



# On Content Indexing for Off-Path Caching in Information-Centric Networks

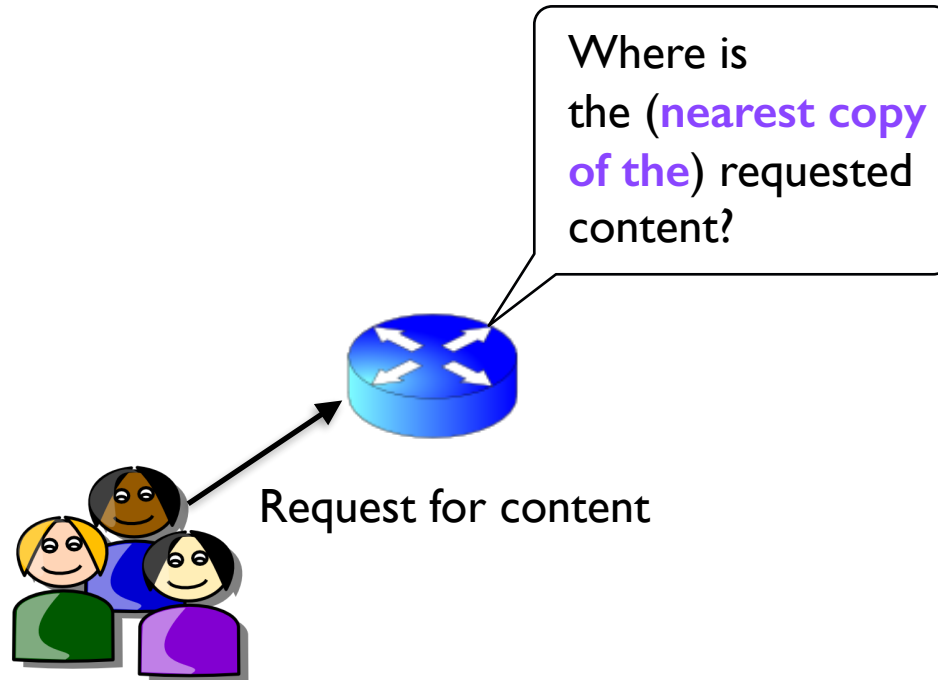
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# Name resolution service in ICN

- Standalone service (look-up by name)

- Directory service, *Name Resolution Server (NRS)*
- NRS maps names to locators and routing is done using locators

😊 Nearest-copy routing

😞 Scalability (temporary copies, update, storage, lookup)

- Name-based routing

- Route on names
- 😊 No need for a particular infrastructure support

😞 Nearest-copy routing?

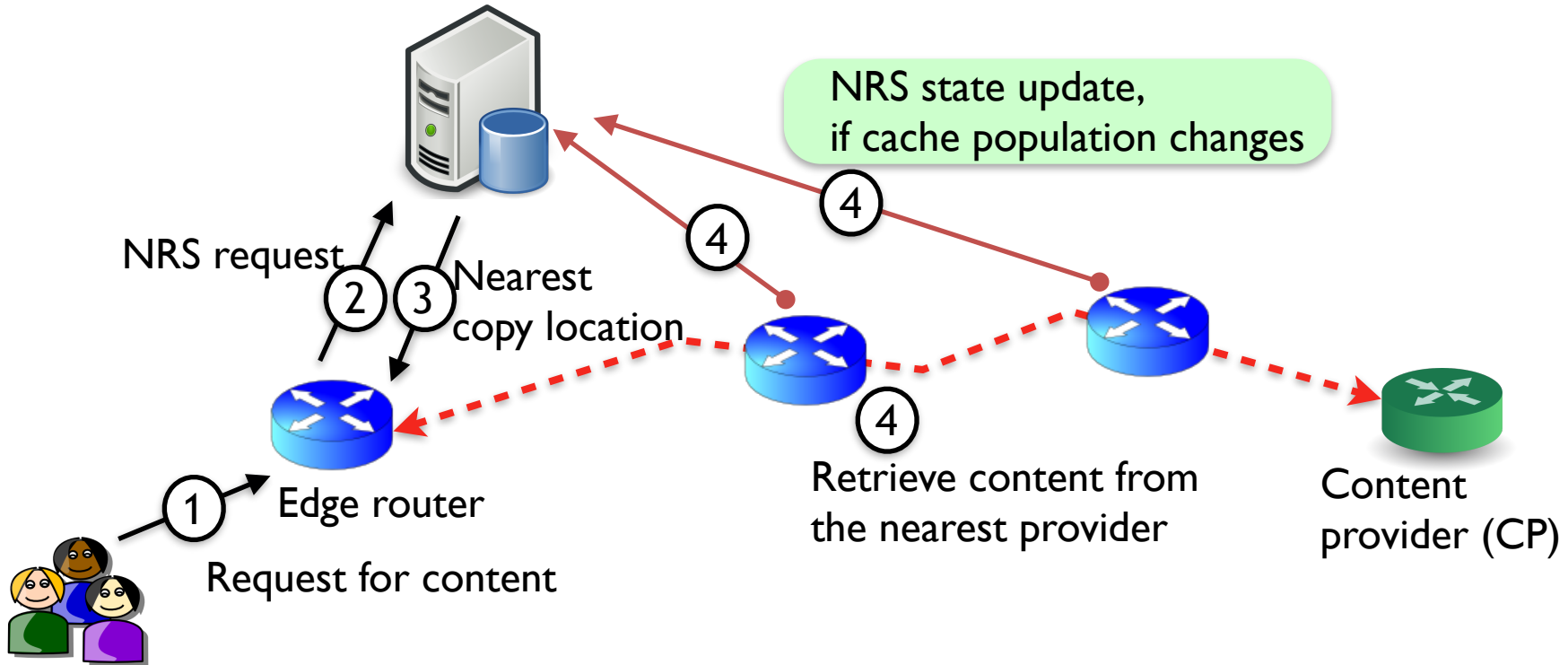


# Our contribution

- Can we *have an NRS that indexes only some of the content but brings most of the benefits?*
  - Partial NRS to balance the tradeoff between **scalability** and **nearest copy routing**
- We model the content delivery with and without NRS, and formulate an optimization problem to identify **which items to index**
- Our **optimal NRS setting** aims to minimize the content delivery cost under a limit on maximum number of items to be indexed

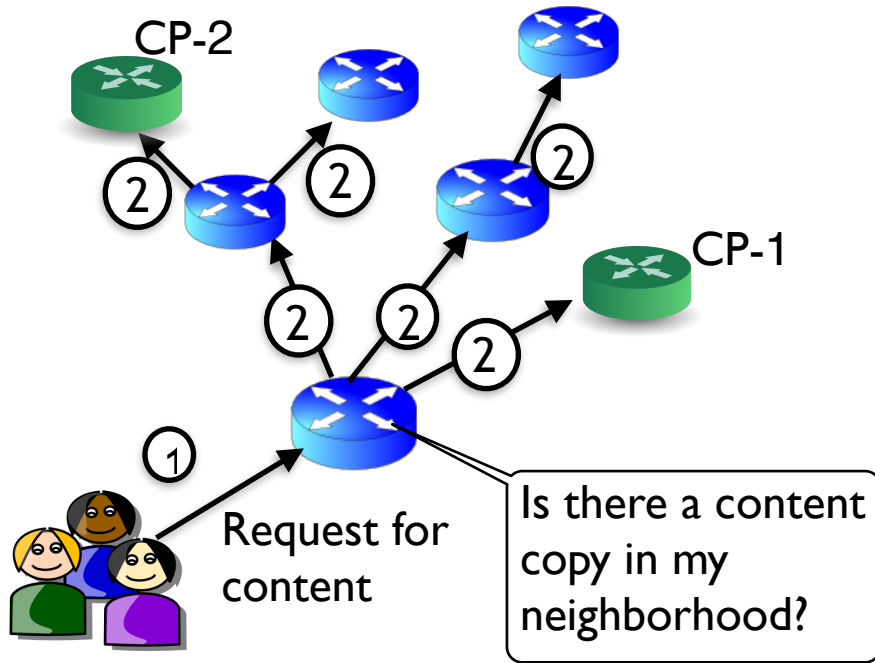


# NRS-based operation in ICN

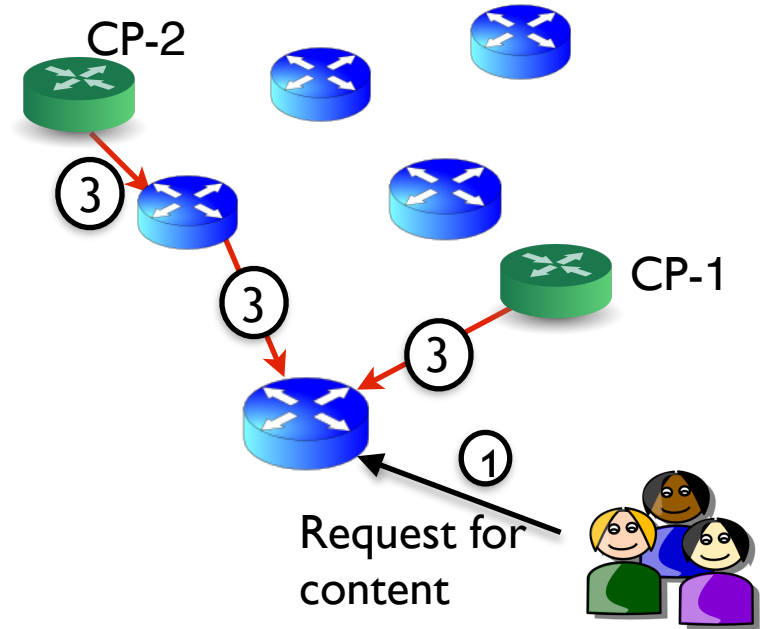




# Operation without an NRS in ICN



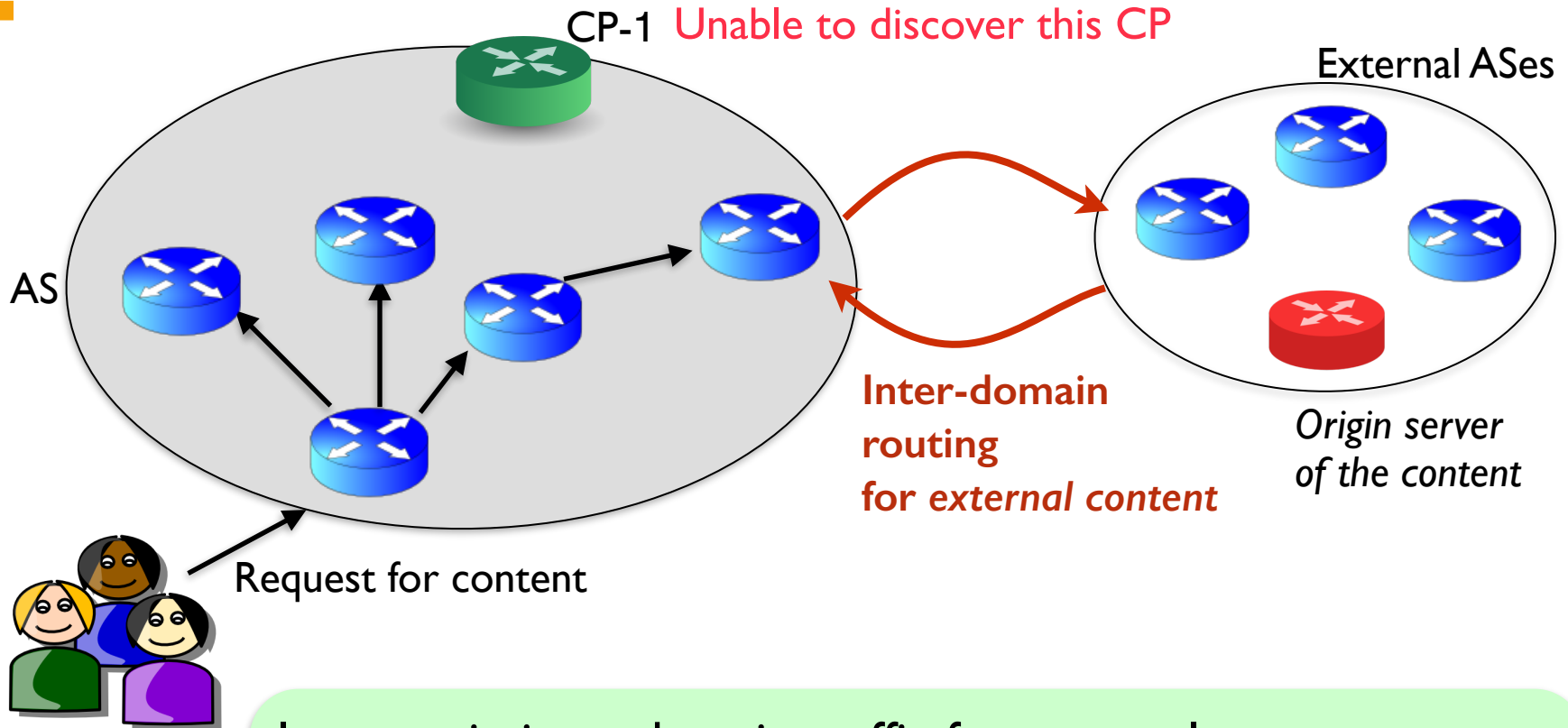
- Content discovery:
  - Search for content in the neighborhood
  - Flooding-based search
  - Time waste if content is NOT in the nw.



- Content retrieval: Redundant transmissions due to multiple content providers in the search scope



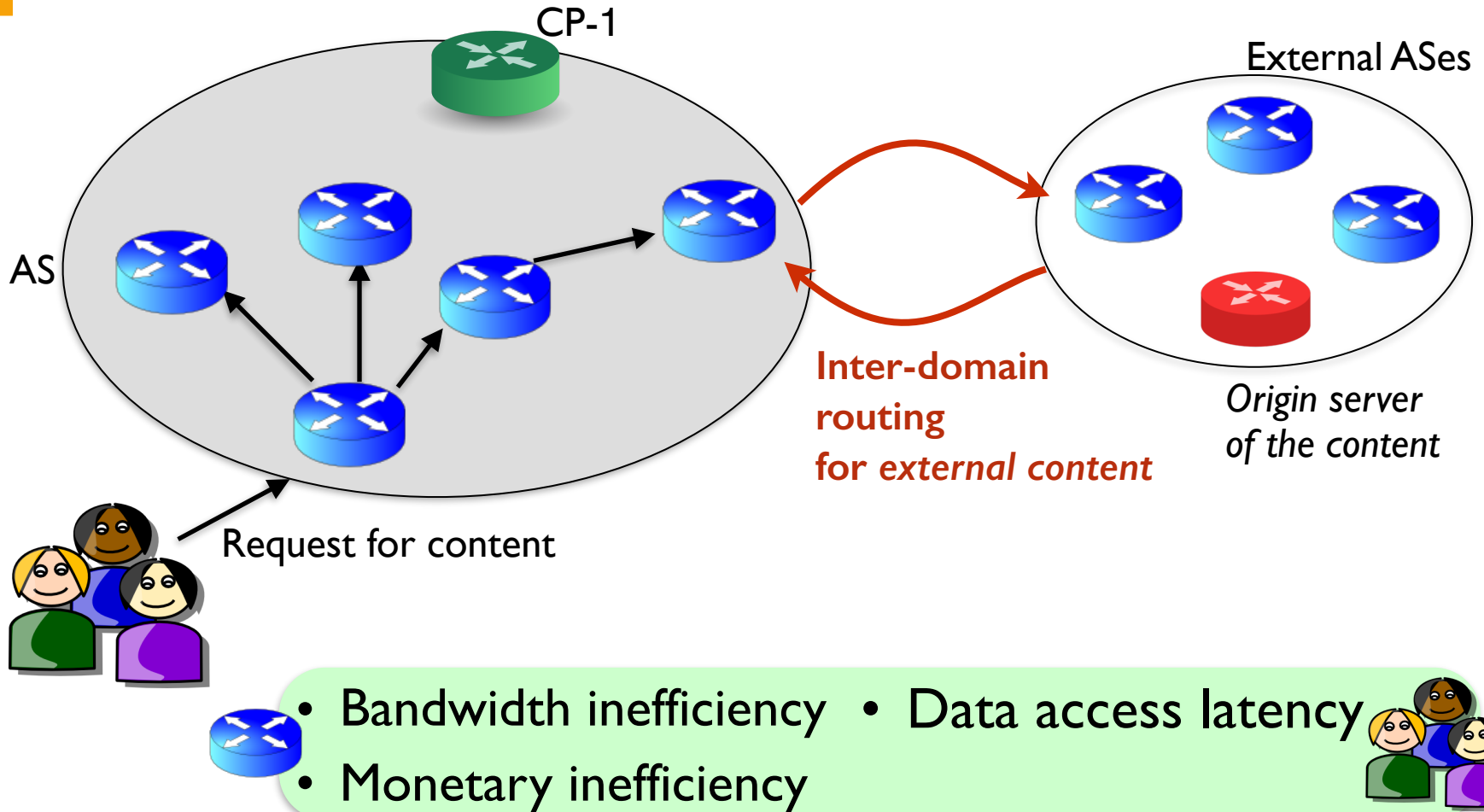
# Operation without an NRS in ICN



Increase in inter-domain traffic for external content:  
monetary inefficiency



# Operation without an NRS in ICN

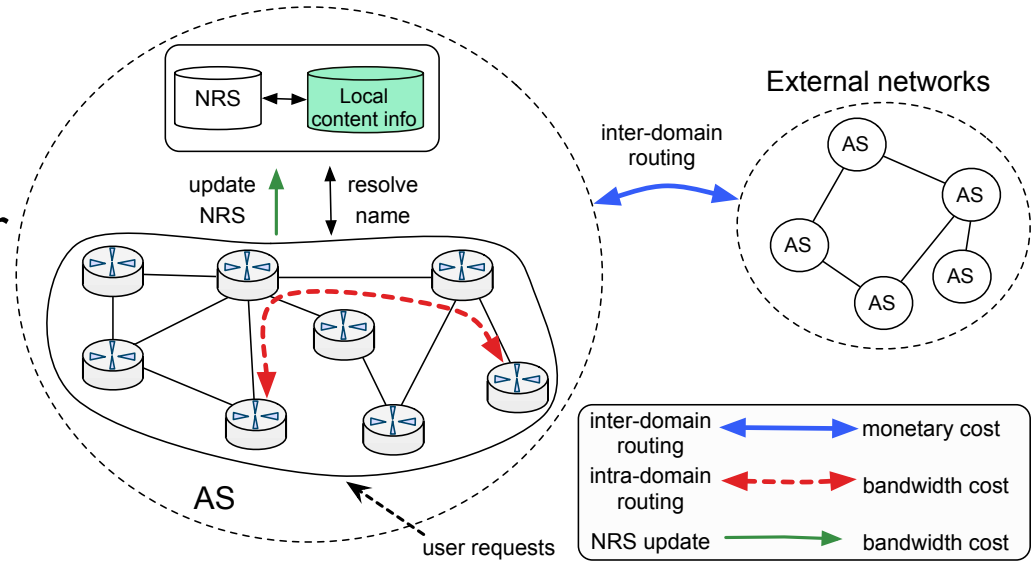






# A closer look from an AS' viewpoint

- **Local content:** origin server in the AS,
- **External content:** origin server outside AS
- To improve scalability:
  - NRS indexes only some fraction( $w$ ) of all content catalogue ( $K$ )
  - Routers update the NRS **not upon every single change in their cache**, but based on calculated rates under certain *false positive* and *negative* probabilities according to rate-distortion theory proposed in Azimdoost et al.



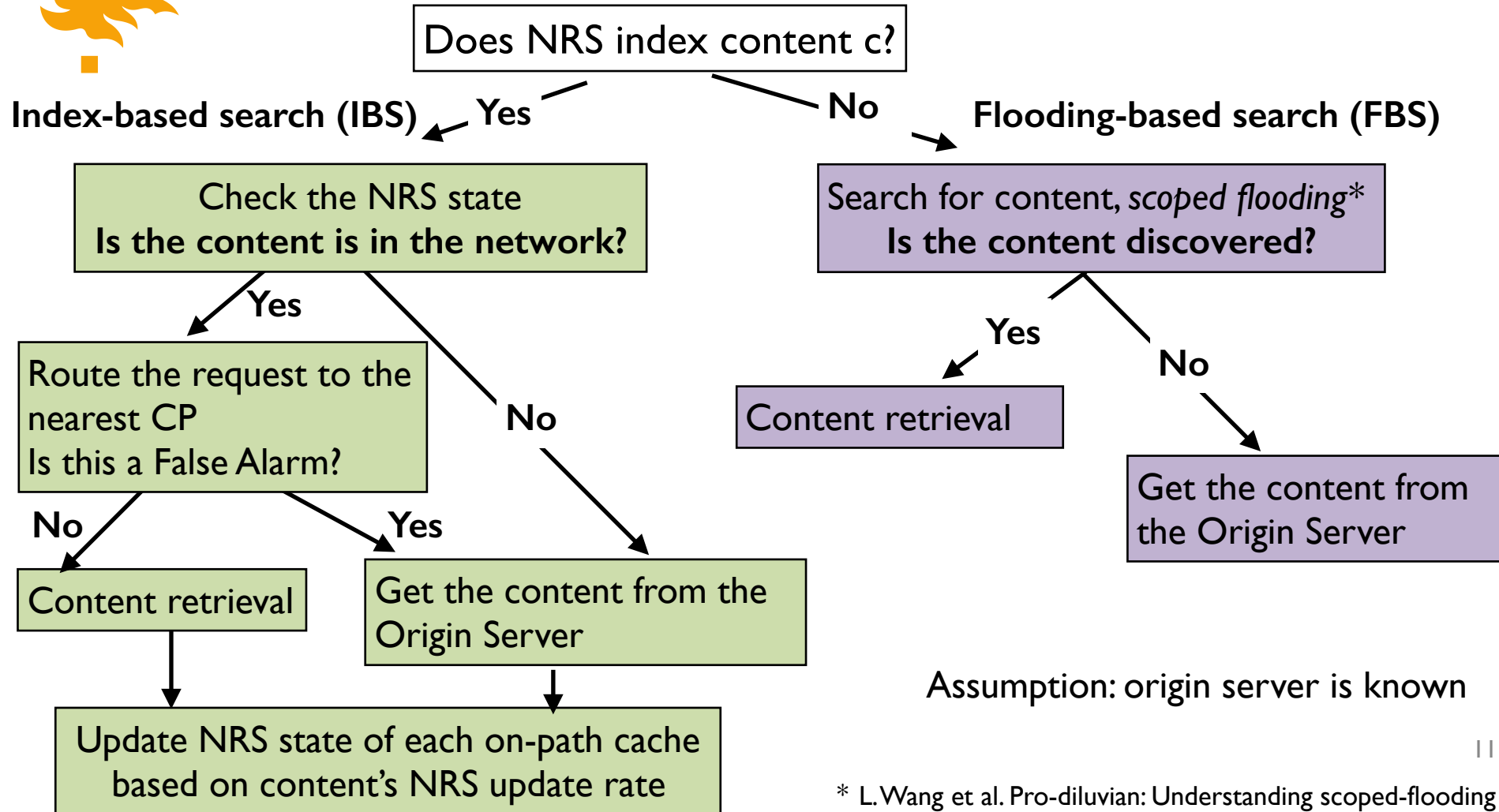


# Which items to index by NRS?

- Calculate the **cost of content delivery** with NRS and without NRS
- **Indexing gain** is the difference between the cost
- Index the ones with the highest indexing gain



# Cost of content delivery: discovery and retrieval



\* L.Wang et al. Pro-diluvian: Understanding scoped-flooding for content discovery in ICN. In ACM ICN, 2015.



# NRS-based content delivery: more formally

System state: <Content state, NRS state>

		NRS state, $S_{NRS}(k)$			Content is retrieved from
		NRS indexes $c_k$		NRS does not index $c_k$	
		0	1	NA	
Content state $S(k)$	0	Fetch from the origin $p_{00}=(1-\alpha_k)(1-P_k)(1-\varepsilon^1)$	IBS, fetch from the origin $p_{01}=(1-\alpha_k)(1-P_k)\varepsilon^1$	FBS, fetch from the origin $p_{0na}=(1-\alpha_k)(1-P_k)$	AS, if local content External AS, if external content
	1	Fetch from the origin $p_{10}=(1-\alpha_k)P_k(1-\varepsilon^0)$	IBS $p_{11}=(1-\alpha_k)P_k\varepsilon^0$	FBS, fetch from the origin $p_{1na}=(1-\alpha_k)P_k$	AS, if discovered or local External AS, if external and not discovered

- Above steps are taken if the content is NOT in the edge cache
- Content is expected to be in the cache with probability  $\alpha$ : Che's approximation



# NRS-based content delivery: more formally

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		0	1	NA	
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False negative      False positive



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Rely on IBS



# NRS-based content delivery: more formally

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Rely on FBS



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## Cost of IBS, FBS, and fetching from the origin server:

# of transmissions of the message x the message size x cost of transmission/bit

- IBS: expected hop distance between the nearest content provider and a randomly selected requesting node
- FBS: # of nodes receiving the message for a certain search scope (2 or 3 hops)
- Origin server:
  - expected hop distance between a randomly-selected router and a content provider
  - inter-AS routing cost





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## Cost for discovery, retrieval and NRS update

$$\text{Content discovery cost: } \phi_k = \begin{cases} l^{req}(\alpha_k \phi^c + (p_{11} + p_{01})\phi_k^{\text{IBS}} + (1 - p_{11})\phi^{\text{ori}}), & \text{if } x_k = 1 \\ l^{req}(\alpha_k \phi^c + \phi^{\text{FBS}} + (p_{0na} + p_{1na}(1 - \gamma_k^{\text{FBS}}))\phi^{\text{ori}}), & \text{if } x_k = 0 \end{cases} \quad (2)$$

$$\text{Content retrieval cost: } \beta_k = \begin{cases} s_k(\alpha_k \phi^c + p_{11}\phi_k^{\text{IBS}} + (1 - p_{11})\phi^{\text{ori}}), & \text{if } x_k = 1 \\ s_k(\alpha_k \phi^c + p_{1na}\gamma_k^{\text{FBS}}n_k\phi_k^{\text{IBS}} + (p_{0na} + p_{1na}(1 - \gamma_k^{\text{FBS}}))\phi^{\text{ori}}), & \text{if } x_k = 0 \end{cases} \quad (4)$$

$$\text{NRS update cost: } \psi_k = \begin{cases} R_k(\varepsilon^1, \varepsilon^0)l^{\mu p}\phi^{\text{up}}, & \text{where } l^{\mu p} = \log K_\omega + \log N + 1, \text{ if } x_k = 1 \\ 0, & \text{if } x_k = 0 \end{cases} \quad (6)$$

$$(7)$$



# NRS-based content delivery: more formally

NRS indexes content k

NRS does not index

$$\text{Content discovery cost: } \phi_k = \begin{cases} l^{req}(\alpha_k \phi^c + (p_{11} + p_{01})\phi_k^{\text{IBS}} + (1 - p_{11})\phi^{\text{ori}}), & \text{if } x_k = 1 \\ l^{req}(\alpha_k \phi^c + \phi^{\text{FBS}} + (p_{0na} + p_{1na}(1 - \gamma_k^{\text{FBS}}))\phi^{\text{ori}}), & \text{if } x_k = 0 \end{cases} \quad (2)$$

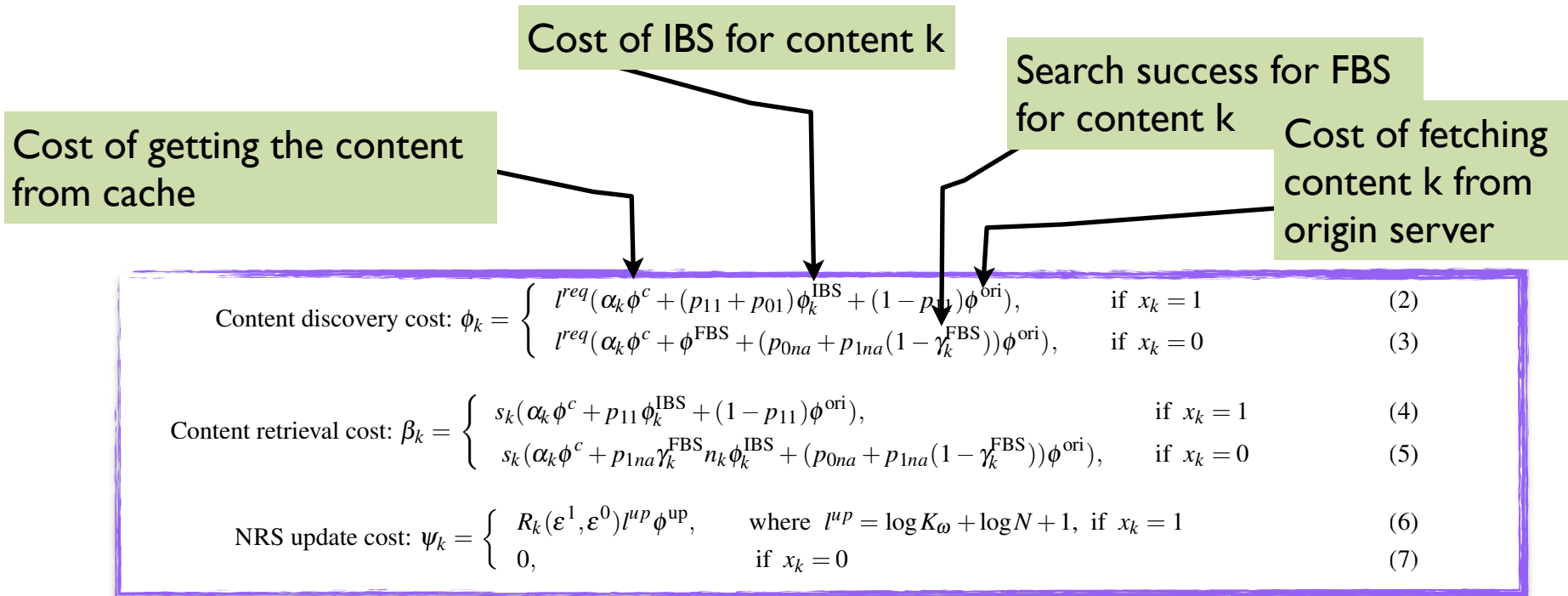
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# NRS-based content delivery: more formally





# NRS-based content delivery: more formally

$$n_k = 1 + \rho(N^{\text{FBS}} \alpha_k)$$

$n_k$ : overhead factor

$$\rho \in [0, 1]$$

FBS redundancy coefficient

$$\text{Content discovery cost: } \phi_k = \begin{cases} l^{\text{req}}(\alpha_k \phi^c + (p_{11} + p_{01})\phi_k^{\text{IBS}} + (1 - p_{11})\phi^{\text{ori}}), & \text{if } x_k = 1 \\ l^{\text{req}}(\alpha_k \phi^c + \phi^{\text{FBS}} + (p_{0na} + p_{1na}(1 - \gamma_k^{\text{FBS}}))\phi^{\text{ori}}), & \text{if } x_k = 0 \end{cases} \quad (2)$$

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$$\quad (7)$$

Rate of update for meeting certain false positive and negative rates  
Azimdoost et al.

$l^{up}$ : NRS update message (payload) size



# Indexing for minimum content delivery cost

Utility for item  $k$  (cost of delivery)

$$\begin{aligned} U_k &= q_k(\phi_k + \beta_k) + \psi_k \\ \phi_k &= l^{req}(\alpha_k \phi^c + (p_{11} + p_{01})\phi_k^{IBS}) + x_k((1 - p_{11})\phi^{ori}) \\ &\quad + (1 - x_k)(\phi^{FBS} + (p_{0na} + p_{1na}(1 - \gamma_k^{FBS}))\phi^{ori}) \\ \beta_k &= \alpha_k s_k \phi^c + s_k(p_{11}\phi_k^{IBS} + (x_k((1 - p_{11})\phi^{ori}) \\ &\quad + (1 - x_k)(p_{1na}\gamma_k^{FBS} n_k \phi_k^{IBS}) + (p_{0na} + p_{1na}(1 - \gamma_k^{FBS}))\phi^{ori})) \\ \psi_k &= x_k R_k(\varepsilon^1, \varepsilon^0) l^{up} \phi^{up} \end{aligned}$$

Optimization problem

$$\begin{aligned} \min \quad & \sum_{k=1}^K U_k \\ \text{s.t.} \quad & \sum_{k=1}^K x_k \leq K_{\omega}. \end{aligned}$$

Indexing gain for item  $k$

$$\Delta U_k = U_k(x_k = 0) - U_k(x_k = 1)$$

Select the first  $K_{\omega}$  items



# Performance analysis

- Which items to index?
- How much can we benefit with increasing NRS size?
- How is ICN performance affected?
  - cache hits
  - inter-domain traffic
  - data access latency



# Setting

- ICARUS simulator, available at <https://icarus-sim.github.io/>
- Realistic AS topologies from Rocketful project (N: # routers 79-315 nodes)
- Content
  - Local content: 30% of the requested contents (K: # content)
  - Popularity: Zipf with parameter 0.8
  - Size: 1 Mb chunks
  - Categories: *hot (0.1%), popular(1%), occasional(10%), far tail* as in K. Mokhtarian et al.
- Network's cache capacity
  - small cache:  $10^{-2}$  K/N
  - large cache  $10^{-1}$  K/N
- NRS updates: 0.01 false alarm, 0.01 false negative

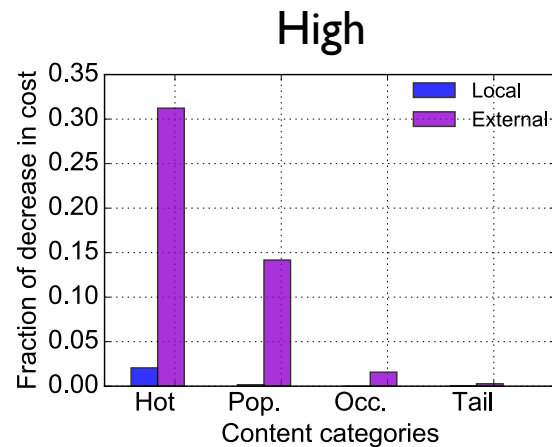
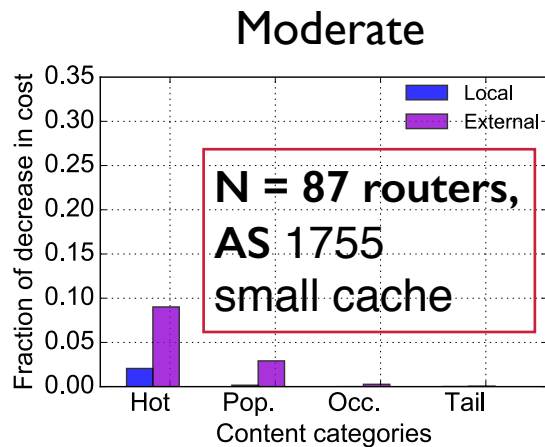
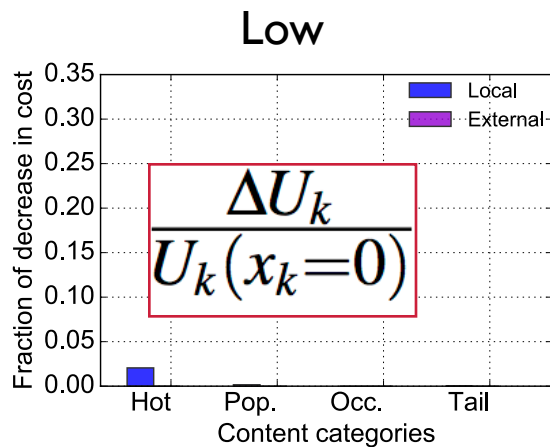
- Impact of inter-AS traffic cost
- Impact of NRS <sup>z</sup> size





# Impact of inter-AS traffic cost: fraction of *decrease in cost*

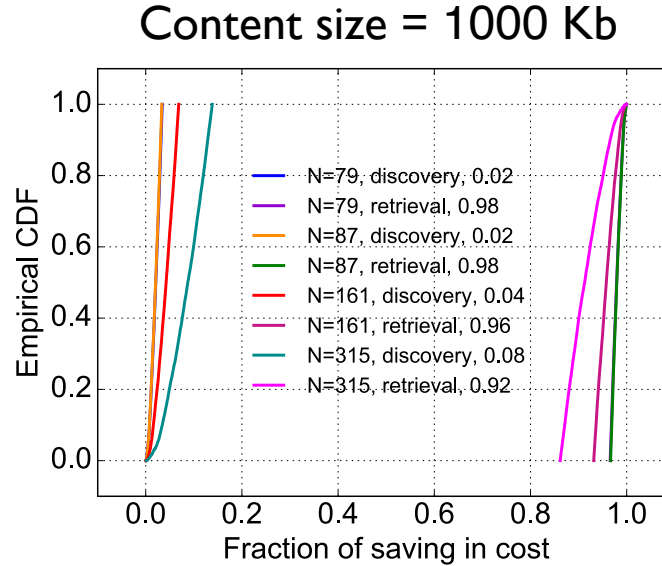
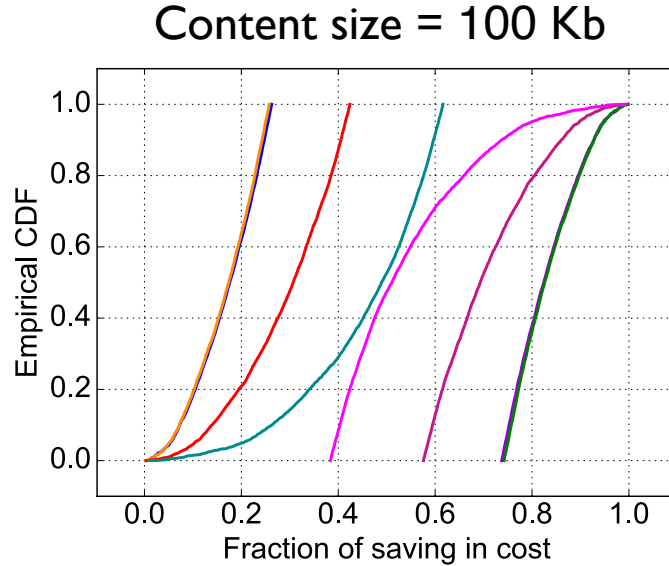
- Let's assume all routers are synchronized, i.e. no duplicate responses
- *Low* (3x), *moderate*(5x), *high* (10x) inter-AS cost compared to intra-AS tx cost



- Higher decrease in cost for more popular content,
- Higher decrease in cost for external content under high inter-AS cost



# Fraction of savings in discovery and retrieval



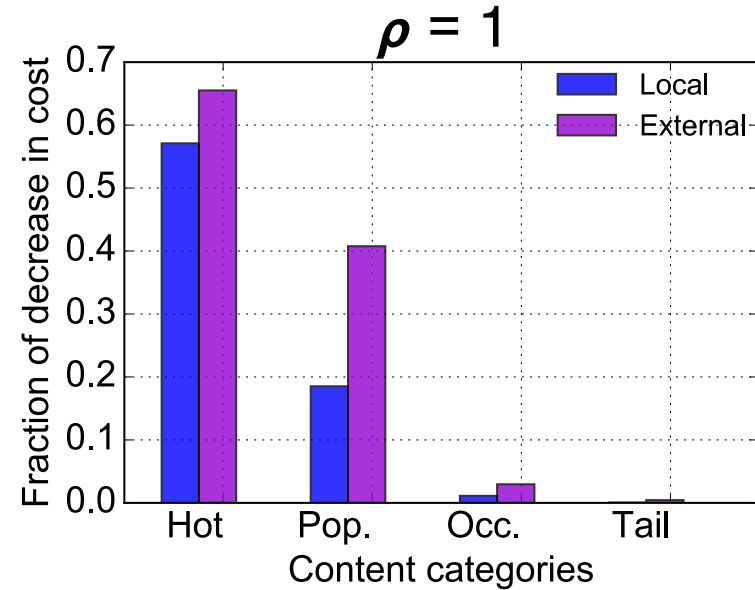
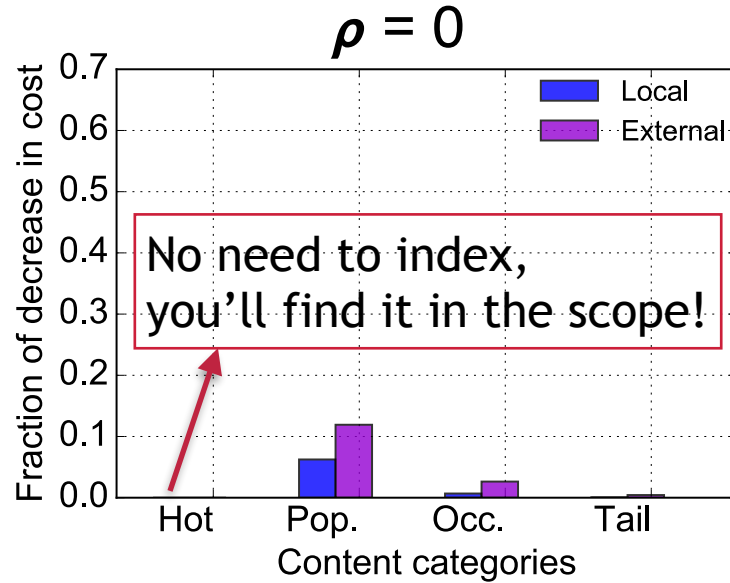
Fraction of saving due to discovery and retrieval :

- comparable for small content size
- retrieval cost dominates for larger content size

More savings for tightly-connected topologies for content discovery as costly FBS is skipped



# What if FBS redundancy coefficient $\rho$ is higher?



Under *large cache regime*, bandwidth inefficiency due to multiple content transmissions becomes significant, **so does the importance of NRS** (up to 65% savings for external, and 55% for local content)!



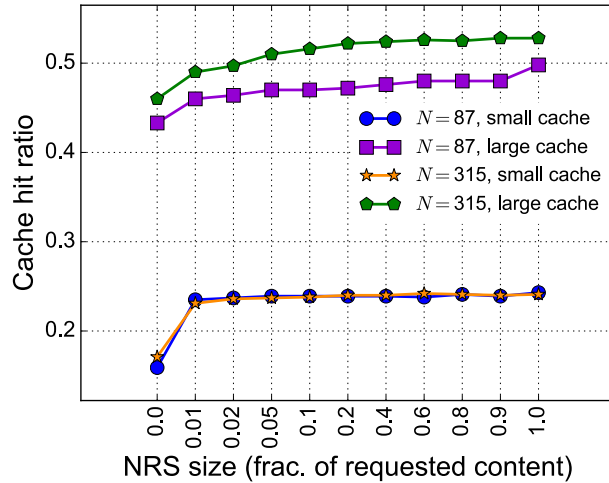
# Impact of NRS size

- Content catalogue size:  $4 \times 10^4$
- Requests:  $5 \times 10^5$  (warmup period:  $10^5$  requests)

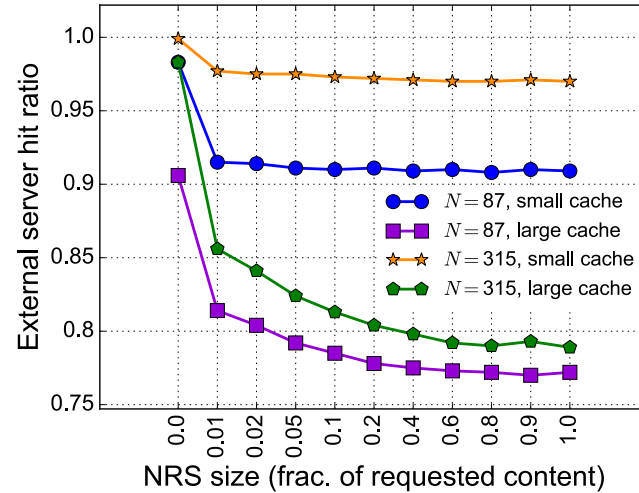


# Impact of NRS size

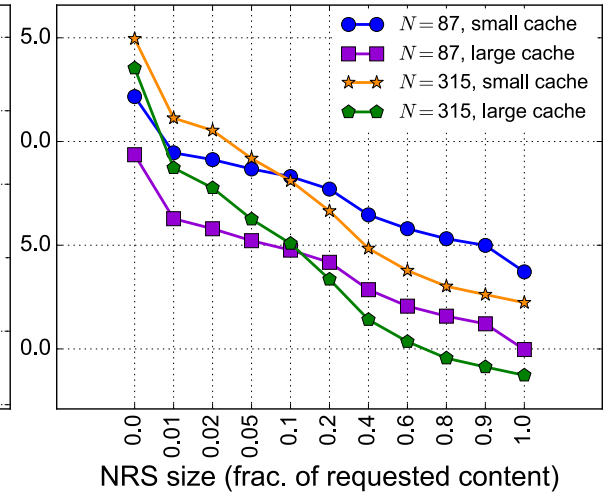
## Cache hit



## Inter-AS traffic



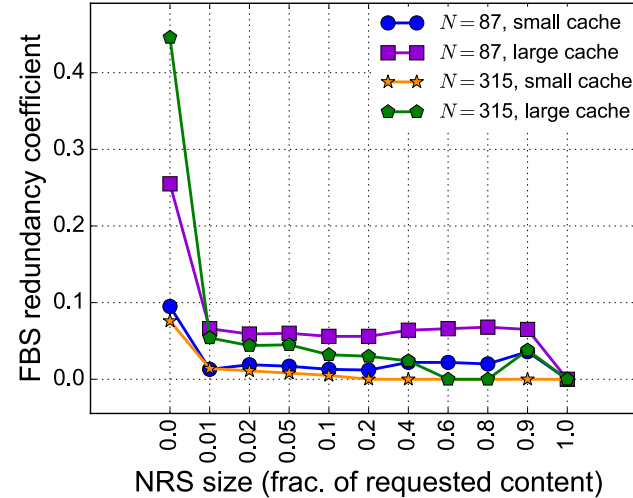
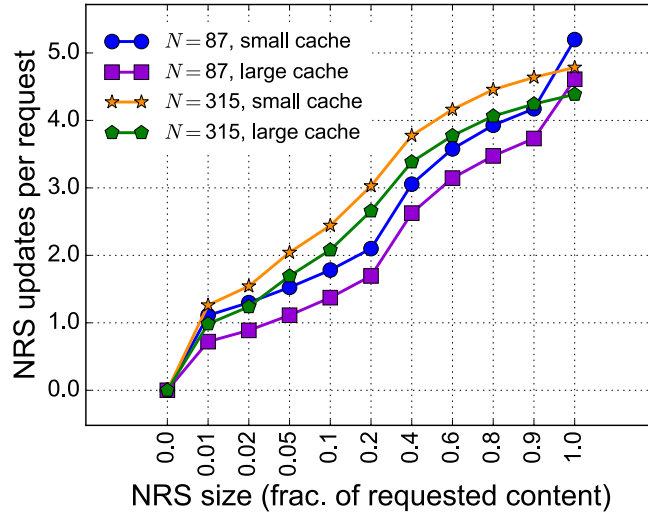
## Data access latency



- For small cache, with 1% indexing, cache hit increases from 16-17% to 23%, only marginal increase from 23-24% afterwards
- For larger cache, highest increase in cache hits at 1%, but further increases after 1%
- Highest decrease in inter-domain traffic for the first 1% (intra-AS traffic marginal change)
- Data access latency gets shorter with increasing NRS size due to saving in content discovery time based on FBS



# NRS updates and duplicate coefficient



- NRS update cost smaller than average path length due to tolerance to false negatives and positives
- FBS redundancy is about 10% for small cache regime and about 25-45% for larger caches



# To sum up

- We proposed a **hybrid name resolution** scheme
  - index the content whose delivery cost decreases the most with NRS,
  - apply content search for other unindexed content
- We determined which items to index based on the calculated cost of content discovery, retrieval, and NRS updates
  - The most significant improvement achieved by **only indexing slight fraction** of content catalogue (~1% for small caches)
  - External content, most popular content
- Future work:
  - Real Internet topology
  - Resolution across AS hierarchy
  - Content discovery can be less aggressive than flooding



# Thank you!

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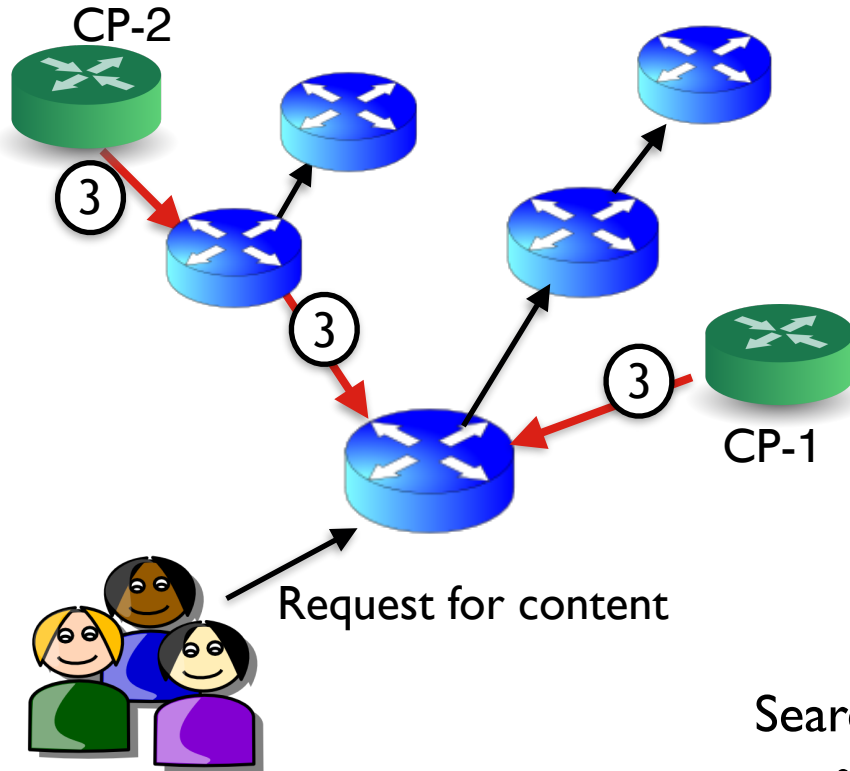


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# Operation without an NRS in ICN



Search for content in the neighborhood

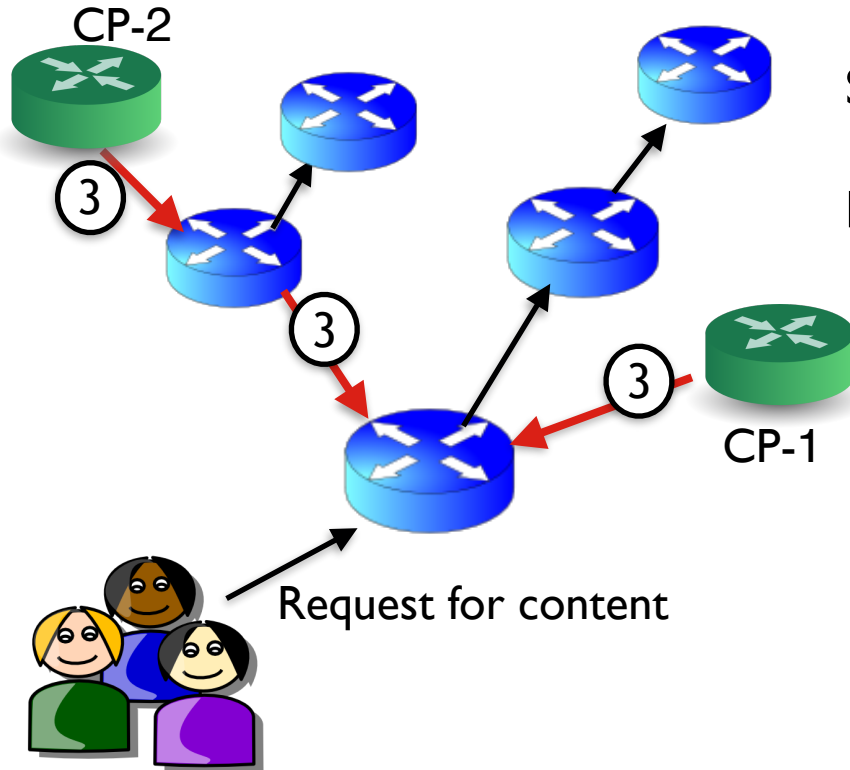
- inefficiency in content discovery

Multiple content providers routing content

- inefficiency in content retrieval



# Operation without an NRS in ICN



Search for content in the neighborhood

- inefficiency in content discovery

Multiple content providers routing content

- inefficiency in content retrieval

**Bandwidth inefficiency**



# Indexing for minimum content delivery cost

Decision variable:

- index content  $k$  or not,  $x_k$

Objective:

- minimize the expected cost of content delivery over all requests from within this AS

Constraints:

- subject to total number of items to be indexed  $K_w$