Principles and Methodologies for Serial Performance Optimization

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Performance: long-standing goal in systems community Latency ihroughput We reviewed them all. 43% 10 Years of **OSDI/SOSP** papers

Why this paper may feel different

- This is *not* a paper about building a new system
- Instead, we ask a meta question:
 - "Can we systematize how sequential performance is optimized in practice?"
- We reviewed 477 OSDI/SOSP papers over the past decade
- Distilled a **unified framework** of recurring optimization methodologies
- It's not a solution to one problem It's a guide to solve many

You found a bottleneck. Now what?



- Profiled to find a cause... and it turns out the bottleneck is lock contention!
 - So how do you optimize this?

Parallelism helps... but not everything can be parallelized



The speedup is limited by the **sequential portion of the program**.

Sequential optimization remains crucial



Sequential optimization remains crucial

1 Concurrent threads are running



To achieve higher throughput :

- **Reorder** waiting queue for faster progress (ShflLock, SOSP'19)
- Batch threads to better utilize underlying cache (CNA, EuroSys'19)
- Allow dynamic custom policy for reordering (SynCord, OSDI'22)

How to optimize sequential execution

Deferring Speculative execution Lazy evaluation Streaming Prefetching Load balancing Batching Pipelining Prefetching Lookahead Readahead Memory pooling Readahead Memoization StreamingEarly termination Indexing Early termination Memoization Caching Readahead Streaming Deferring Batching Indexing Speculative execution Pipelining Buffering Throttling Caching Indexing Buffering Zero copy Memoization Caching Zero copy Lookahead Buffering Readahead Lazy evaluation Memory pooling Load balancing Memory pooling 'Early termination Memory pooling Lazy evaluation Prefetch Deferring Buffering Batching Load balancing Zero copy



- 1. Can we **systematize** sequential optimization?
- 2. **How many** distinct approaches?
- 3. When to use each of them?

Three principles of sequential execution

To optimize existing sequence,

1. Remove a task

2. Replace with a faster one

3. Reorder tasks for better locality









From principles to practice: The eight methodologies

Batching	Caching	Precomputing	Deferring
Relaxation	Contextualization	Hardware	Layering

- A set of common optimization patterns for sequential performance
- Each methodology is derived from the three principles
- Together, a unified way to understand and explore sequential optimization
- Check our paper for definitions, visualizations, and real examples from OSDI/SOSP papers

Are they enough to cover common patterns?

Yes, we manually reviewed **10 years of OSDI & SOSP papers** (477 papers)







1. Fewer tasks after batched

2. Batched task is **shorter**

- 1. Coalesced calls remove replace
 - When each task incurs expensive cost every time it's called
- 2. Discard stale tasks at the time of batched request remove
 - Batching inherently defers earlier tasks to make a batch
 - E.g., group commit, write buffer
- 3. Maximize spatial and temporal locality reorder





- 1. Move tasks out of a sequence and use later resources remove
- 2. Reorder tasks within a sequence for better decision or locality reorder
- 3. Based on two types of speculation
 - (1) the task might not be needed later, (2) it might be handled more efficiently if delayed

Contextualization



Overhead < Later optimization

- 1. Collect runtime context and make workload-specific decision replace
- 2. Move the runtime analysis off the critical path if possible









SynCord (OSDI '22)

- Deferring move T2 later in the queue
 - **Contextualization** collect runtime context



SynCord (OSDI '22)

- **Deferring** move T2 later in the queue
- ✓ Contextualization collect runtime context

Batching

– group threads from same socket





- Sequential tasks are basic building blocks for performance optimization
- A systematic framework to guide sequential optimization



https://persona0220.github.io/performance-book/





https://github.com/sslab-gatech/SysGPT

Al agent

It really captures ideas from the latest OSDI/SOSP papers

even those it was not trained on!

Questions

