

CS-683 Final Presentation

Reinforcement Learned Policy(RLR)

Team: Paradox Bits

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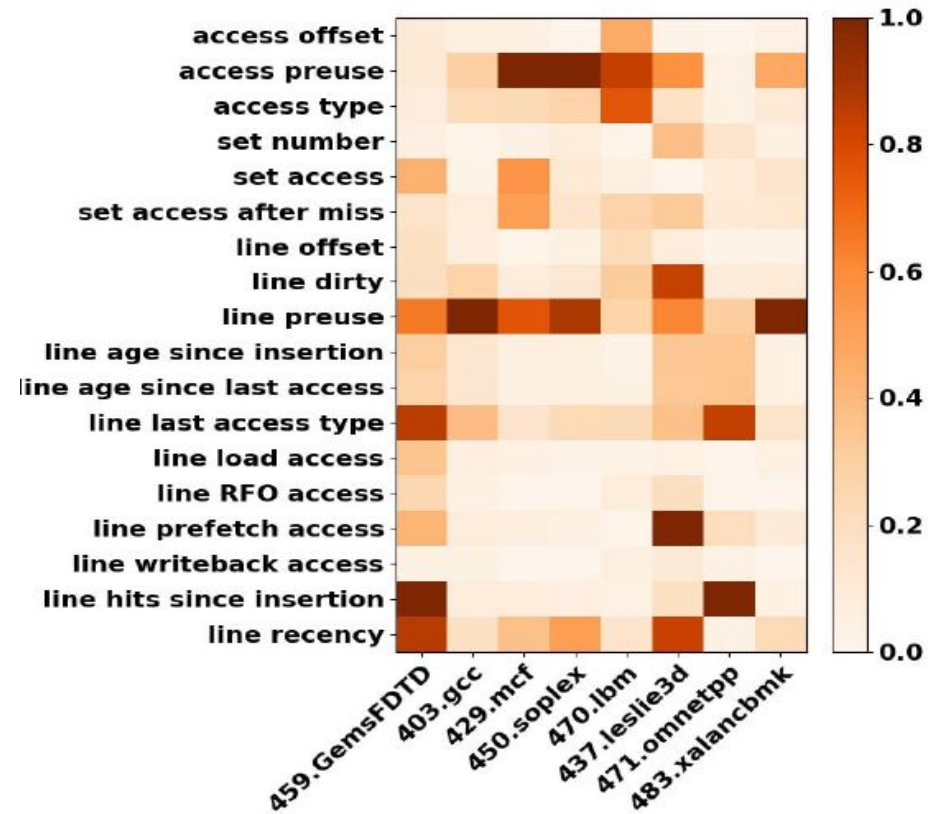
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The Problem

- Motivating Task : Designing a cost-effective Cache.
 - Performance Metric : MPKI.
 - Reducing Hardware Overhead.
- Non-PC based policies : Effective only in limited cache access patterns .(eg. RRIP,LRU)
- PC- based policies :
 - Outperforms Non- PC based policies.
 - Drawbacks :
 - Requires additional storage overhead.
 - Modifications required in processor's data path.

Proposed Solution : RLR policy

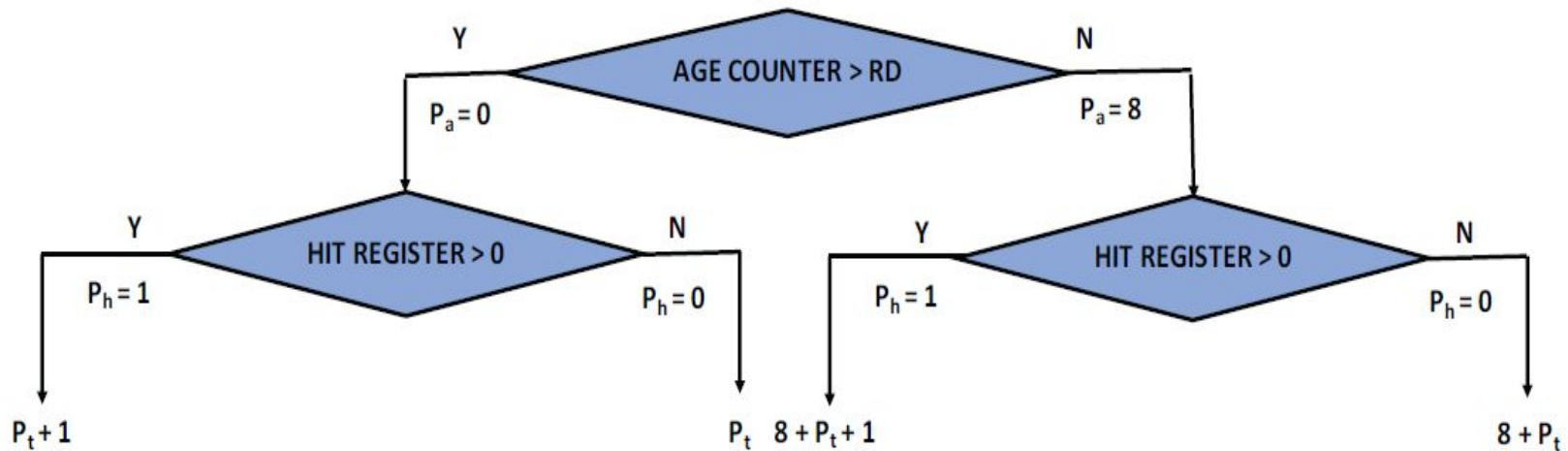
- Using RL to learn policy:
 - Uses easily obtainable features of LLC
 - Insights by observing pre trained weights to get features



About Replacement Algorithm :

- Cache lines in the set are assigned priority levels based on :
 - Age (Age priority) : $RD = 2 \times \text{Average Preuse Distance}$
 - Previous Access (Type priority)
 - Hits (Hit priority)
- On a cache miss : Eviction of line with **lowest priority**.

Priority Computation : $P_{line} = 8 \cdot P_{age} + P_{type} + P_{hit}$



Demand hits-based Priority

P_{ld} - Load Priority
 P_{rfo} - RFO Priority
 P_{pf} - Prefetch Priority
 P_{wb} - Writeback Priority

AGE COUNTER - Set accesses since last access to the cache line
 HIT REGISTER - 1 if cache line was hit at least once, 0 otherwise
 P_a - Age priority
 P_h - Hit priority
 P_t - Type priority ($P_{ld} = P_{rfo} = P_{wb} = 1, P_{pf} = 0$)

Priority:

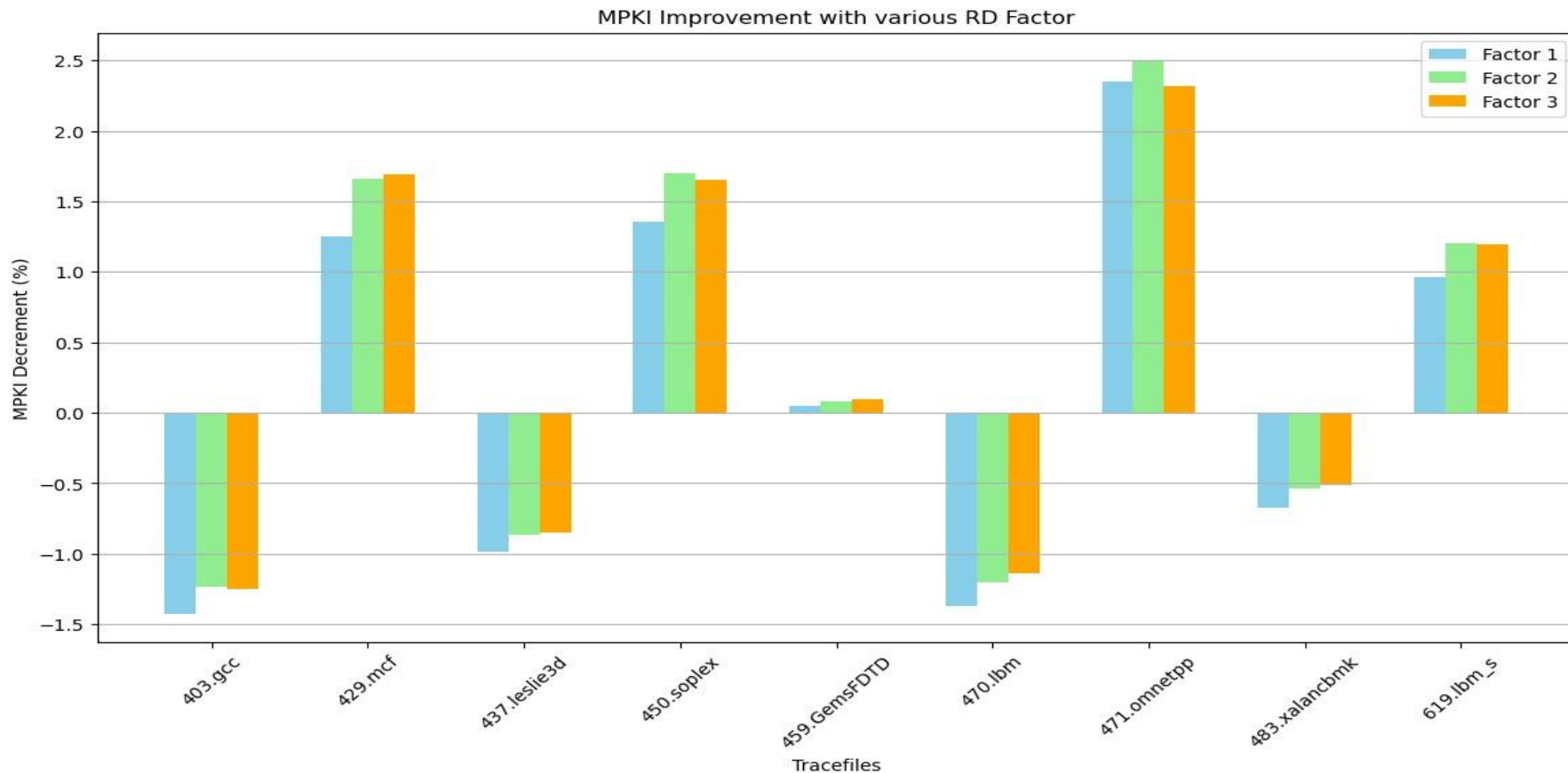
0 ↑ Evict
 ...
 10 ↓ Retain

Implementation in ChampSim:

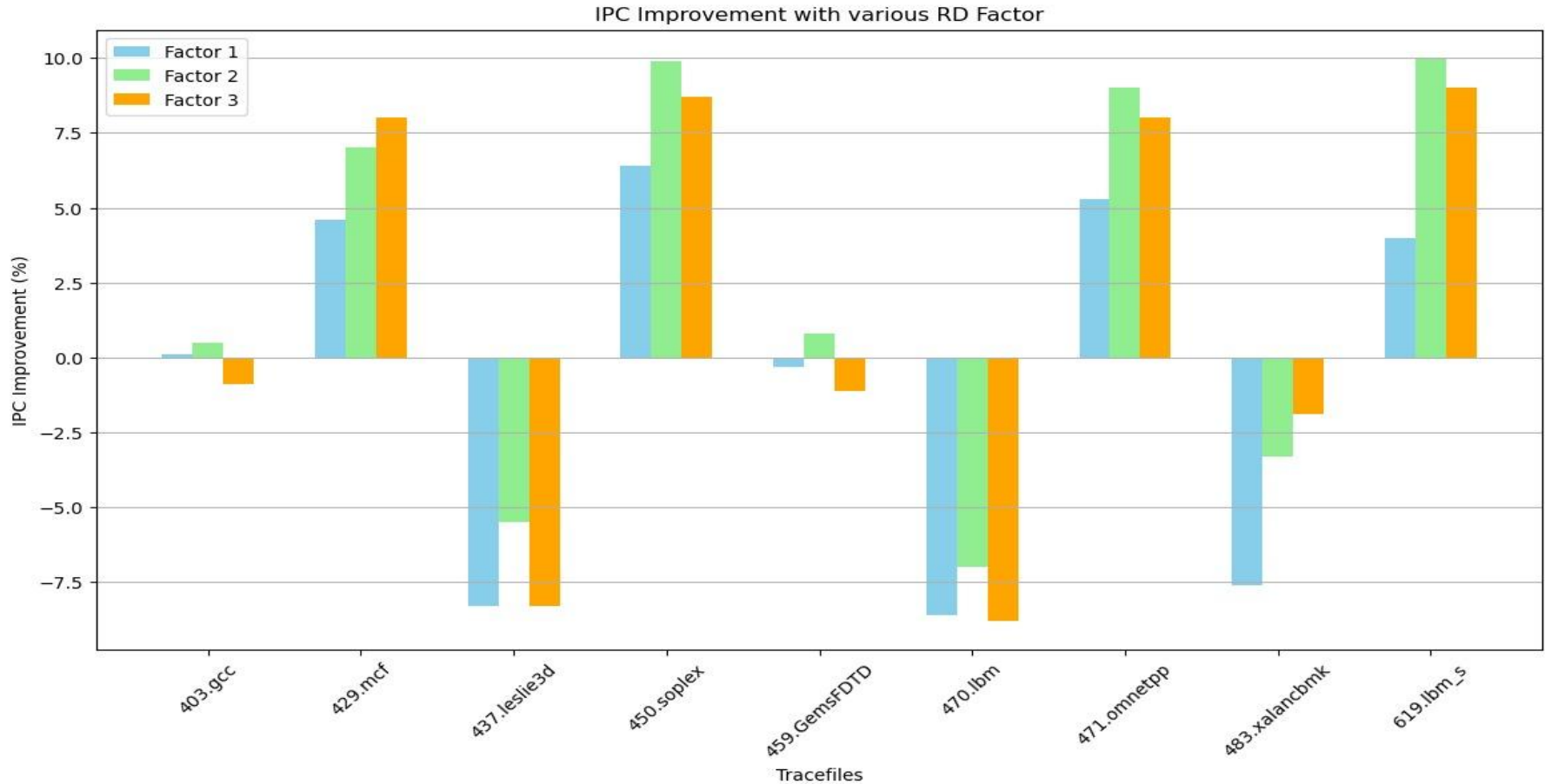
- Benchmarks : 459.GemsFDTD, 403.gcc, 429.mcf, 450.soplex, 470.lbm, 437.leslie3d, 471.omnetpp, 483.xalancbmk
- Cache Configuration :

| Cache | Size | Sets | Ways | Latency(cycles) |
|-------|-------|------|------|-----------------|
| L1I | 64KB | 64 | 8 | 4 |
| L1D | 64KB | 64 | 8 | 5 |
| L2C | 512KB | 1024 | 8 | 10 |
| LLC | 2MB | 2048 | 16 | 20 |

Results : RD Factor (MPKI)



Results : RD Factor (IPC)

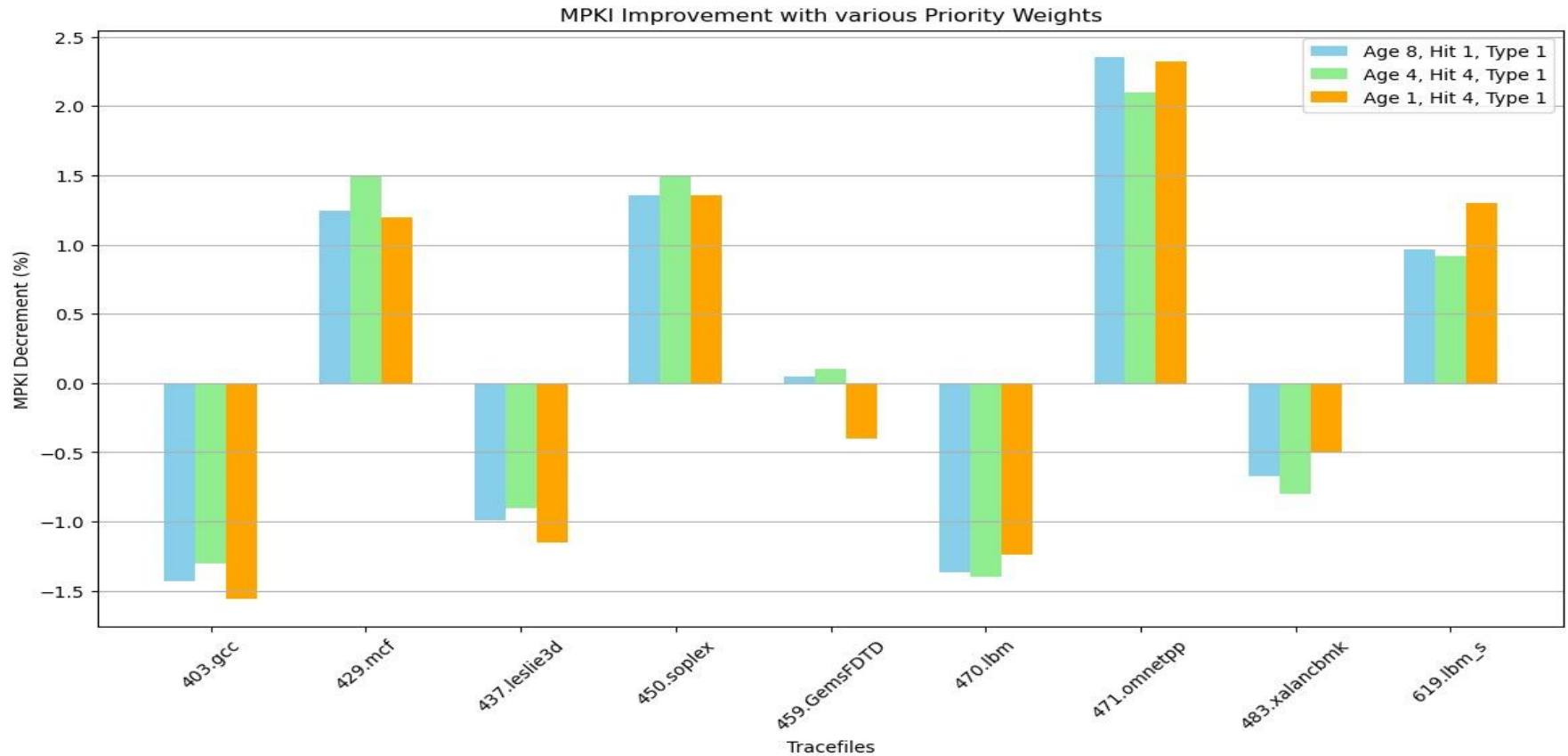


Insights from varying RD Factor :

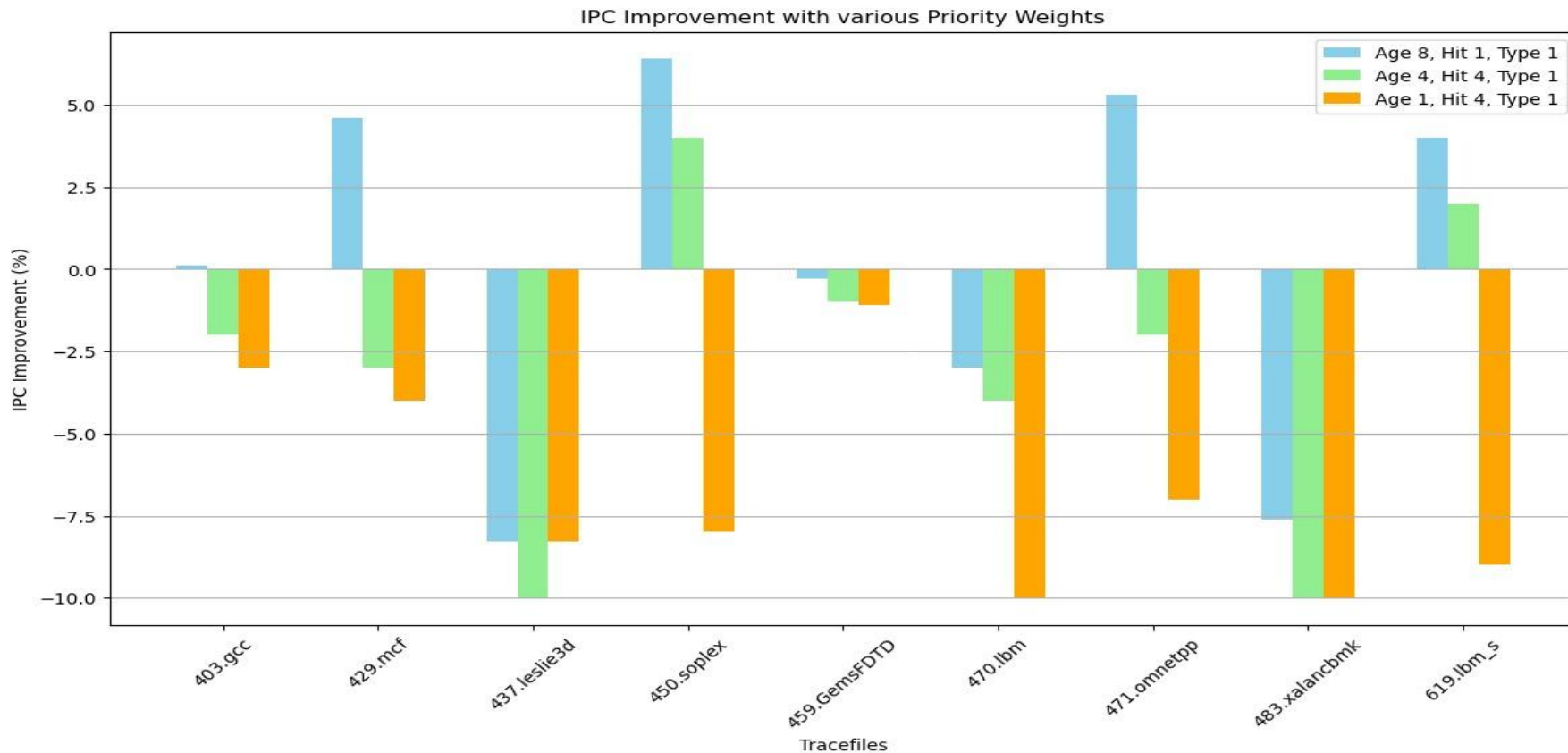
| RD Factor | Overall MPKI Improvement | Overall IPC Speedup |
|-----------|--------------------------|---------------------|
| 1 | 0.15% | -0.22% |
| 2 | 0.22% | 2.15% |
| 3 | 0.19% | 1.85% |

Optimum RD Factor: 2

Results : Weight Priority (MPKI)



Results : Weight Priority (IPC)



Insights from varying Weight Priorities

| Weight Priority (Age, Hit, Type) | Overall MPKI Improvement | Overall IPC Speedup |
|-------------------------------------|-----------------------------|------------------------|
| (8,1,1) | 0.22% | 2.15% |
| (4,4,1) | 0.18% | 1.04% |
| (1,4,1) | 0.10% | 0.57% |

Optimum Weights: (8,1,1)

Observations

- Decreasing Age Priority affects the speedup by a lot
- Increasing Hit Rate Priority did not have significant effects
- RLR shows better overall performance than LRU

Thank You