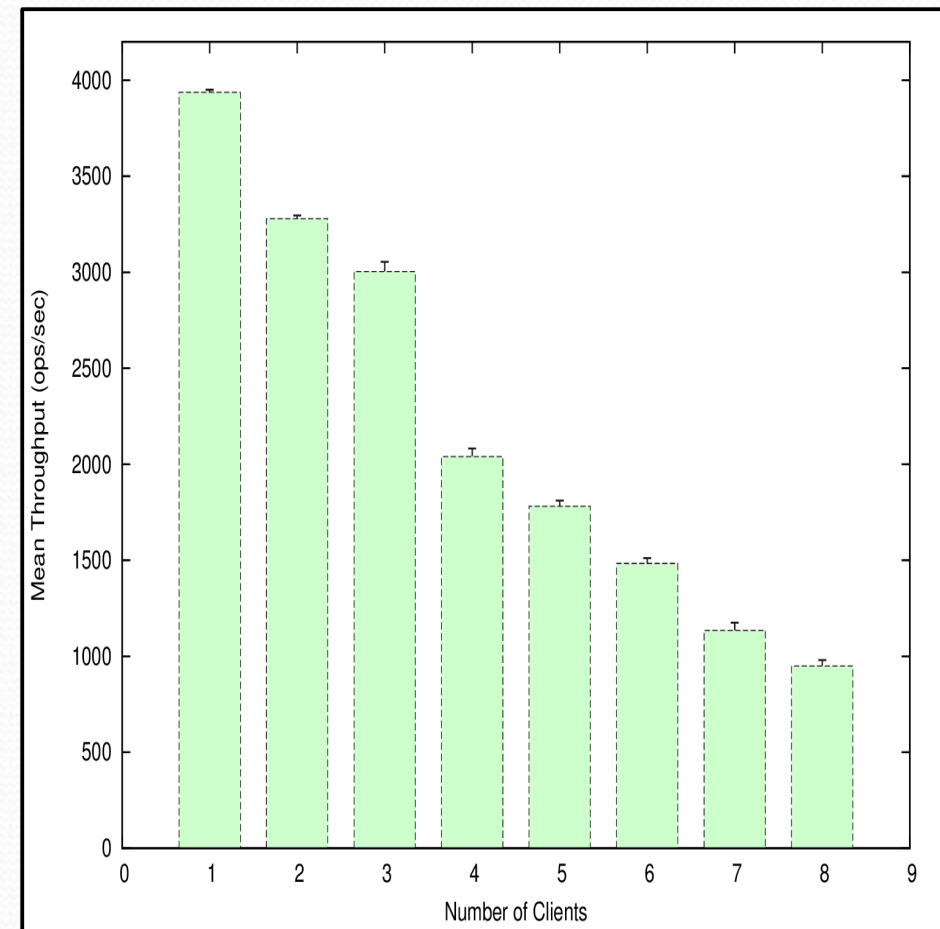
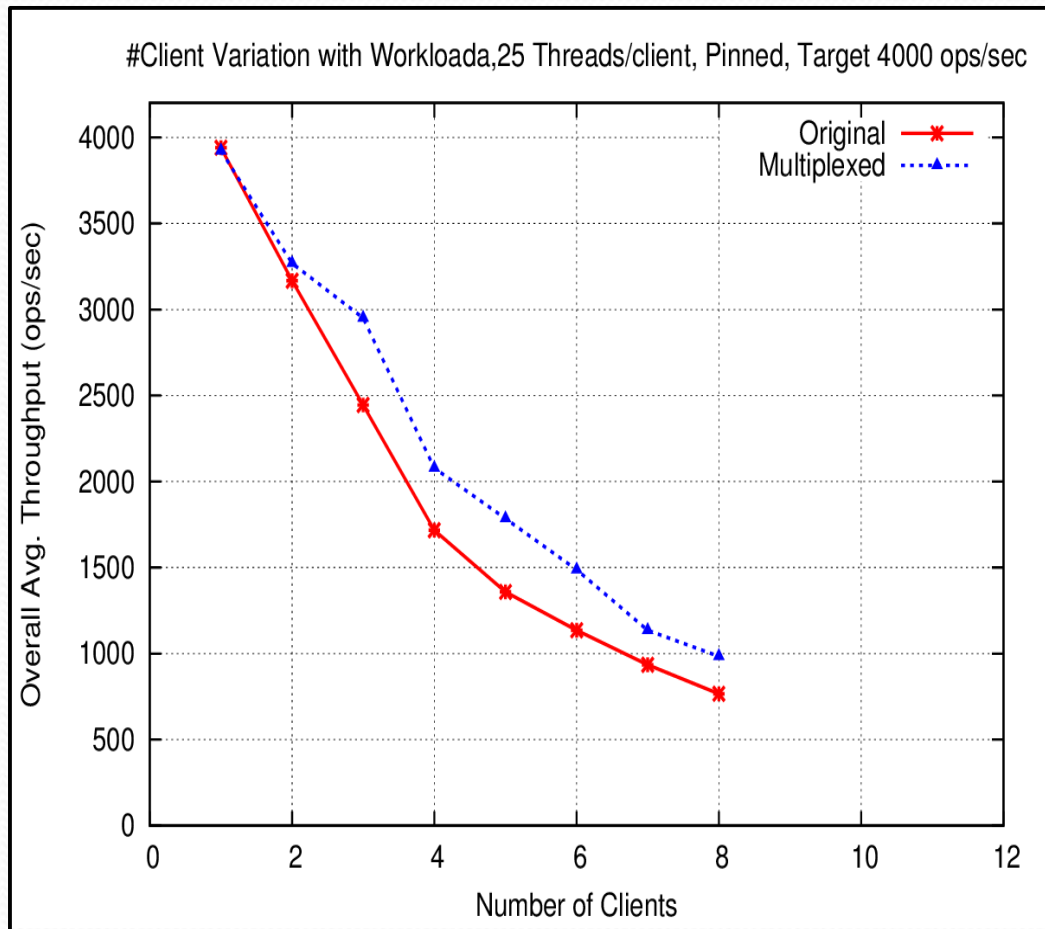
After

- ✓ Combine the separate channels to a coalesced outbound channel

Multiplexing Socket Channels

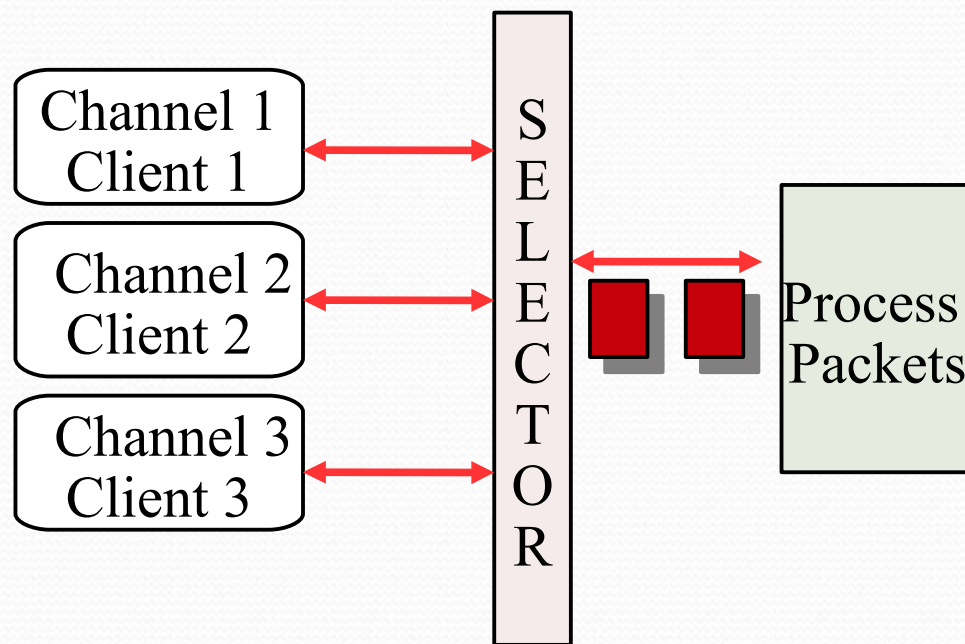


Multiplexing Socket Channels

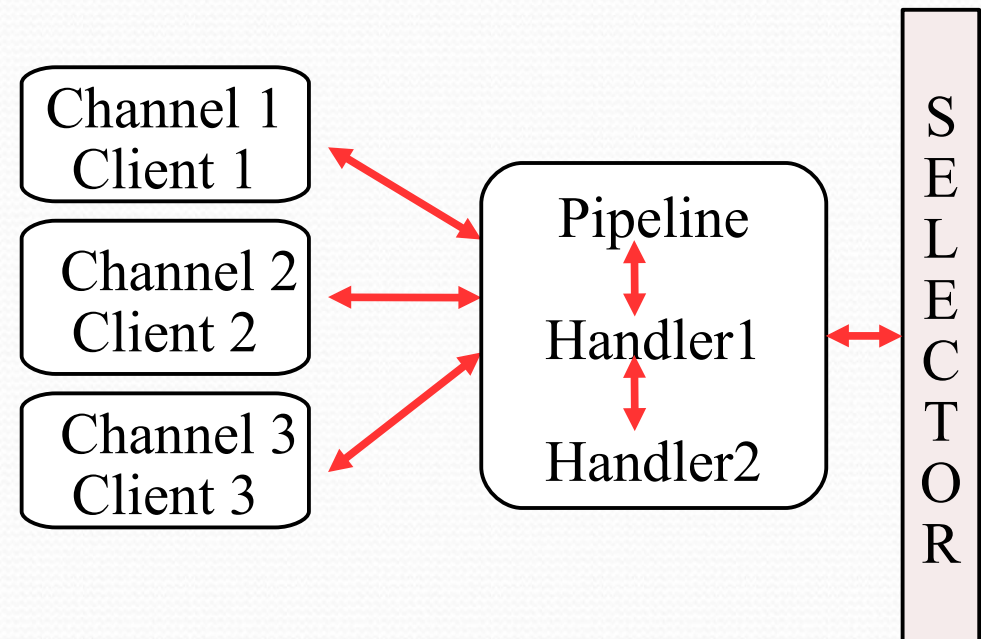


- ✓ *Performance Improvement > 10 % for 5 clients*
- ✓ *Standard Deviation did not exceed 50*
- ✓ *Less endpoint management, better performance*

Multiplexing Socket Channels

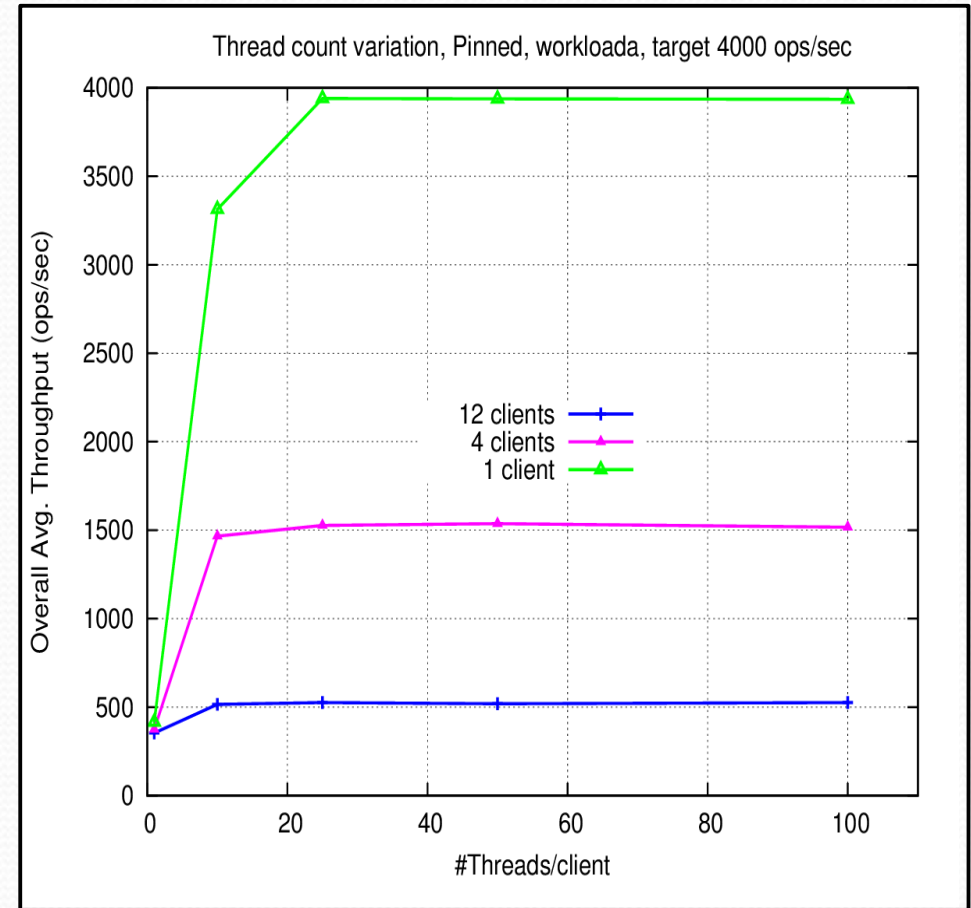
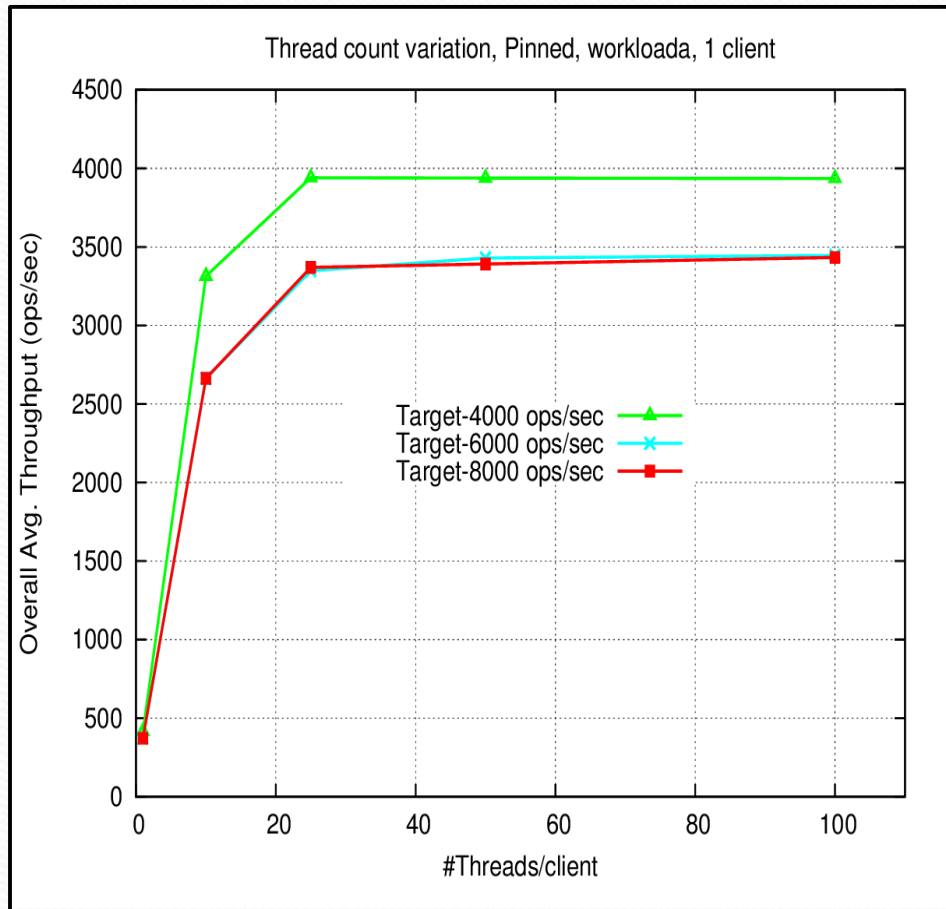


- ✓ *Select/Poll*
- ✓ *More Context switches*
- ✓ *More Runnable Instances - higher threads per request*



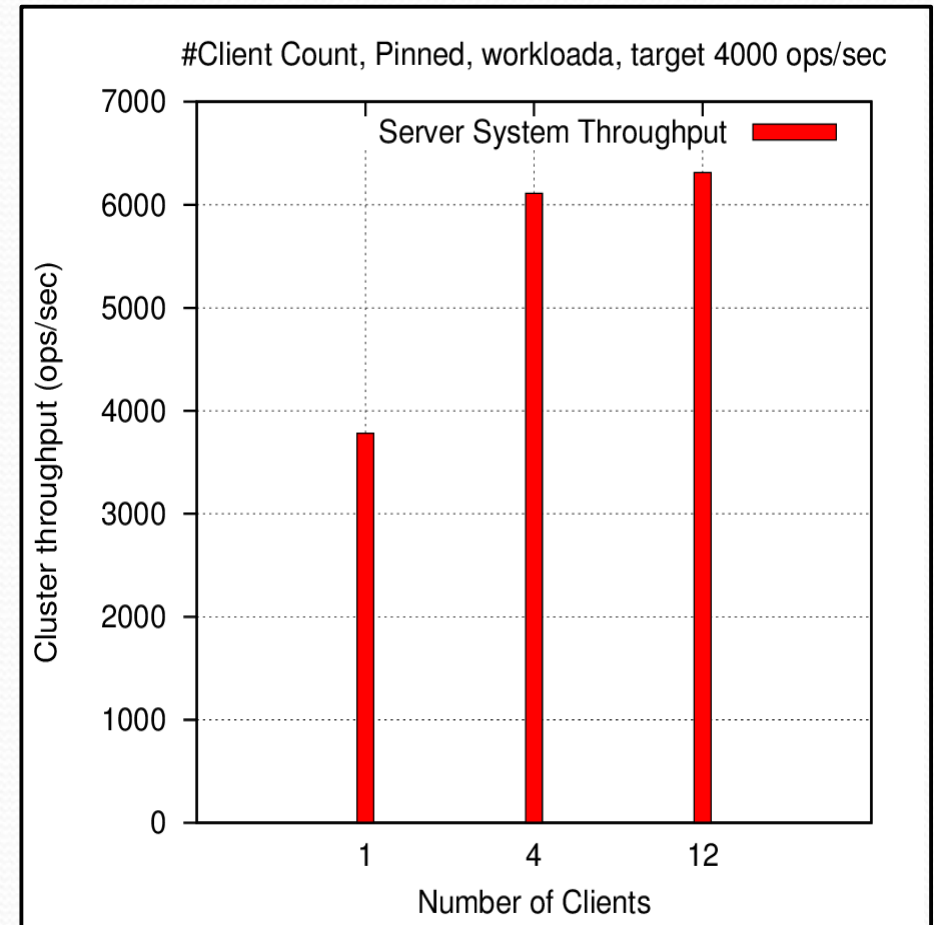
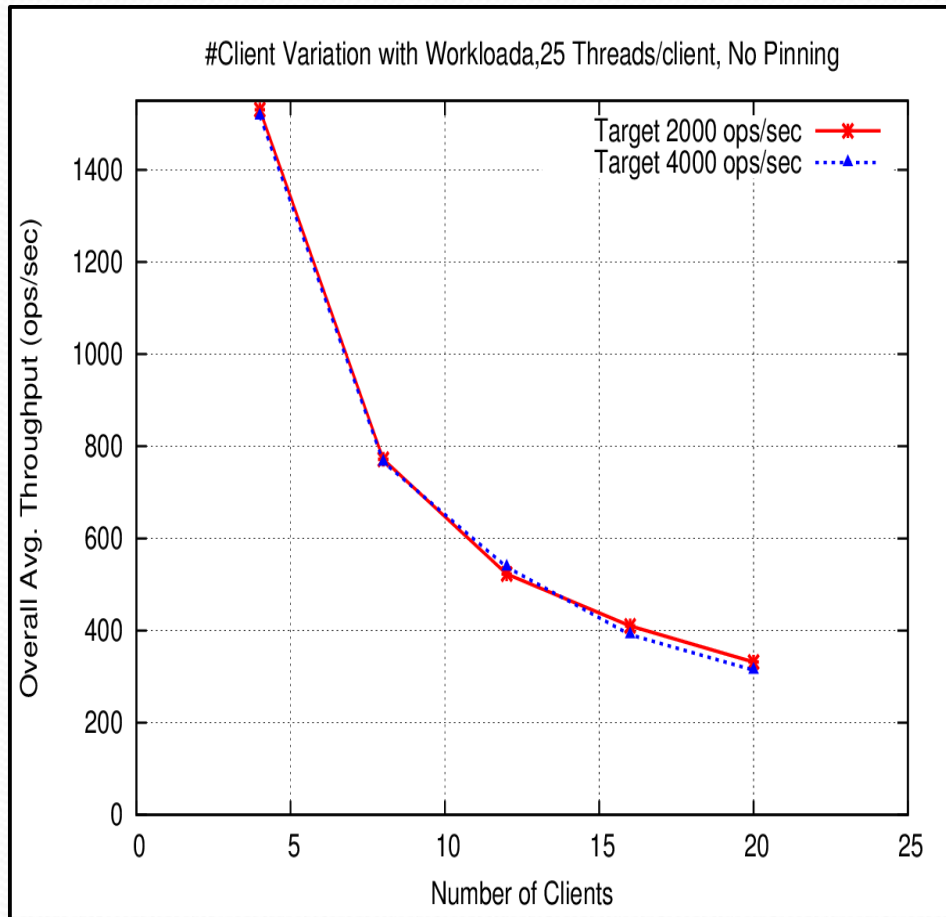
- ✓ *Less Context switches*
- ✓ *Less threads per request*
- ✓ *Better performance with concurrency*

Client Thread Count Variation



- ✓ *Single client achieves target, beyond 4000 ops/sec performance drops.*
- ✓ *With both 4 & 12 clients, system reaches maximum performance level at 25 threads/client beyond which there is no fluctuation.*

Target Throughput



- ✓ *Target doubled, no difference in throughput with the same #clients.*
- ✓ *Cluster throughput from the server's perspective does not exceed 6300 ops/sec.*

Conclusions



- Performance degradation is clear with increasing clients.
- JVM-CPU Pinning does not help in improving performance.
- Beyond a threshold and a specific target, increasing the number of client threads do not affect performance.
- Statistical multiplexing of client socket channels improve overall throughput.

Acknowledgments: Dr. Frank Mueller, Dr. Arun Iyengar, Dr. Helen Gu and NSF for the support.