

Coded Caching: Dichotomy of the One and the Many

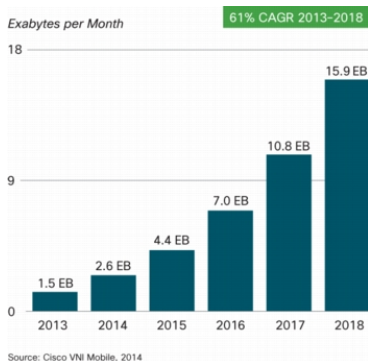
Nikhil Karamchandani

Indian Institute of Technology, Bombay

Joint work with Jad Hachem and Suhas Diggavi, UCLA

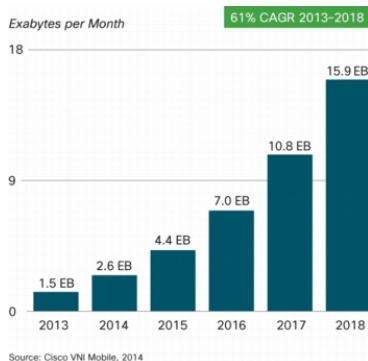
JTG Workshop 2015

Motivation



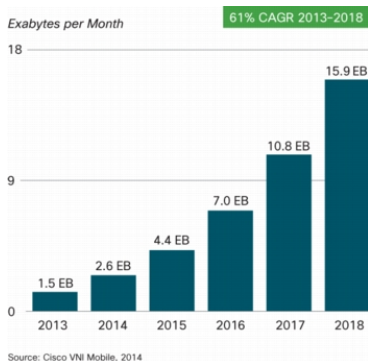
- Multimedia applications fueling increased data consumption

Motivation



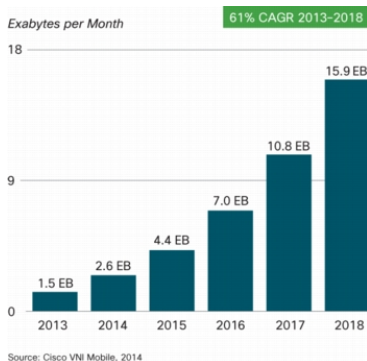
- Multimedia applications fueling increased data consumption
- In-network caching

Motivation



- Multimedia applications fueling increased data consumption
- In-network caching
- Pre-fetch content during off-peak hours

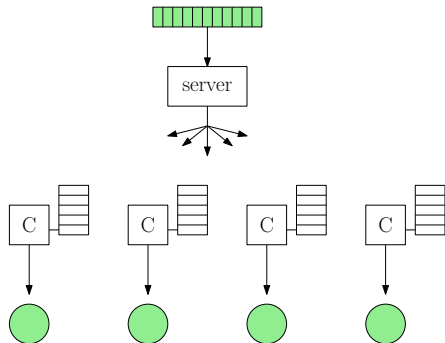
Motivation



- Multimedia applications fueling increased data consumption
- In-network caching
- Pre-fetch content during off-peak hours
- Rate-benefits vs Memory

Effect of number of users in multi-level coded caching

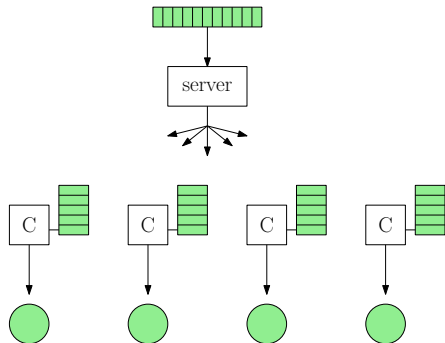
Effect of number of users in multi-level coded caching¹



- N files, K caches, K users

¹M. A. Maddah-Ali and U. Niesen, "Fundamental limits of caching," ISIT 2013

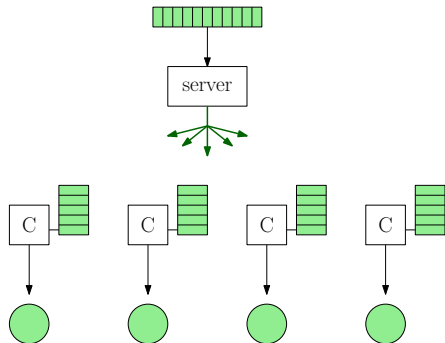
Effect of number of users in multi-level coded caching¹



- N files, K caches, K users
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 - Place content in caches
 - Done without prior knowledge of user requests

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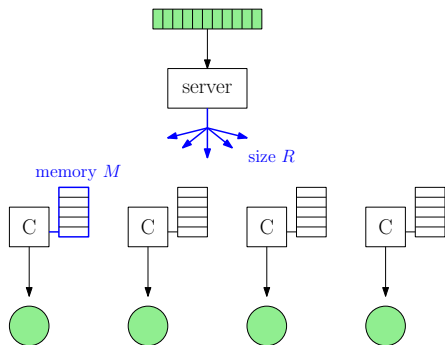
Effect of number of users in multi-level coded caching¹



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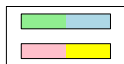
Effect of number of users in multi-level coded caching¹



- N files, K caches, K users
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 - Each user requests a file
 - Server assists in delivery
- Given memory M , smallest rate R ?

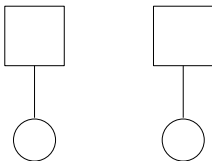
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Uncoded caching example

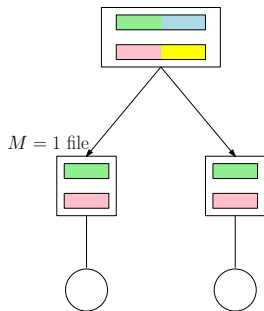


- $N = 2$ files, $K = 2$ caches

$M = 1$ file



Uncoded caching example

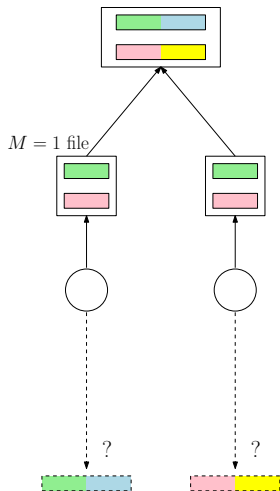


- $N = 2$ files, $K = 2$ caches

Placement phase

- Place first half of each file in each cache

Uncoded caching example



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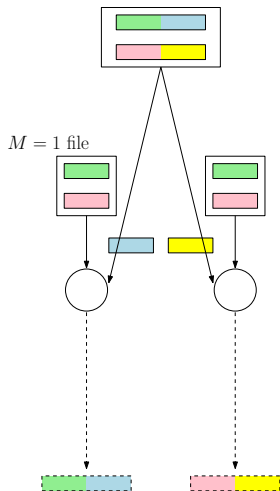
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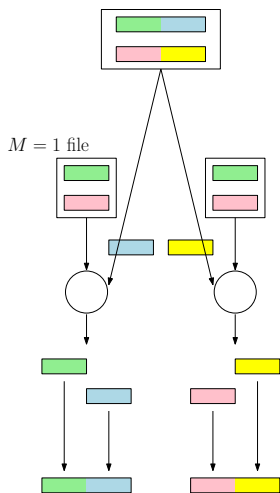
Placement phase

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- Server unicasts missing piece for each user

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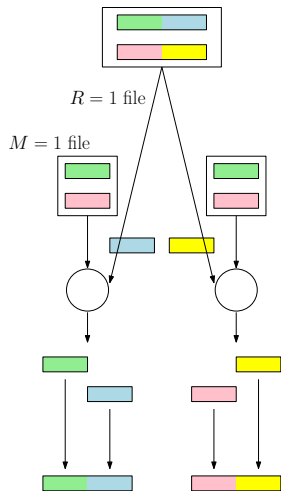
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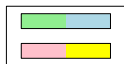
- Each user makes their request
- Server unicasts missing piece for each user
- Users recover requested files

Uncoded caching example



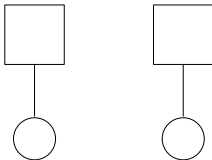
Total rate: $R = 1$ file

Coded caching example²



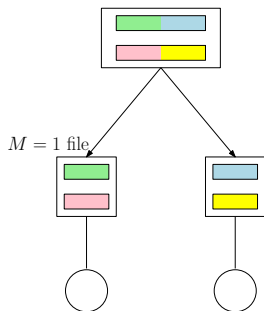
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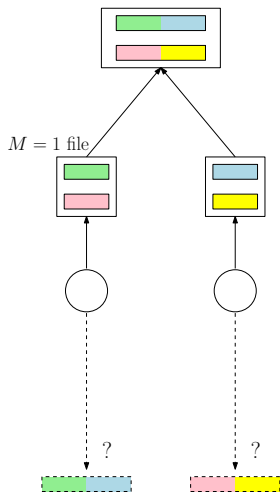
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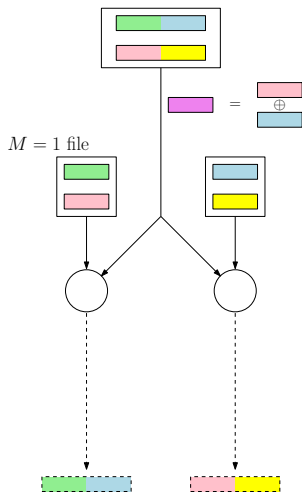
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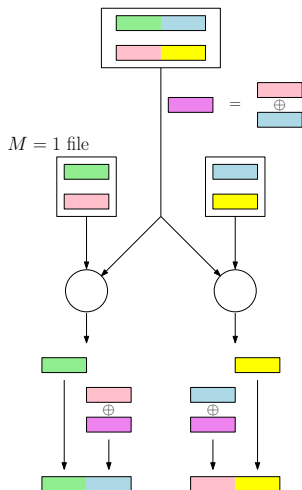
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Coded caching example²



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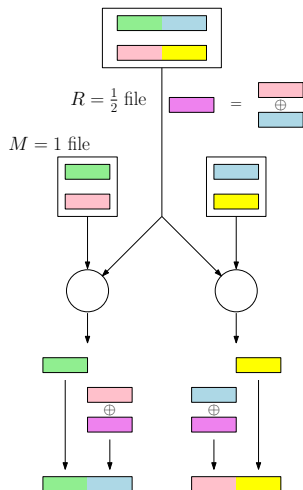
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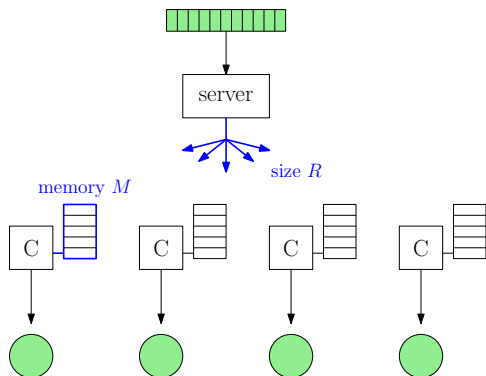
Coded caching example²



Total rate: $R = \frac{1}{2}$ file

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Coded Caching³



- N files
- K caches
- K users

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Coded Caching³

- Store content to create coded multicasting opportunities

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- Use coding in the broadcast

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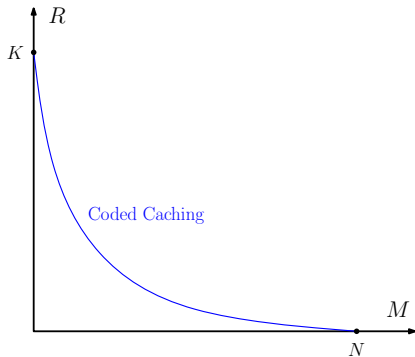
Coded Caching³

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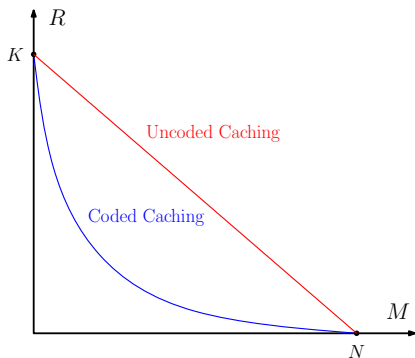


$$R \approx \min \left\{ \frac{N}{M} - 1, K \right\}$$

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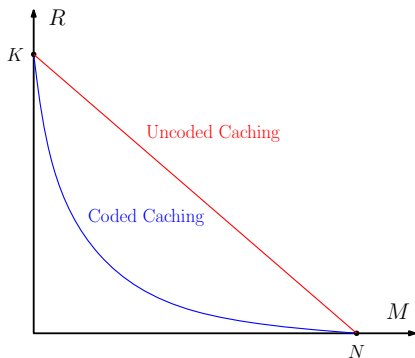


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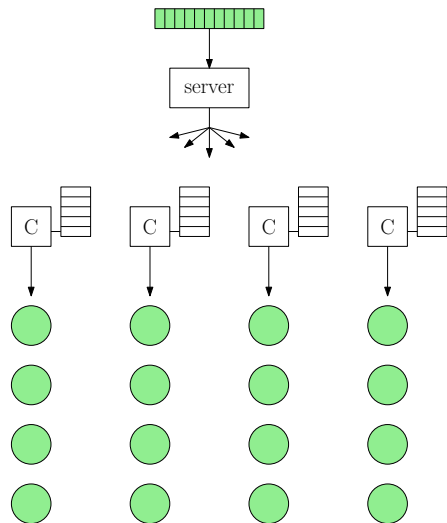


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- Scheme is order-optimal w.r.t information-theoretic bounds.

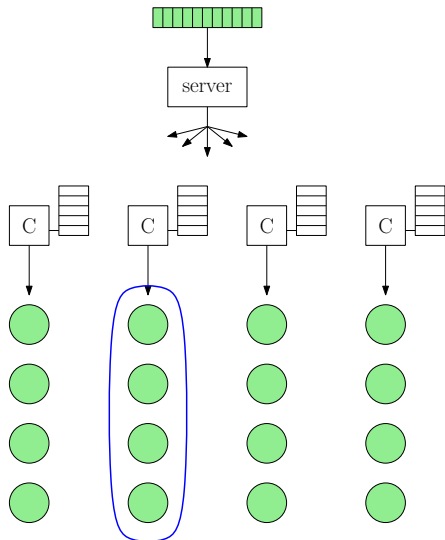
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Effect of number of users in multi-level coded caching



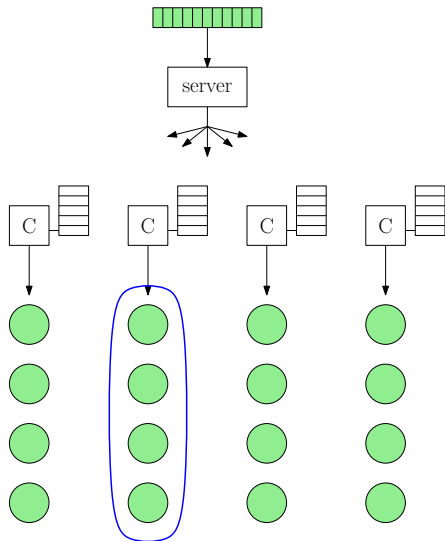
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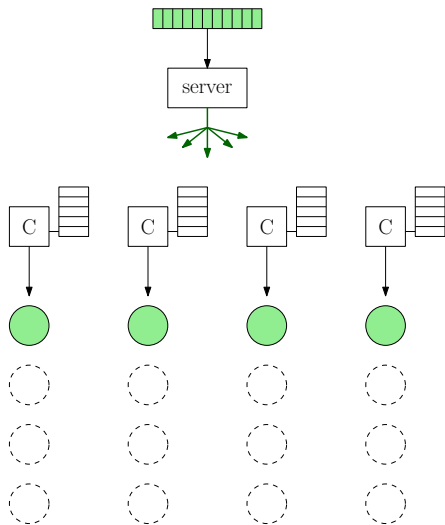
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- Users with identical side information

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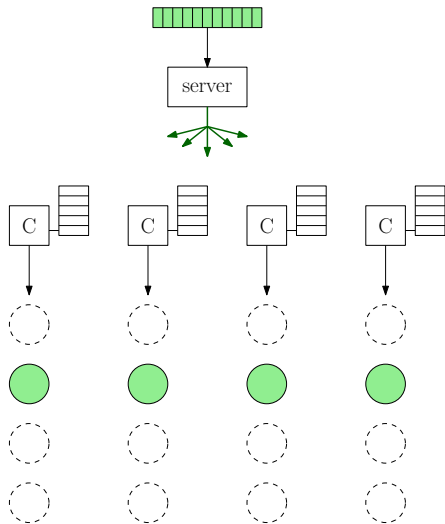
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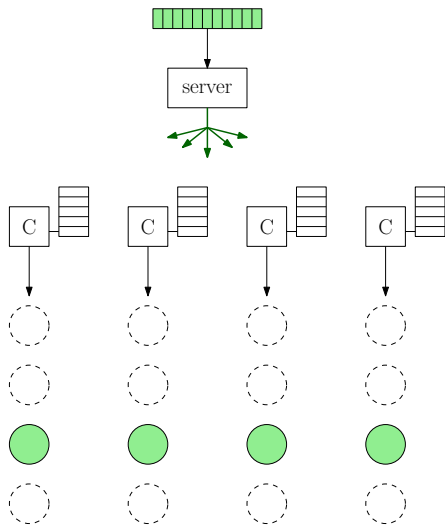
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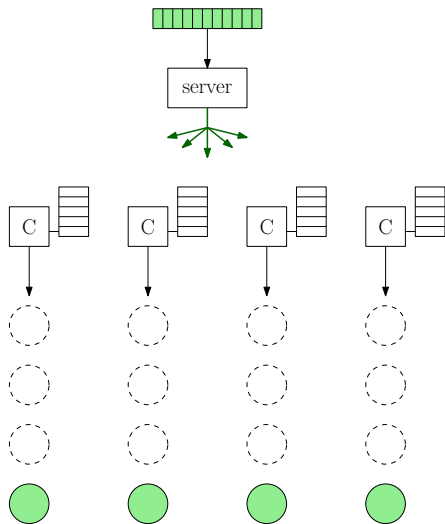
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File popularity:

Likelihood of being requested by a user

Effect of number of users in multi-level coded caching

File popularity:

Likelihood of being requested by a user

Different models in the literature:

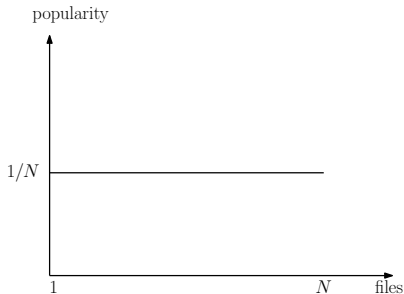
Effect of number of users in multi-level coded caching

File popularity:

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Different models in the literature:

- Uniform

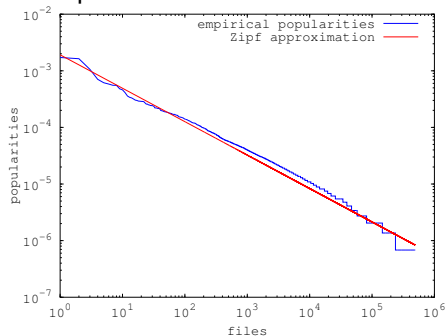


Effect of number of users in multi-level coded caching

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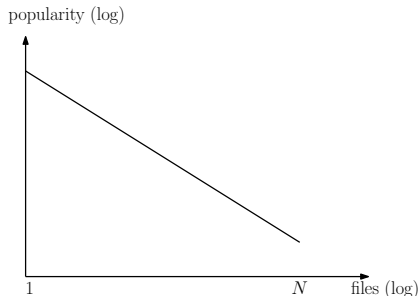
Likelihood of being requested by a user

Example: YouTube



Different models in the literature:

- Uniform
- Zipf (power law)



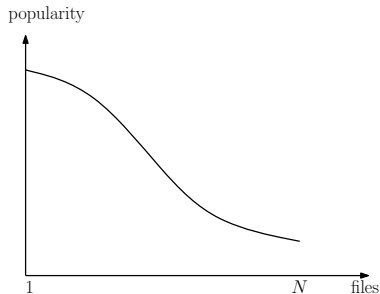
Effect of number of users in multi-level coded caching

File popularity:

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Different models in the literature:

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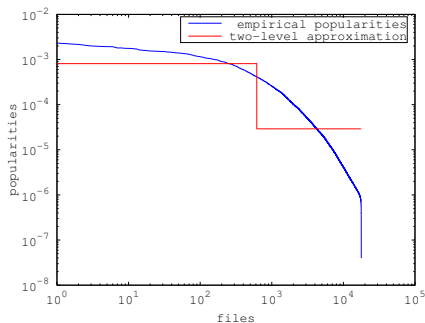


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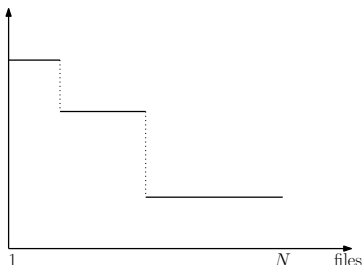
Example: Netflix



Different models in the literature:

- Uniform
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- Multi-level [H., K., D., 2014]

popularity

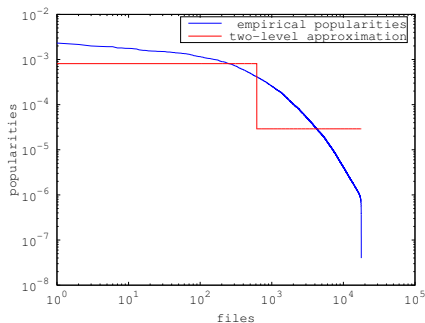


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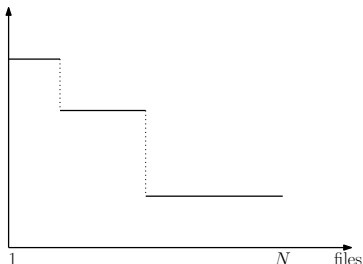
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Different models in the literature:

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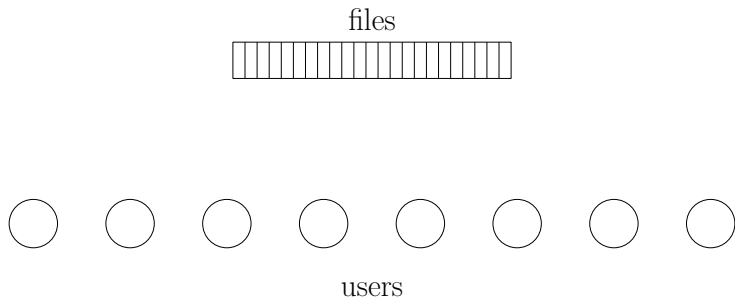
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Effect of number of users in multi-level coded caching

General

Example



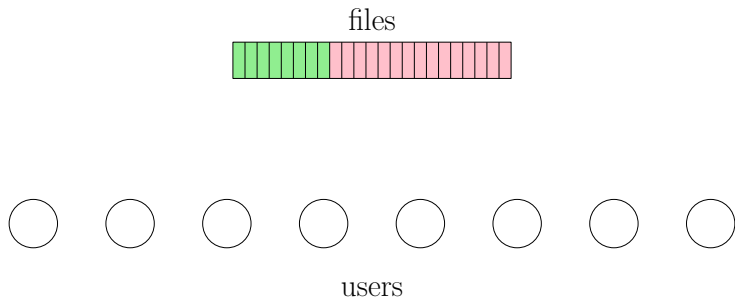
Effect of number of users in multi-level coded caching

General

- Files divided into popularity levels (classes)

Example

- 2 levels



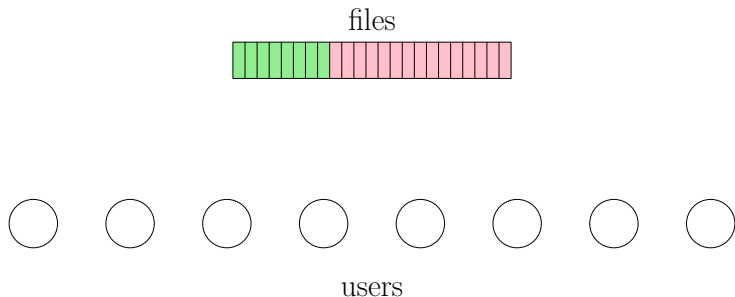
Effect of number of users in multi-level coded caching

General

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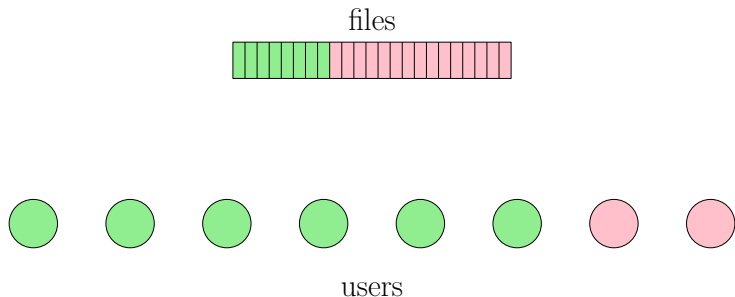
Effect of number of users in multi-level coded caching

General

- Files divided into popularity levels (classes)
 - Uniform popularity within each level
- Fixed fraction of users per level

Example

- 2 levels
- 75%–25%

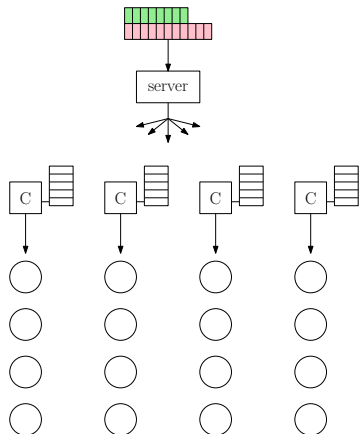


Effect of number of users in multi-level coded caching

Example: 2 levels of files, dividing users into 75%–25%

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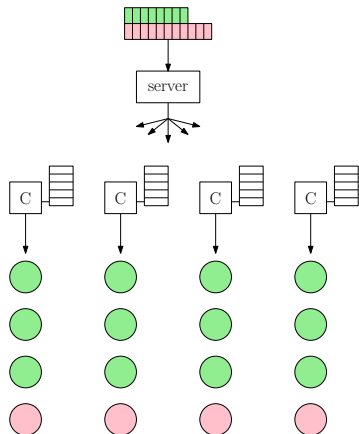
“Multi-user setup”

[H., K., D., 2014]

- 4 users per cache

Effect of number of users in multi-level coded caching

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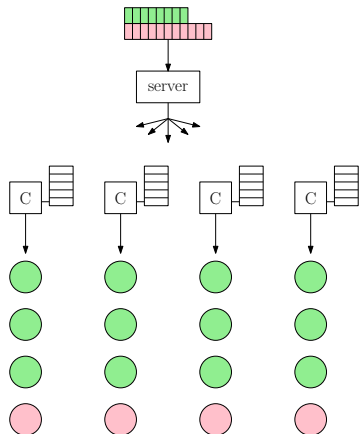
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- 4 users per cache
- Level 1: 3 users per cache;
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Effect of number of users in multi-level coded caching

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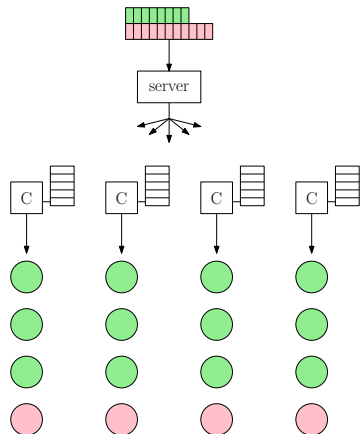
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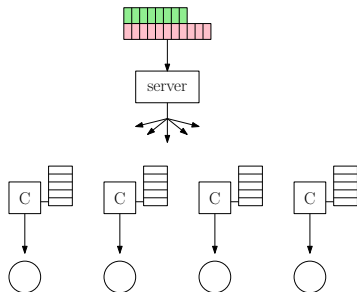
- 4 users per cache
- Level 1: 3 users per cache;
Level 2: 1 user per cache
- Proportion maintained at each cache
- Expected when number of users per cache is large

Effect of number of users in multi-level coded caching

Example: 2 levels of files, dividing users into 75%–25%

“Single-user setup”

- One user per cache

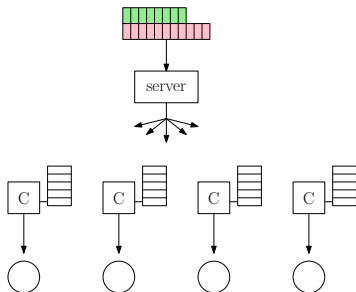


Effect of number of users in multi-level coded caching

Example: 2 levels of files, dividing users into 75%–25%

“Single-user setup”

- One user per cache
- 4 users total

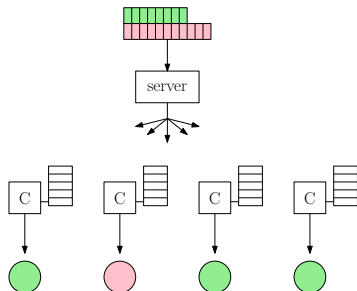


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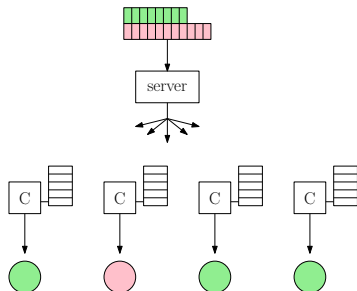


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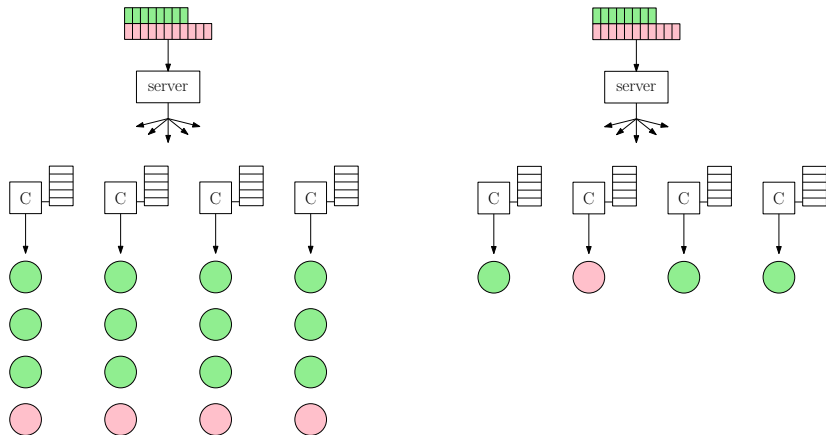
“Single-user setup”

- One user per cache
- 4 users total
- Level 1: 3 users;
Level 2: 1 user
- Proportion maintained across
all caches



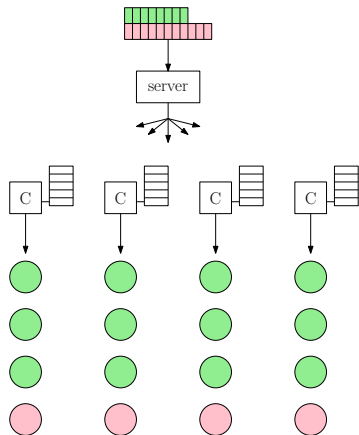
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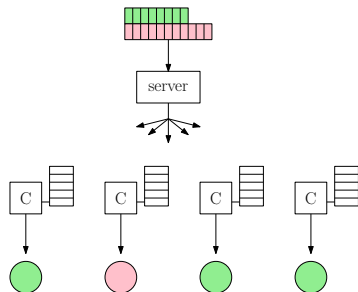


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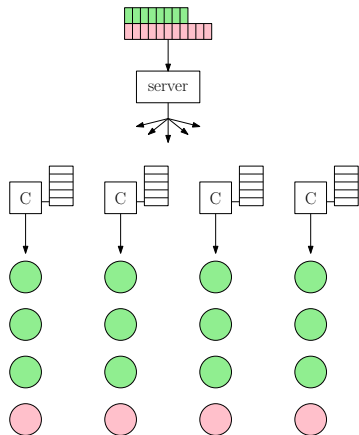
Same user profile at each cache



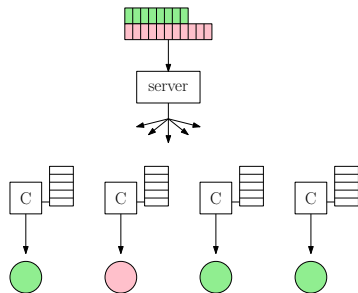
Different user profile at each cache

Effect of number of users in multi-level coded caching

Example: 2 levels of files, dividing users into 75%–25%



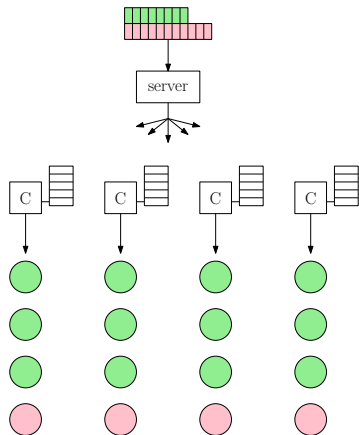
Same user profile at each cache
Predictability per cache



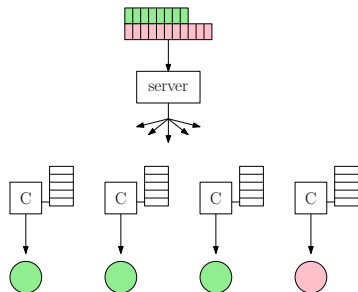
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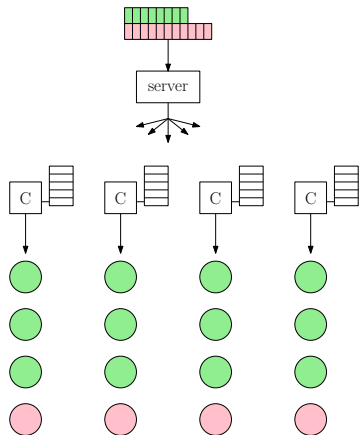
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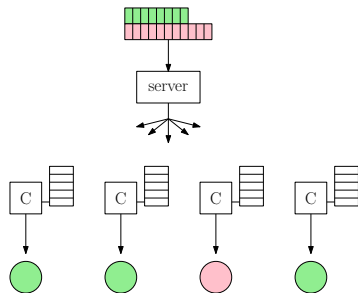
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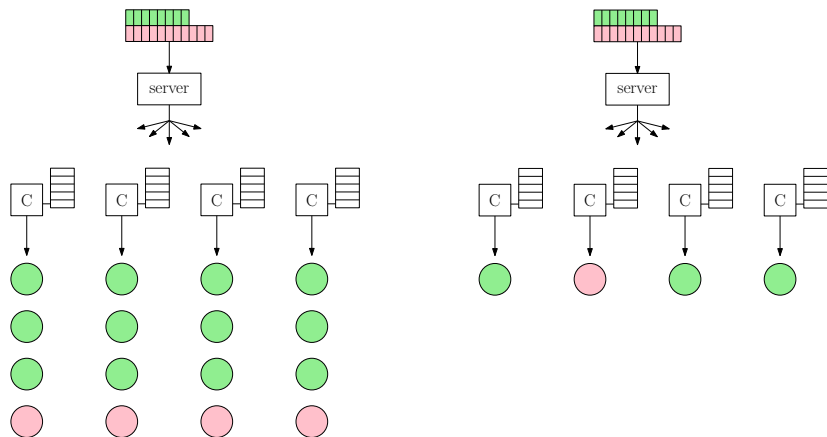
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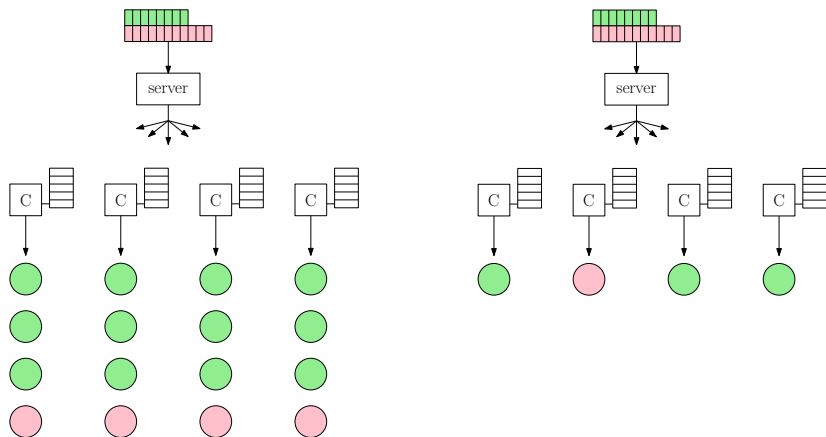
Effect of number of users in multi-level coded caching

Main Question: Are these two setups fundamentally different?



Effect of number of users in multi-level coded caching

Main Question: Are these two setups fundamentally different?



Yes! They require different strategies.

Main results

Multi-user setup

Single-user setup

Multi-user setup

- Memory-sharing strategy
 - *Separation* of levels

Single-user setup

Multi-user setup

- Memory-sharing strategy
 - *Separation* of levels

Single-user setup

- Threshold-and-cluster strategy
 - *Merging* of levels

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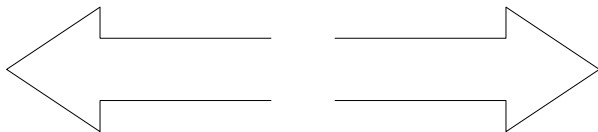
- Memory-sharing strategy
 - *Separation* of levels
- Order-optimal
- Threshold-and-cluster is inefficient

Single-user setup

- Threshold-and-cluster strategy
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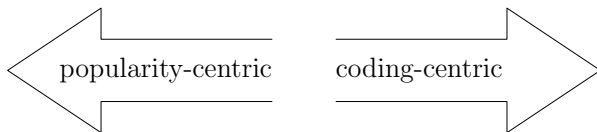
Why different strategies?

Two main forces drive any strategy:



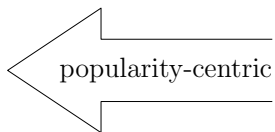
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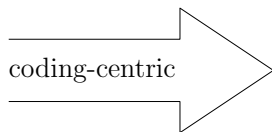


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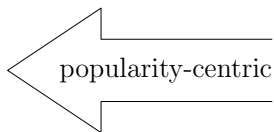
- More popular files get more memory



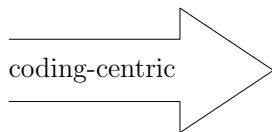
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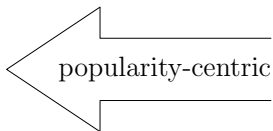


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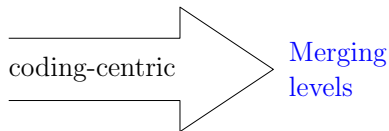
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coding-centric

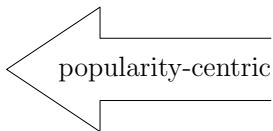


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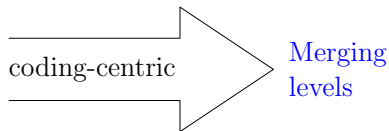
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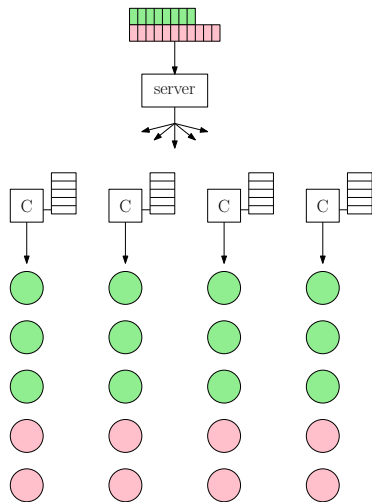
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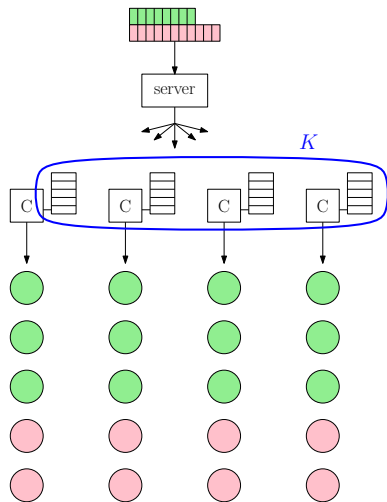


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Multi-user setup (formal)

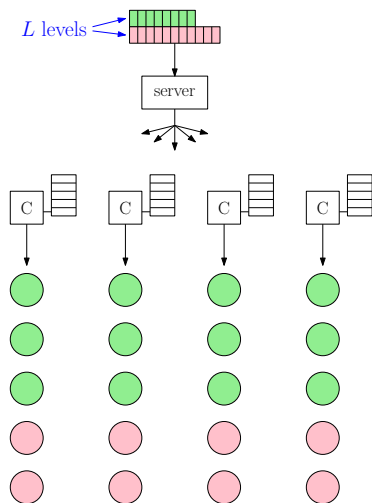


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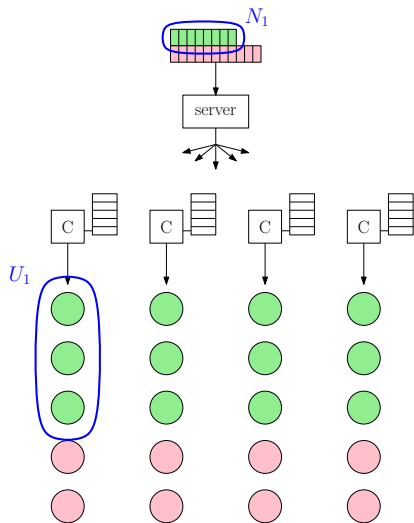
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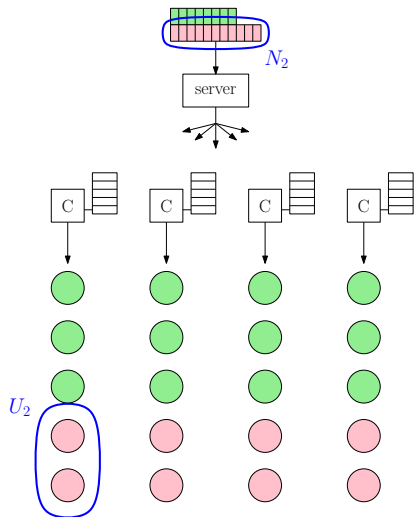
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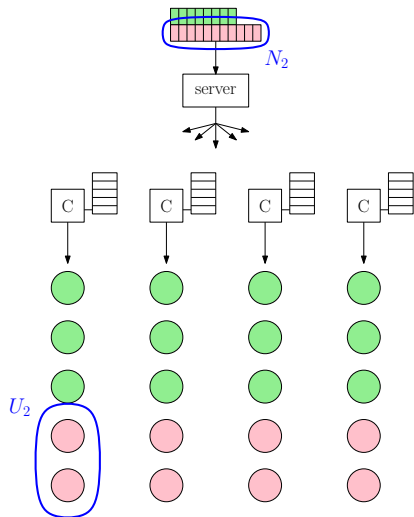
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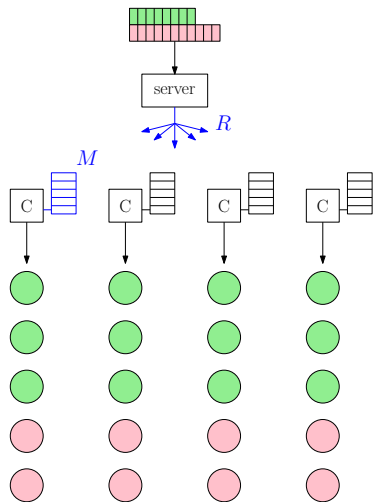
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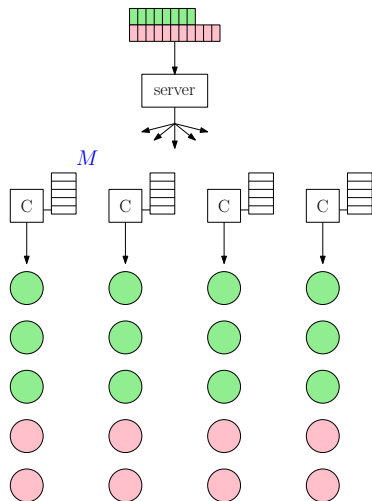
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- Resources:
 - Cache memory M
 - Broadcast rate R

Strategy: memory-sharing

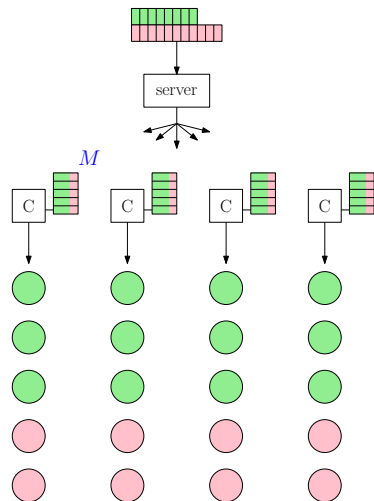
[H., K., D., 2014]



- Separate the popularity levels

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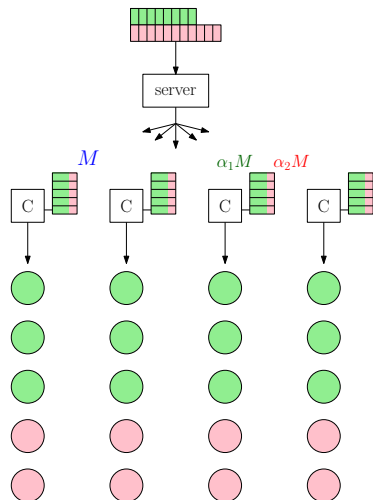
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- Separate the popularity levels
- Share memory M between the levels

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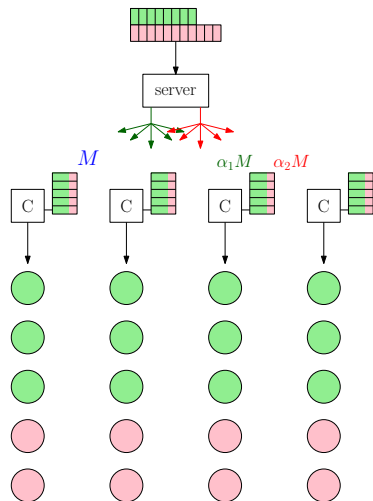
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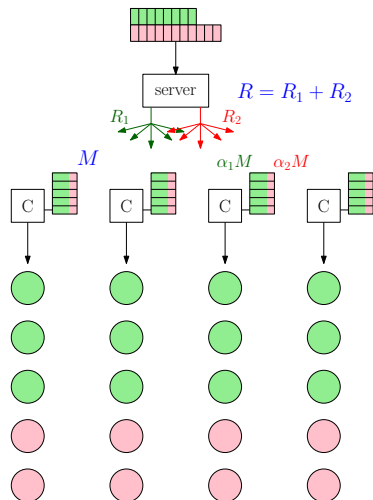
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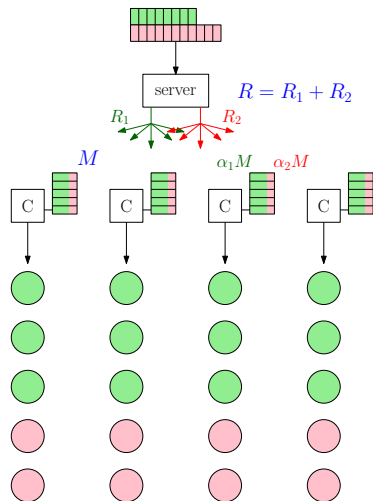
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Strategy: memory-sharing

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- Separate the popularity levels
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Strategy: memory-sharing

[H., K., D., 2014]

3 sets of levels

Strategy: memory-sharing

[H., K., D., 2014]

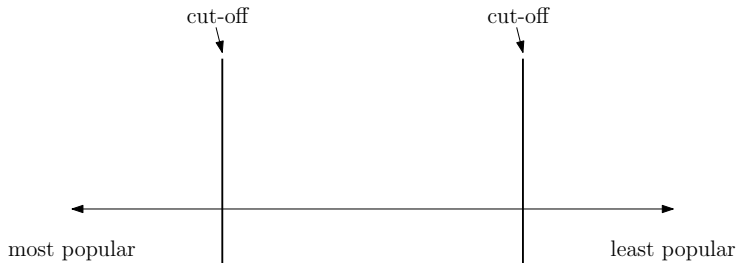
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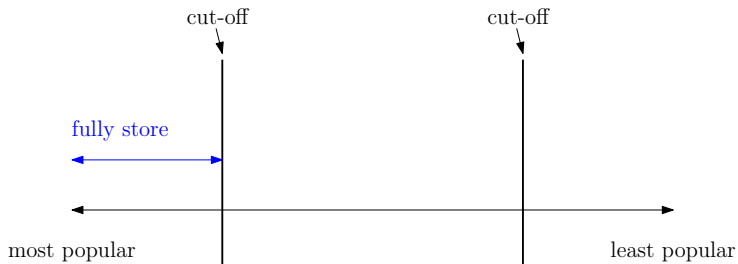
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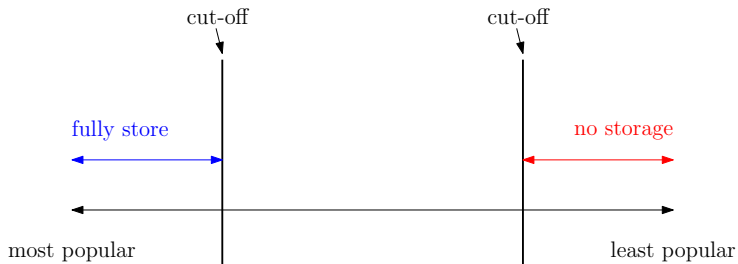
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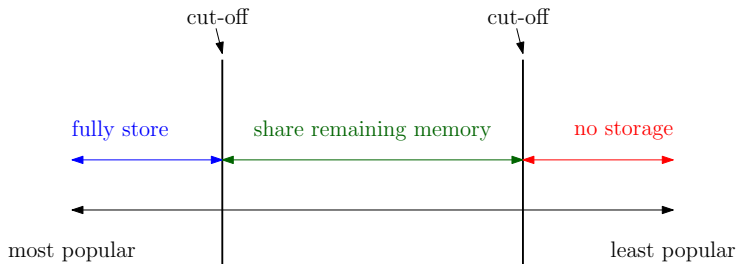
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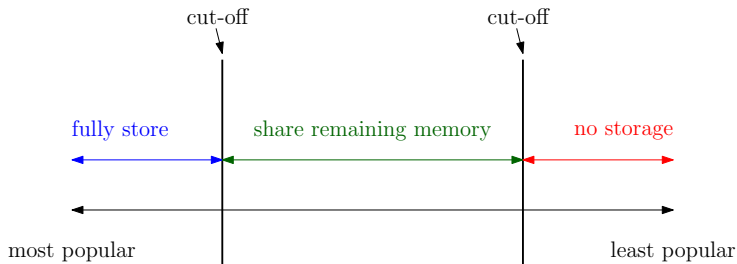
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[H., K., D., 2014]

3 sets of levels



Achieved rate:

$$R \approx \sum_h K U_h + \frac{(\sum_i \sqrt{N_i U_i})^2}{M - \sum_j N_j}$$

Order-optimality

Theorem (Order-optimality of memory-sharing for the multi-user setup)

*In the **multi-user** setup:*

$$\frac{\text{rate achieved by **memory-sharing**}}{\text{optimal rate } R^*} \leq c.$$

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Theorem (Order-optimality of memory-sharing for the multi-user setup)

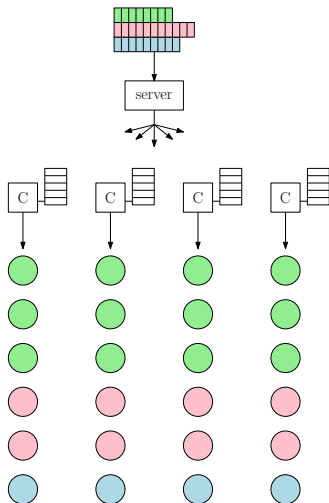
In the **multi-user** setup:

$$\frac{\text{rate achieved by memory-sharing}}{\text{optimal rate } R^*} \leq c.$$

- c is independent of problem parameters
- Proof: requires non-cut-set lower bounds on R^*

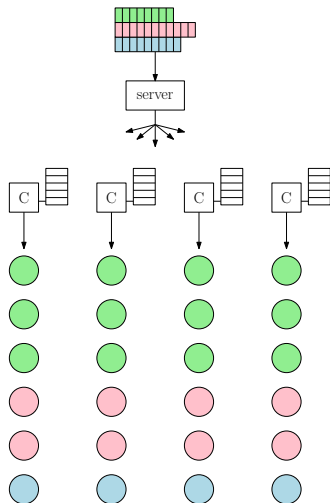
Lower bounds for multi-user setup

- Capture:
 - Necessity of level separation
 - All levels present at each cache



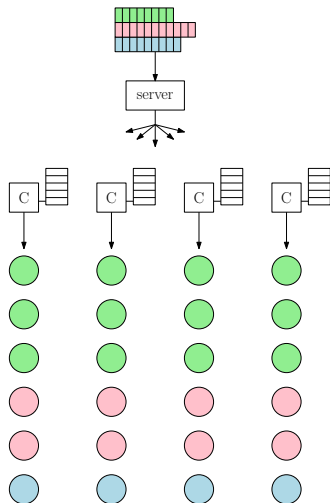
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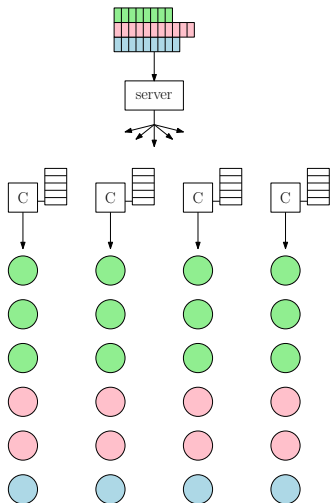
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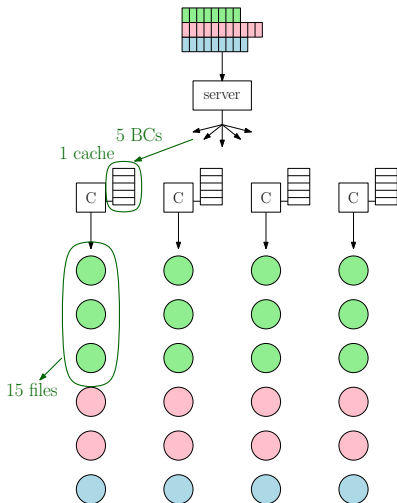
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- Individual terms can be derived using cut-set bounds



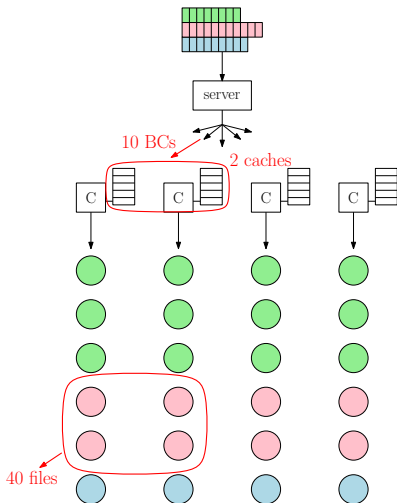
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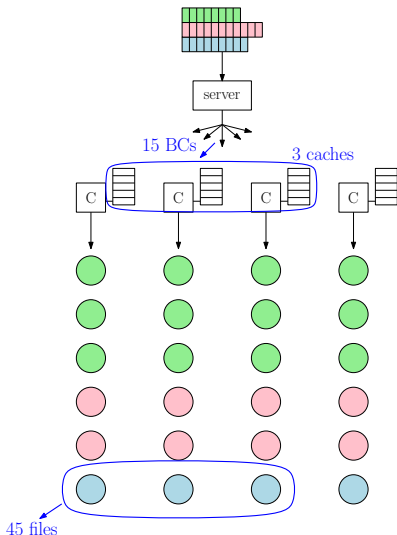
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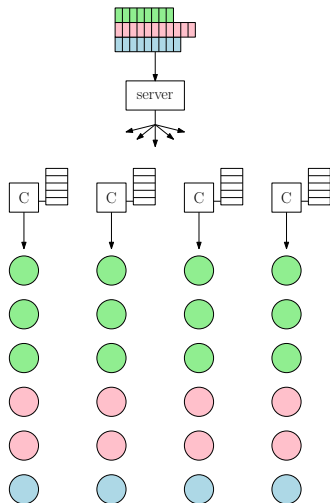
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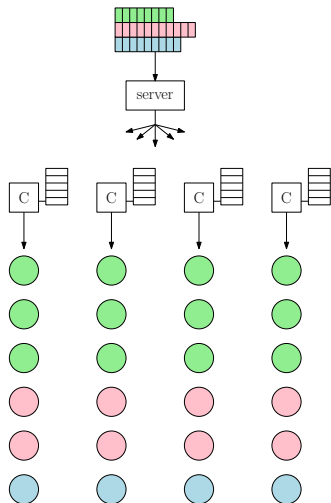
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- Combine?



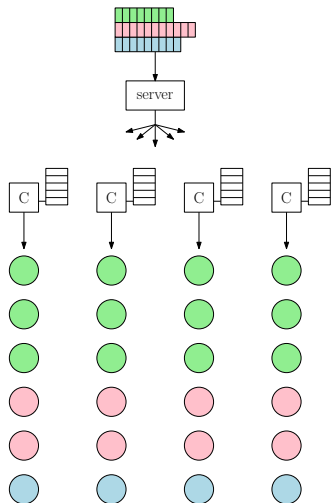
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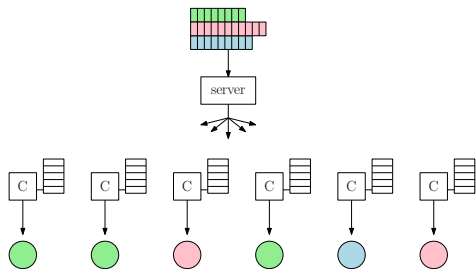


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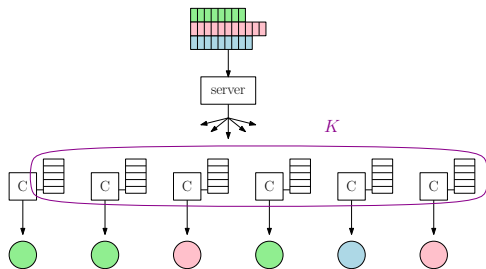
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 - Sliding-window subset entropy inequality [Jiang *et al.*, 2011]
 - \implies “non-cut-set” lower bounds that account for each level’s allocated memory, **without any restriction on the scheme**



Single-user setup (formal)

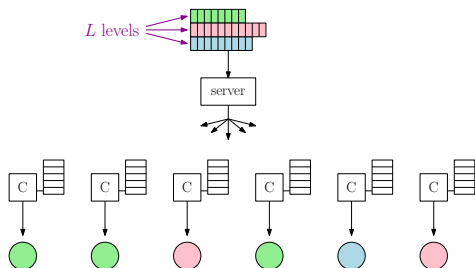


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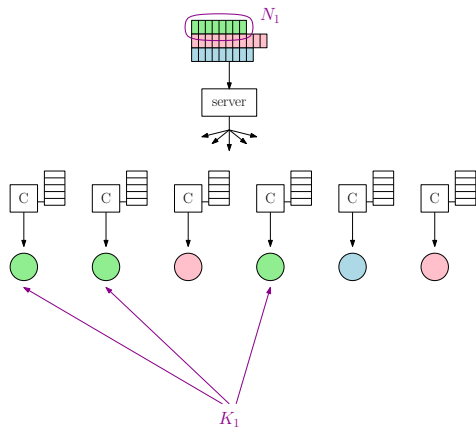
- # of caches
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Single-user setup (formal)



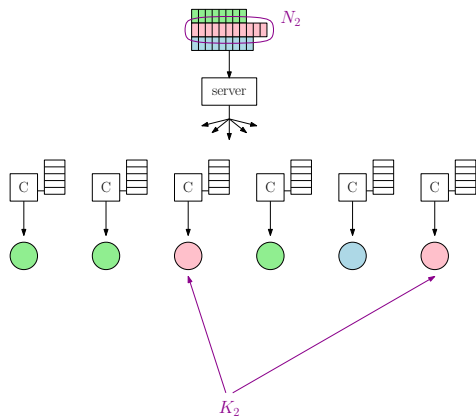
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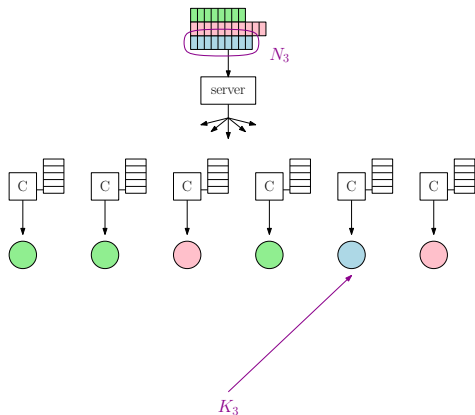
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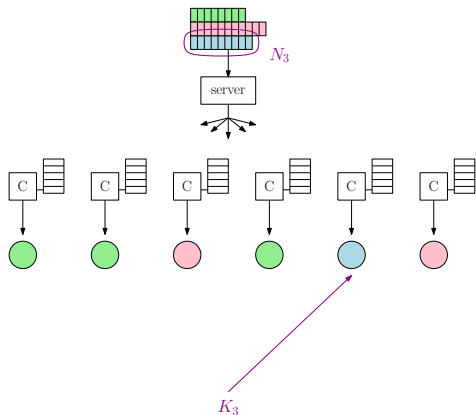
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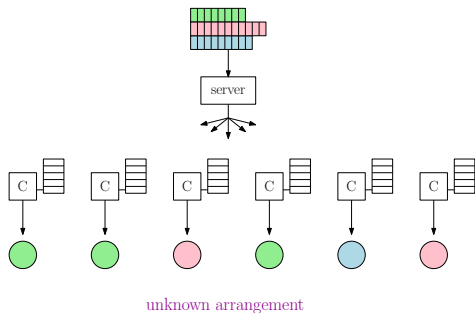
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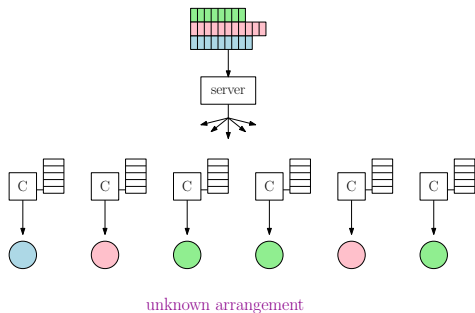
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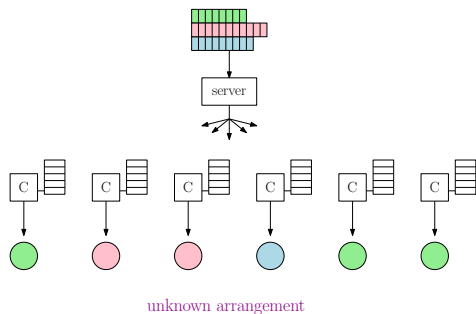
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Single-user setup (formal)



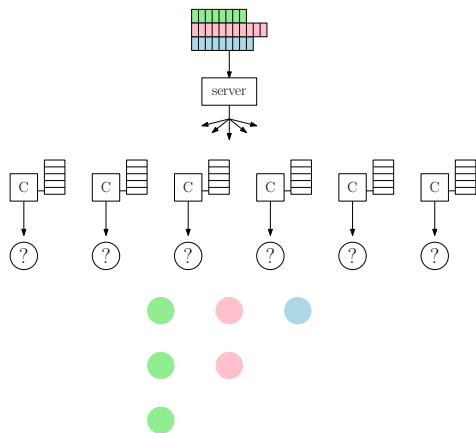
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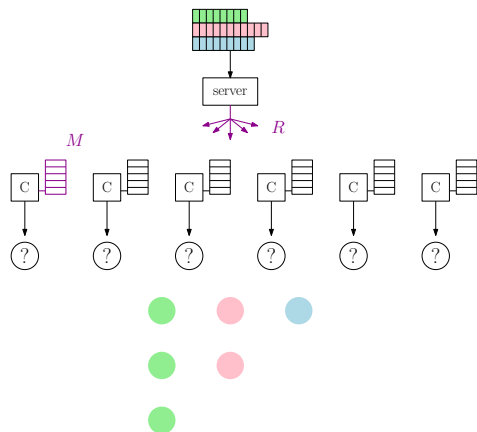
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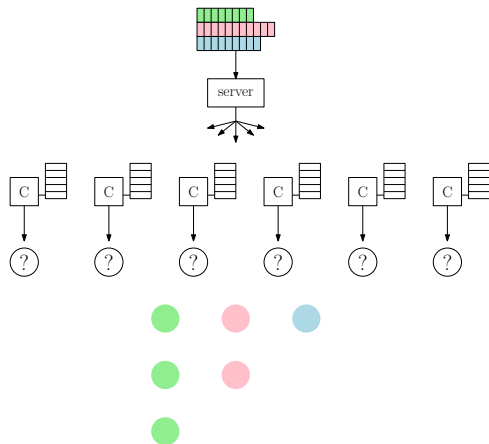
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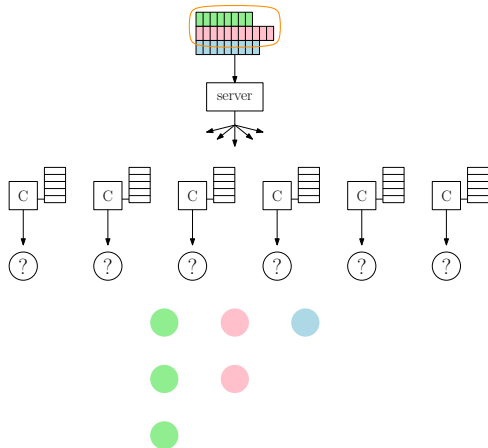
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- Different possible arrangements
- Resources:
 - Cache memory M
 - Broadcast rate R

Strategy: threshold-and-cluster



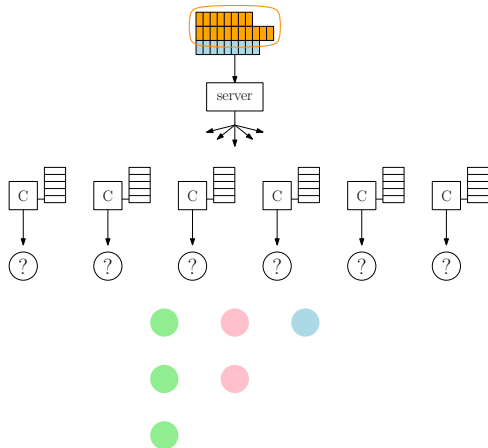
- Idea: merge some levels; ignore the rest

Strategy: threshold-and-cluster



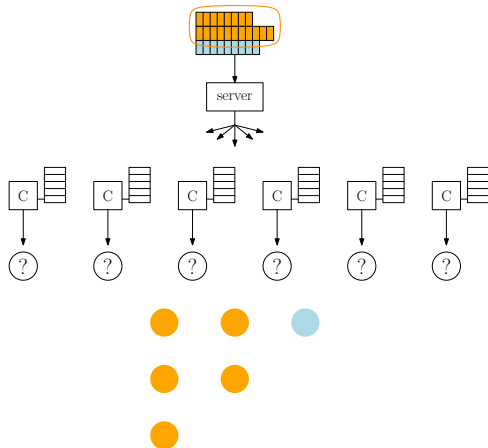
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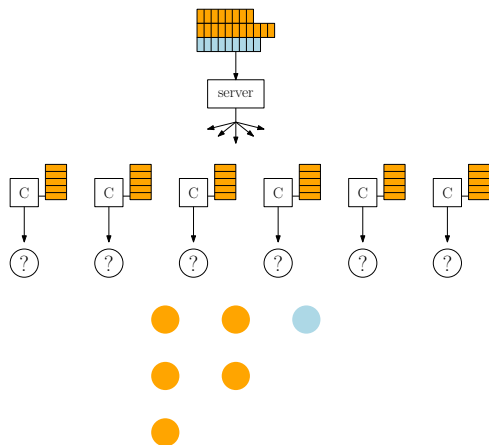
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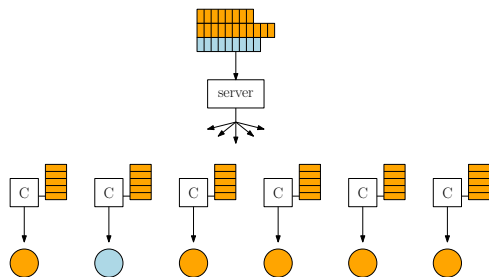
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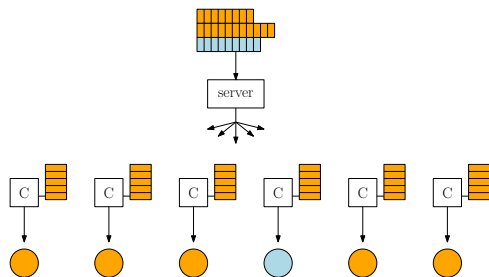
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Strategy: threshold-and-cluster



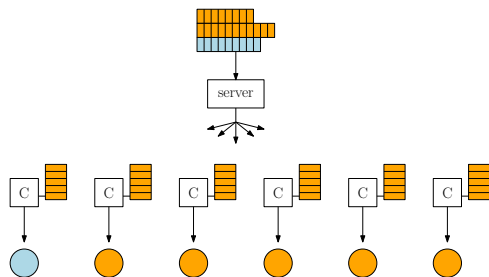
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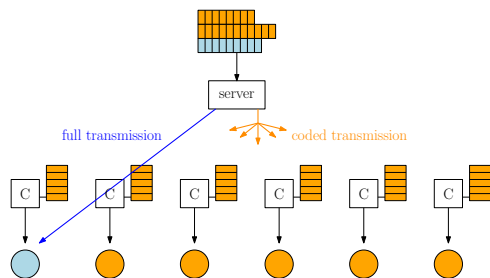
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 - Different possible user profiles

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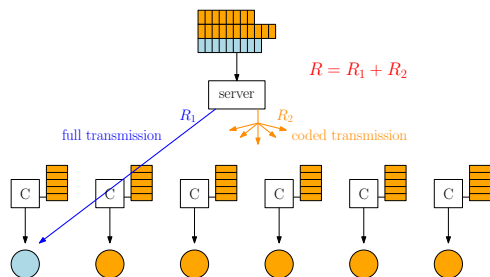
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 - Send BC transmissions

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 - Total rate = sum of rates

Strategy: threshold-and-cluster

Which levels to merge?

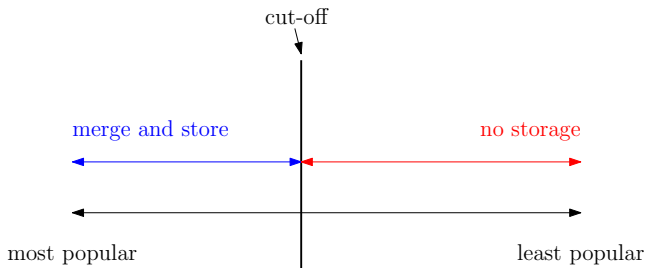
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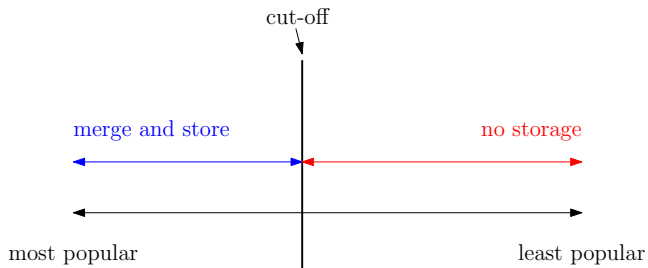
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Strategy: threshold-and-cluster

Which levels to merge?



Achieved rate:

$$R \approx \sum_h K_h + \frac{\sum_i N_i}{M}$$

Order-optimality

Theorem (Order-optimality of threshold-and-cluster for the single-user setup)

In the **single-user** setup:

$$\frac{\text{rate achieved by **threshold-and-cluster**}}{\text{optimal rate } R^*} \leq c.$$

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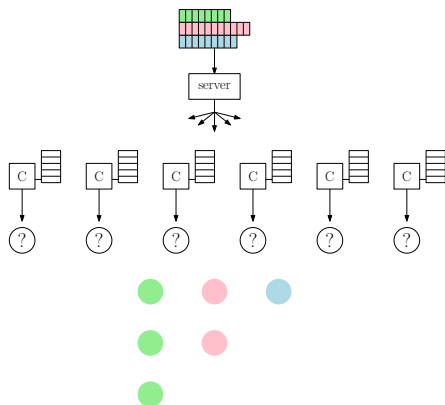
In the **single-user** setup:

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- c is independent of problem parameters
- Proof: cut-set lower bounds on R^* are sufficient

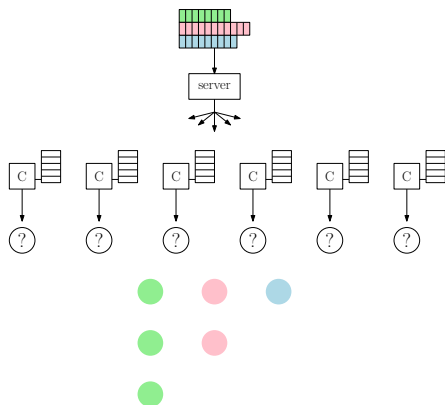
Lower bounds for single-user setup

- Capture:
 - Necessity of level merging
 - Uncertainty of level at caches



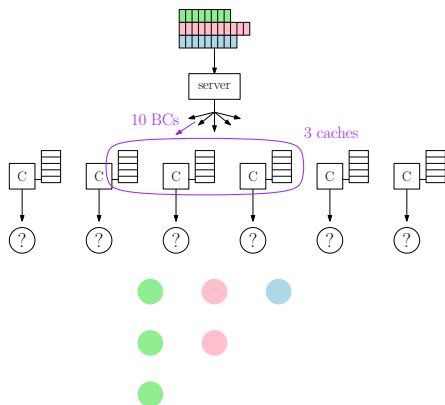
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 - Serve multiple levels together
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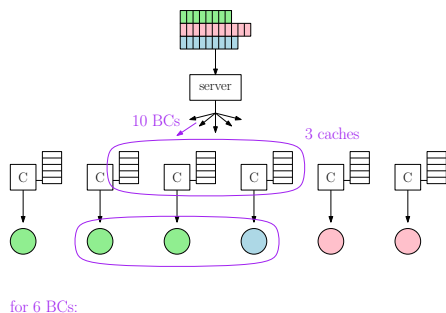
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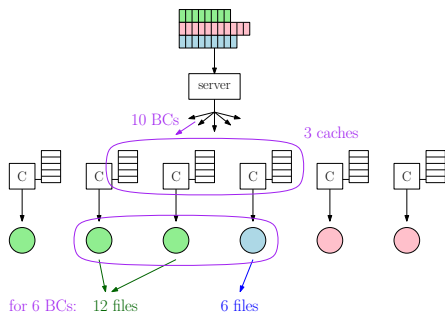
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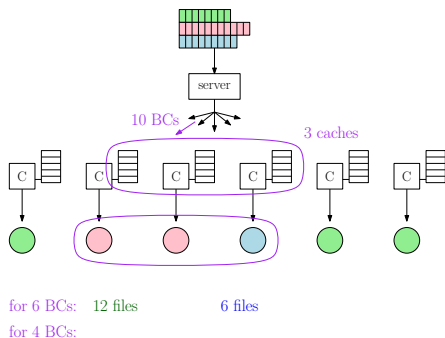
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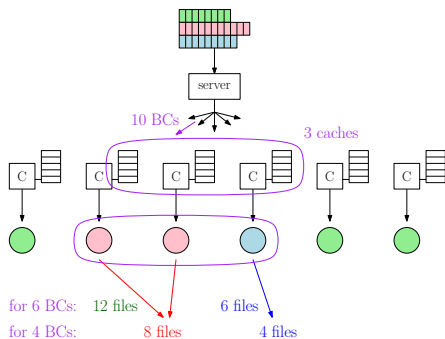
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One strategy to rule them all?

Question: Could one (or both) strategy be order-optimal in both cases?

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 - **Factor- L** increase in R
(L is the number of levels)

⇒ not order-optimal!

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 - **Factor- L** increase in R \implies not order-optimal!
(L is the number of levels)
- Threshold-and-cluster in multi-user setup?
 - Inefficiently distributes memory
 - No coding opportunities gained
 - **Arbitrarily large** increase in R \implies not order-optimal!

Summary

- Coded caching

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	Multi-user	Single-user
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Summary

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Memory-sharing		
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Thank you!