

# Scaling State Machine Replication

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# State machine replication

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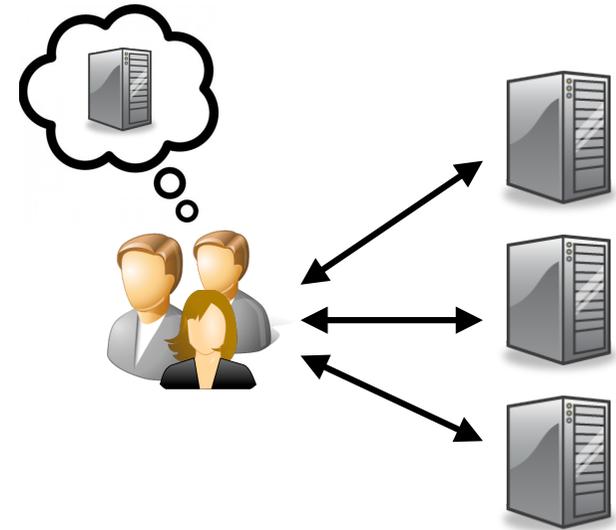
- Fundamental approach to fault tolerance
  - ◆ Google Spanner
  - ◆ Apache Zookeeper
  - ◆ Windows Azure Storage
  - ◆ MySQL Group Replication
  - ◆ Galera Cluster, ...



# State machine replication is intuitive & simple

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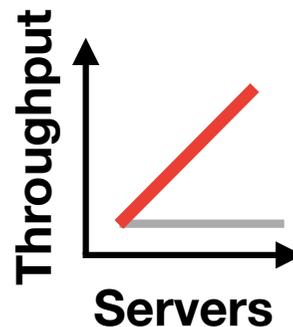
- Replication transparency
  - ◆ For clients
  - ◆ For application developers
- Simple execution model
  - ◆ Replicas **order** all commands
  - ◆ Replicas **execute** commands deterministically and in the same order



# Configurable fault tolerance but bounded performance

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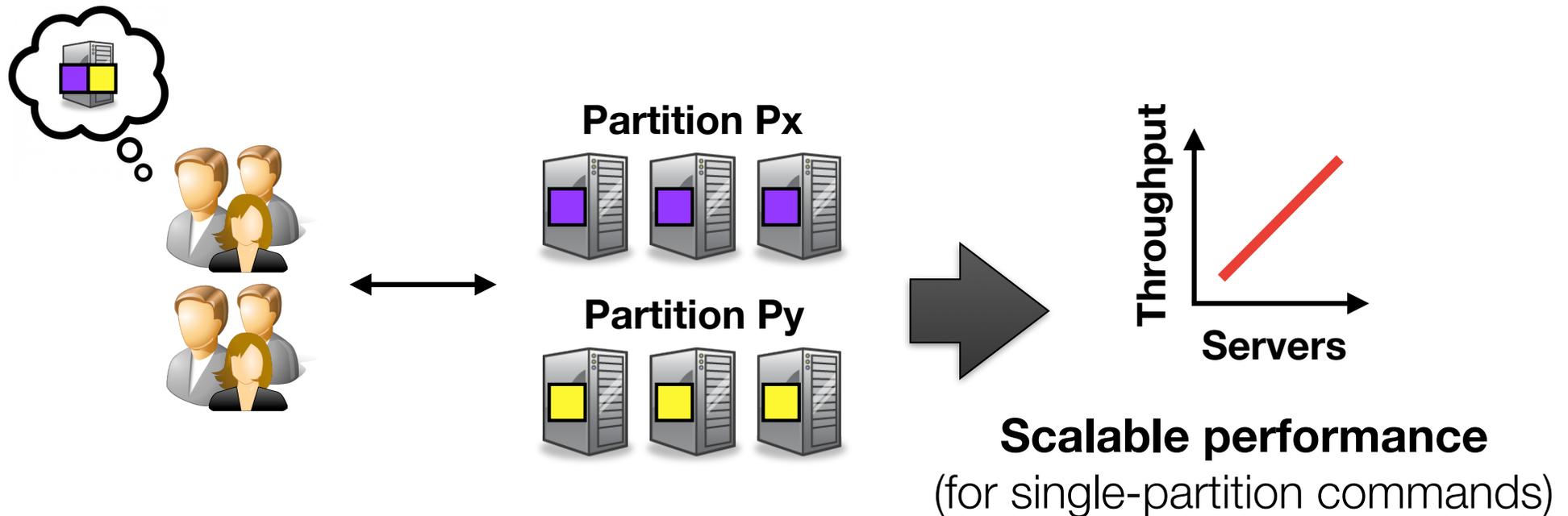
- Performance is bounded by what one replica can do
  - ◆ Every replica needs to execute every command
  - ◆ More replicas: same (if not worse) performance



**How to scale state machine replication?**

# Scaling performance with partitioning

- Partitioning (aka sharding) application state



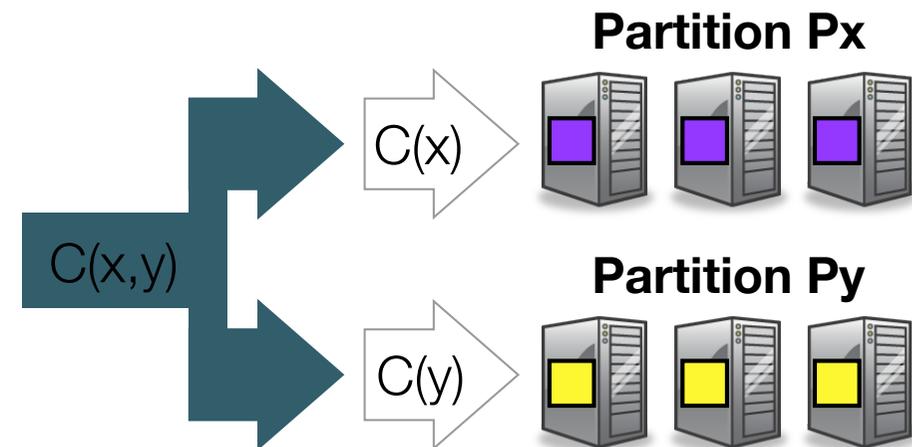
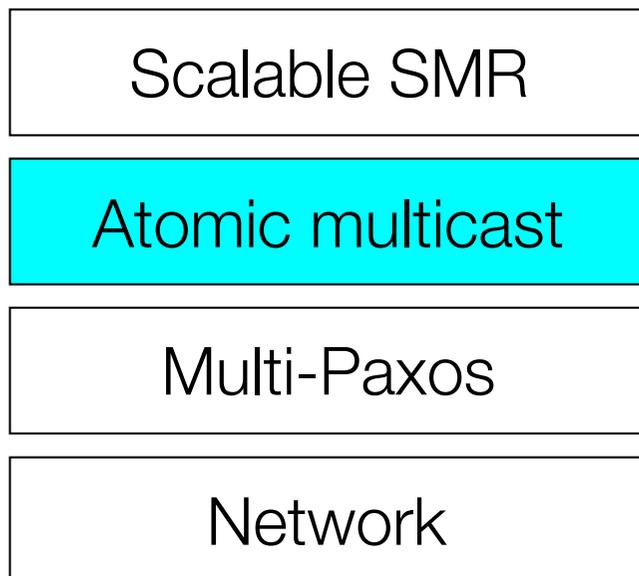
**Problem #1: How to order commands in a partitioned system?**

**Problem #2: How to execute commands in a partitioned system?**

# Ordering commands in a partitioned system

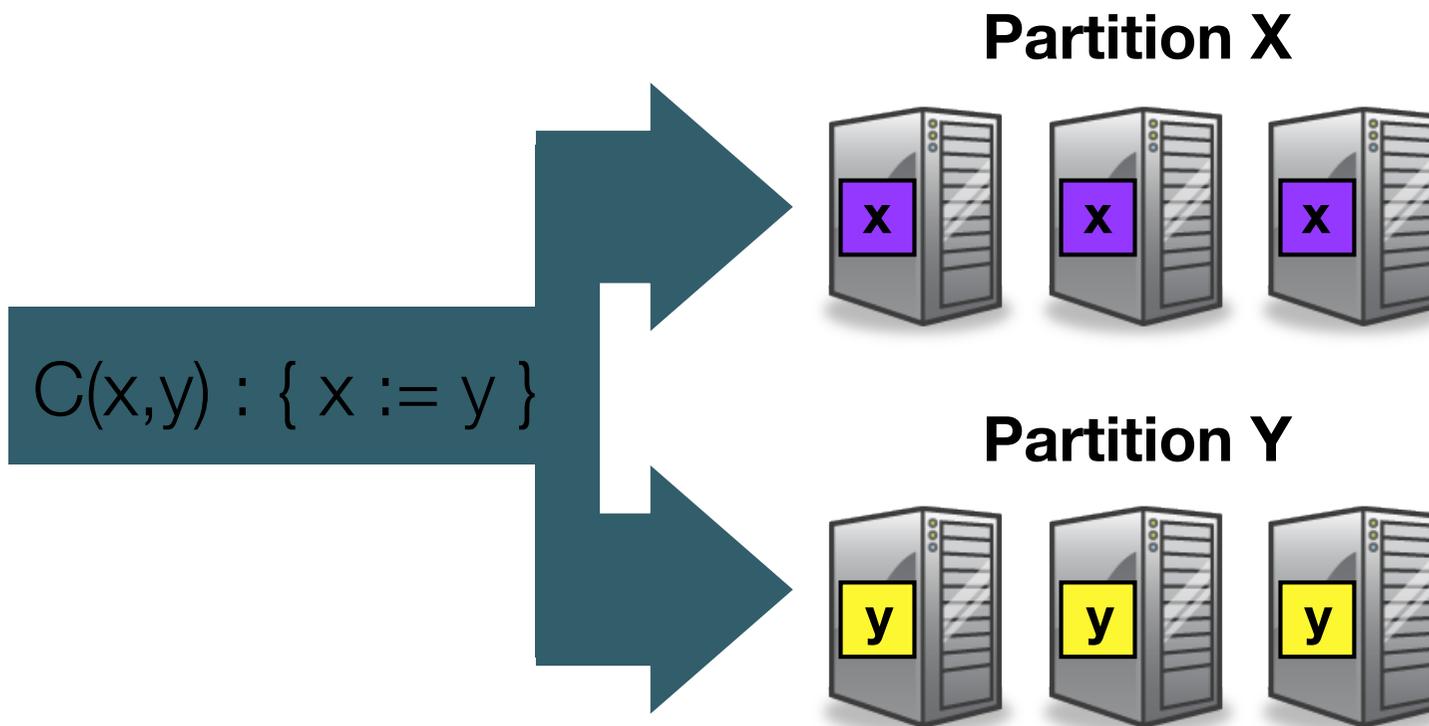
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- Atomic multicast
  - ◆ Commands addressed (multicast) to one or more partitions
  - ◆ Commands ordered within and across partitions
    - If S delivers C before C', then no S' delivers C' before C



# Executing multi-partition commands

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**Solution #1: Static partitioning of data**

**Solution #2: Dynamic partitioning of data**

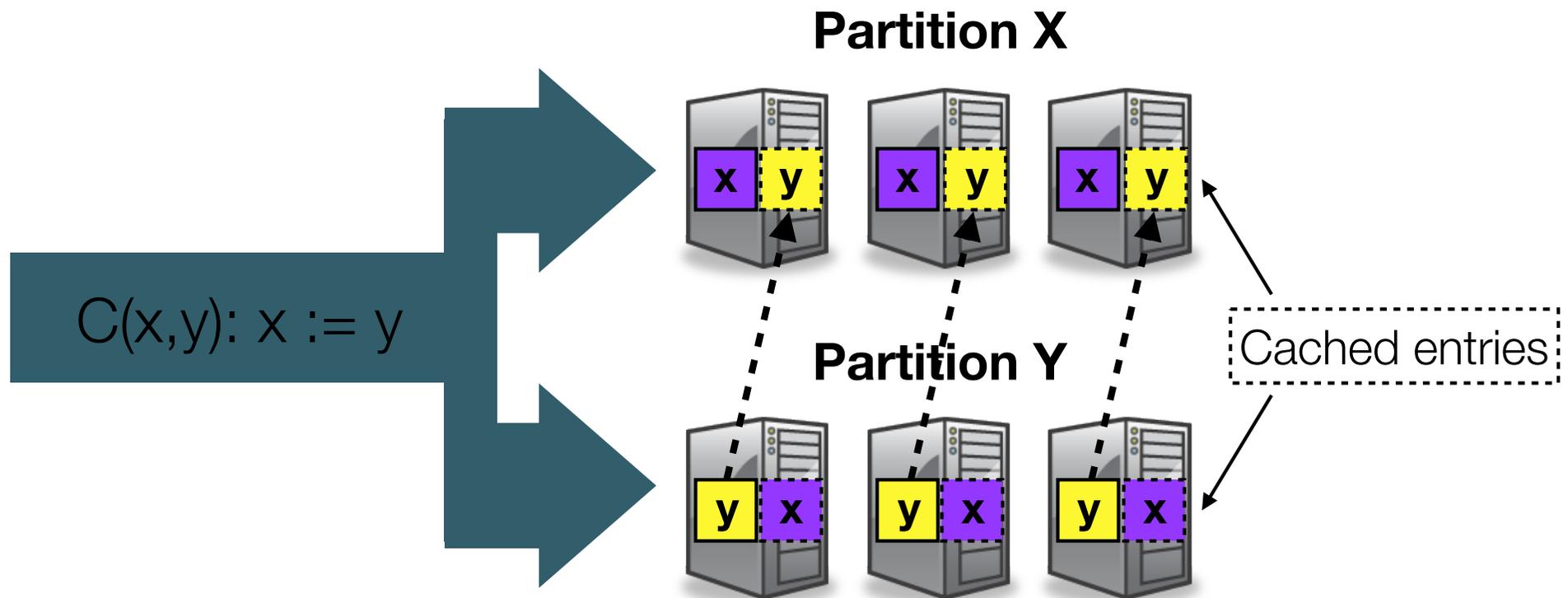
# Solution 1: Static partitioning of data

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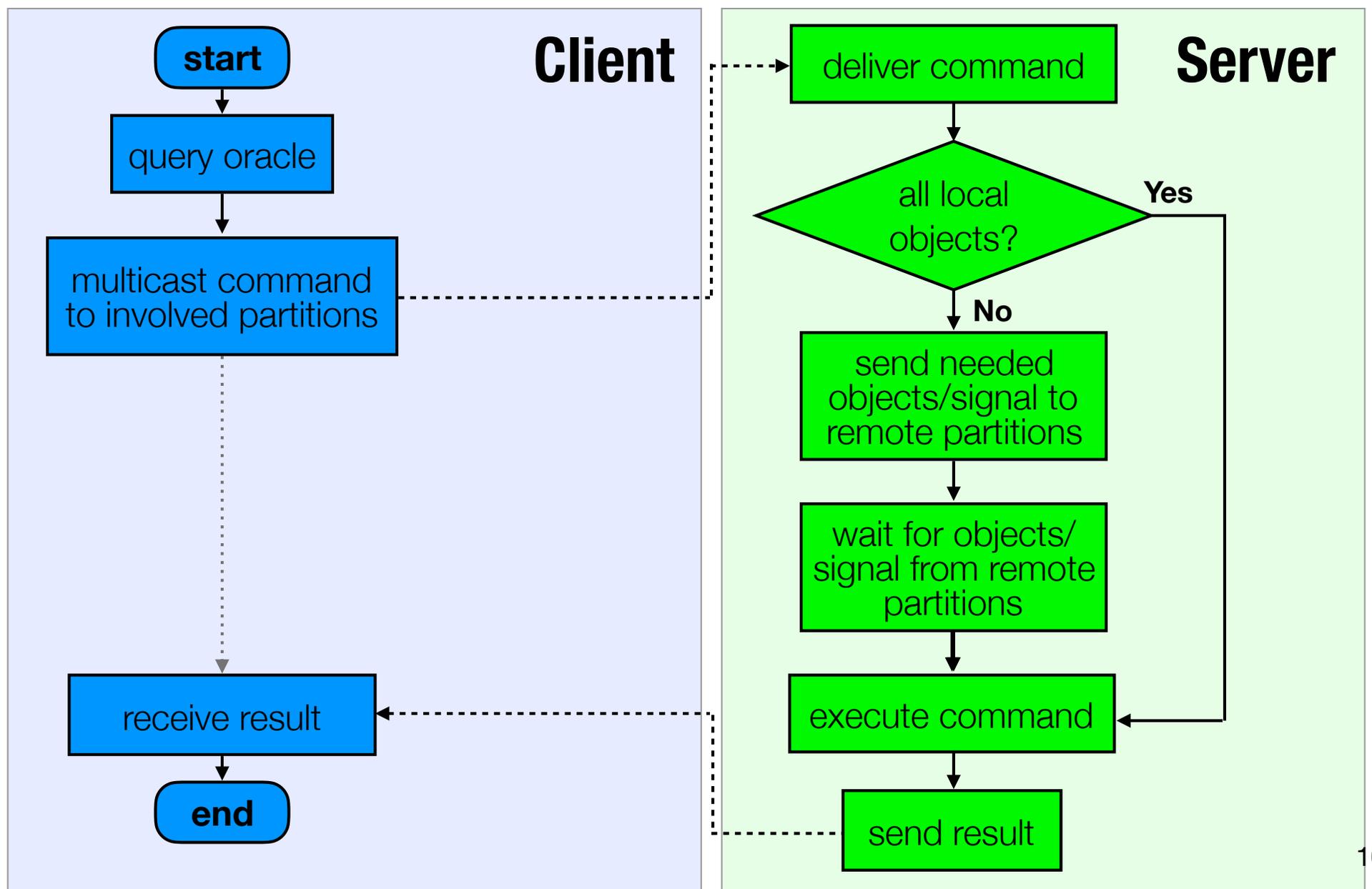
- Execution model
  - ◆ Client queries location oracle to determine partitions
  - ◆ Client multicasts command to involved partitions
  - ◆ Partitions exchange and temporary store objects needed to execute multi-partition commands
  - ◆ Commands executed by all involved partitions
- Location oracle
  - ◆ Simple implementation thanks to static scheme

# How to execute multi-partition commands?

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# Static scheme, step-by-step

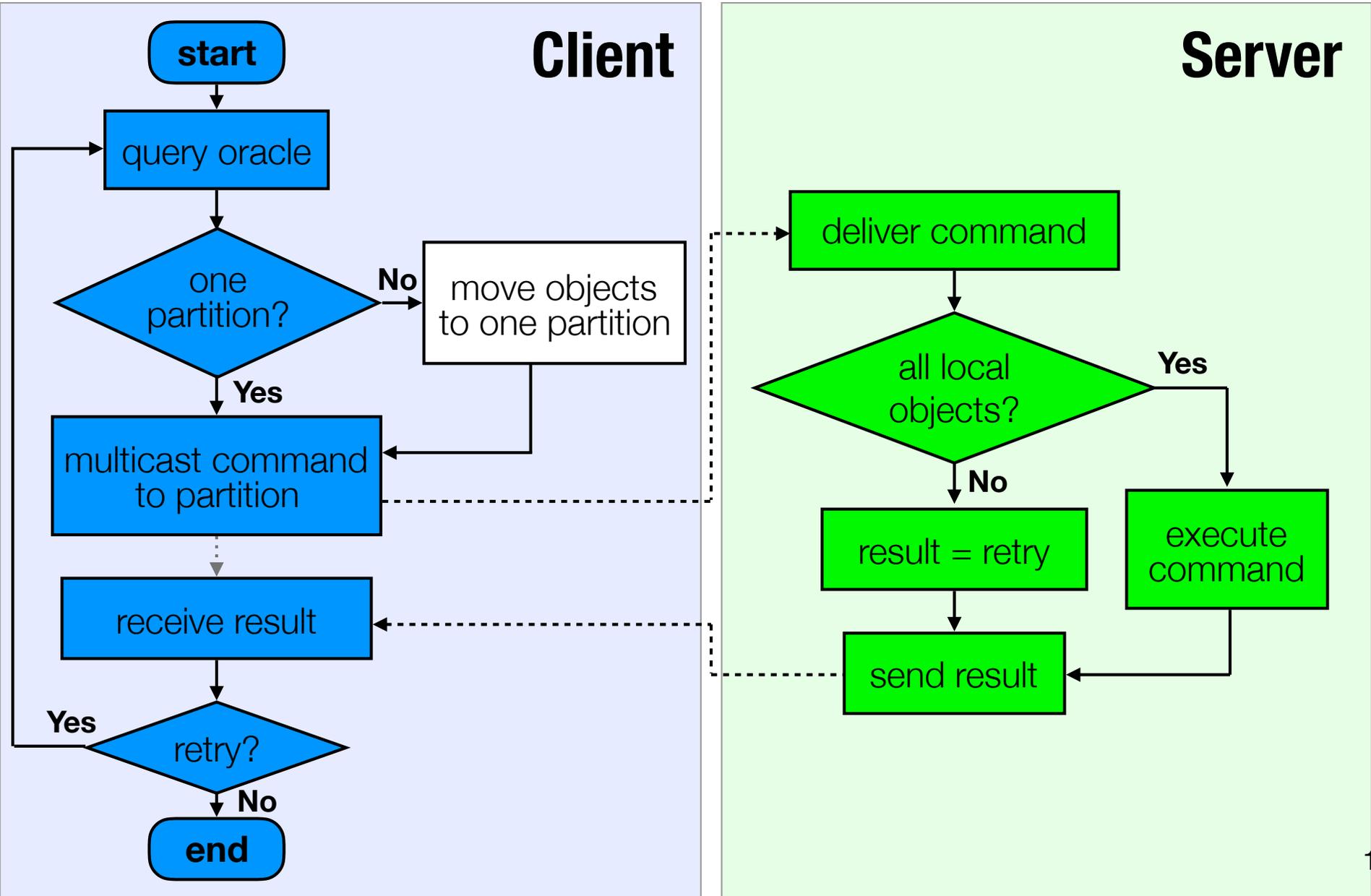


# Solution 2: Dynamic partitioning of data

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- Execution model (key idea)
  - ◆ Turn every command single-partition
  - ◆ If command involves multiple partitions, move objects to a single partition before executing command
- Location oracle
  - ◆ Oracle implemented as a “special partition”
  - ◆ Move operations involve oracle, source and destination partitions

# Dynamic scheme, step-by-step



# Termination and load balance

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- Ensuring termination of commands
  - ◆ After retrying n times, command is multicast to all partitions
  - ◆ Executed as a multi-partition command
- Ensure load balancing among partitions
  - ◆ Target partition in multi-partition command chosen randomly

# Oracle: high availability and performance

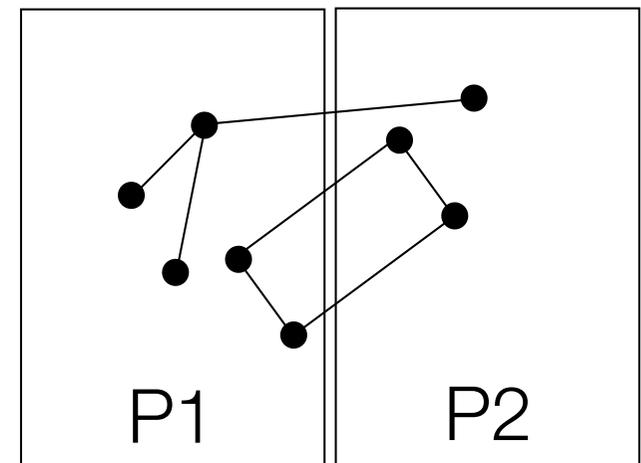
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- Oracle implemented as a partition
  - ◆ For fault tolerance
- Clients cache oracle entries
  - ◆ For performance
  - ◆ Real oracle needed at first access and when objects change location
  - ◆ Client retries command if cached location is stale

# Dynamically (re-)partitioning the state

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- Decentralized strategy
  - ◆ Client chooses one partition among involved partitions
  - ◆ Each move involves oracle and concerned partitions
  - 👍 ◆ No single entity has complete system knowledge
  - 👍 ◆ Good performance with strong locality, but...
  - 👎 ◆ ...slow convergence
  - 👎 ◆ Poor performance with weak locality



# Dynamically (re-)partitioning the state

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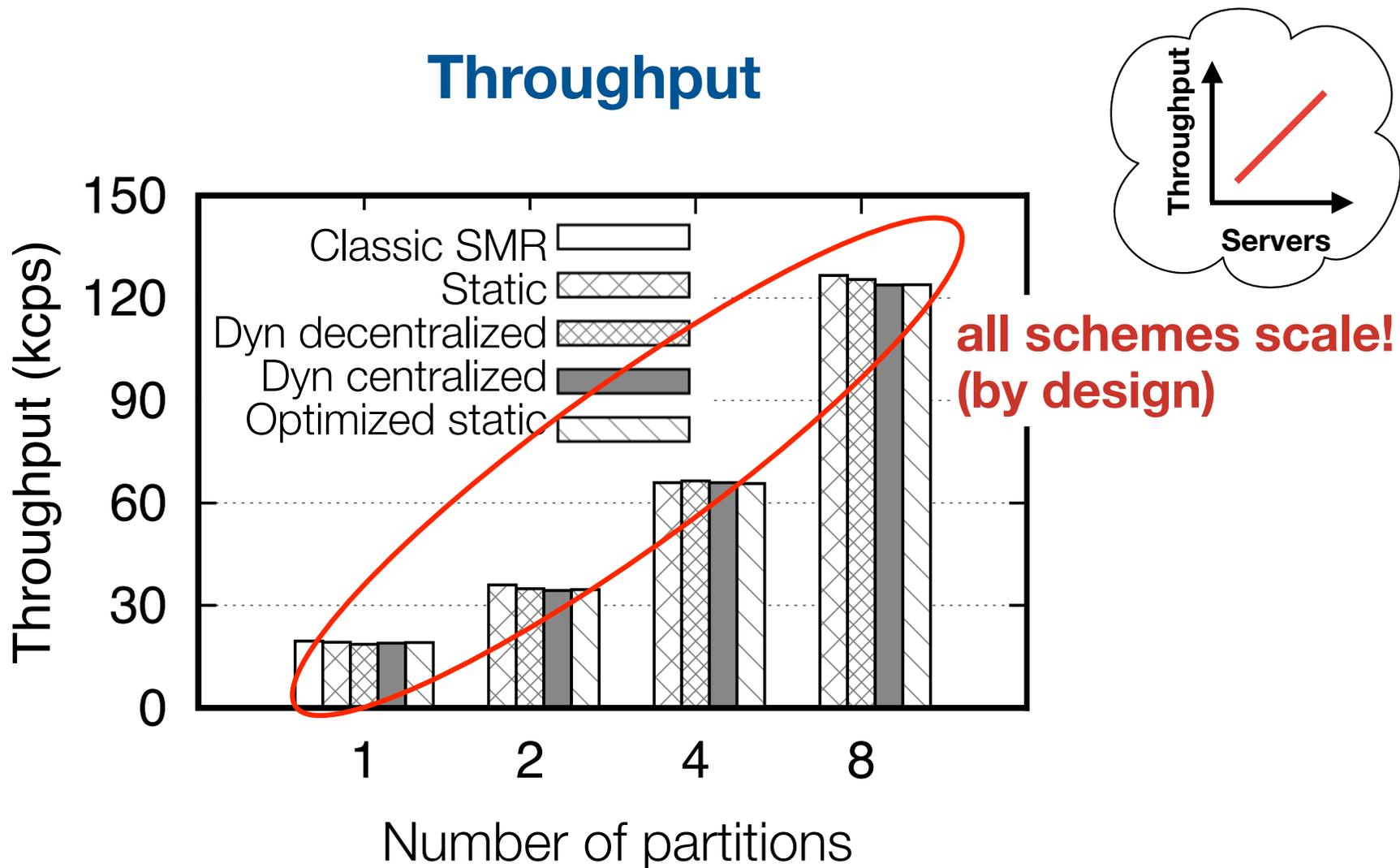
- Centralized strategy
  - ◆ Oracle builds graph of objects and relations (commands)
  - ◆ Oracle partitions O-R graph (METIS) and requests move operations to place all objects in one partition
  - 👍 ◆ Near-optimum partitioning (both strong and weak locality)
  - 👍 ◆ Fast convergence
  - 👎 ◆ Oracle knows location of and relations among objects
  - 👎 ◆ Oracle solves a hard problem

# Social network application (similar to Twitter)

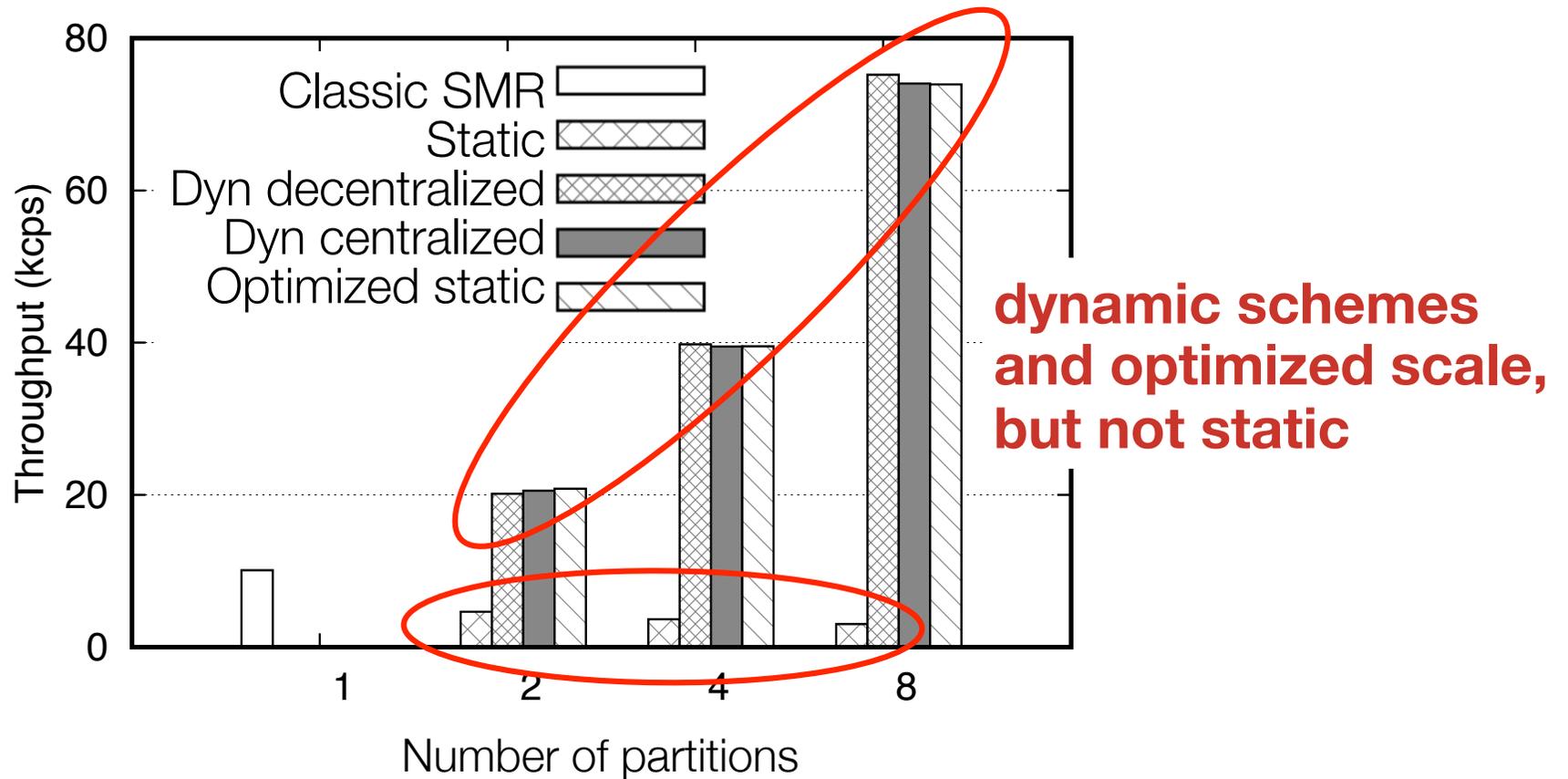
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- GetTimeline
  - ◆ Single-object command => always involves one partition
- Post
  - ◆ Multi-object command => may involve multiple partitions
  - ◆ Strong locality
    - 0% edge cut, social graph can be perfectly partitioned
  - ◆ Weak locality
    - 1% and 5% of edge cuts, after partitioning social graph

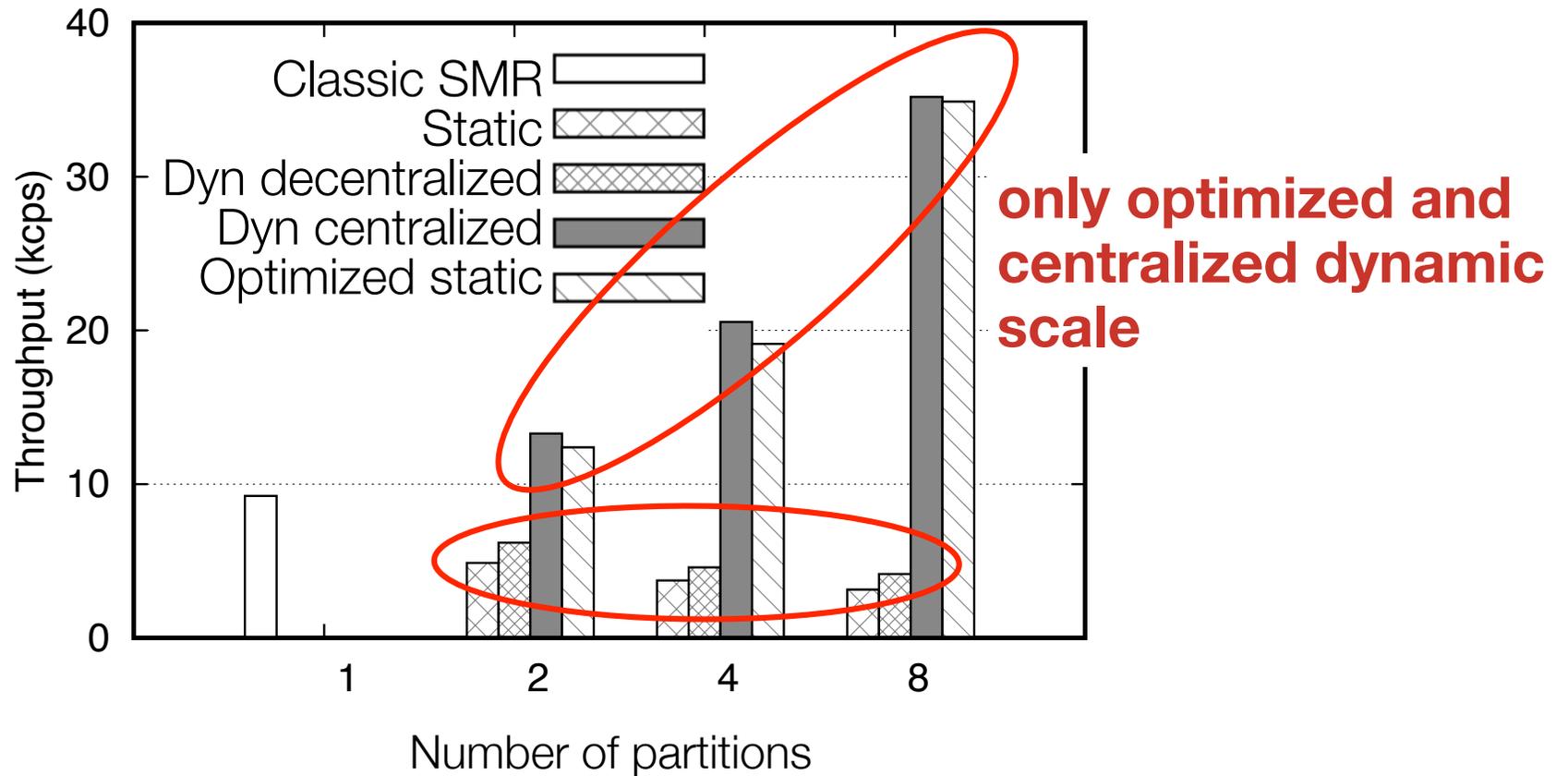
# GetTimelines only (single-partition commands)



# Posts only, strong locality (0% edge cut)



# Posts only, weak locality (1% edge cut)



# Conclusions

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- Scaling State Machine Replication
  - ◆ Possible but locality is fundamental
    - OSs and DBs have known this for years
  - ◆ Replication and partitioning transparency
- The future ahead
  - ◆ Decentralized schemes with quality of centralized schemes
  - ◆ Expand scope of applications (e.g., data structures)
  - ◆ “The inherent limits of scalable state machine replication”

More details:

<http://www.inf.usi.ch/faculty/pedone/scalesmr.html>

**THANK YOU!!!**

Joint work with...

Long Hoang Le

Enrique Fynn

Eduardo Bezerra

Robbert van Renesse