

#### **Optimal Cache Allocation for Content-Centric Networking**

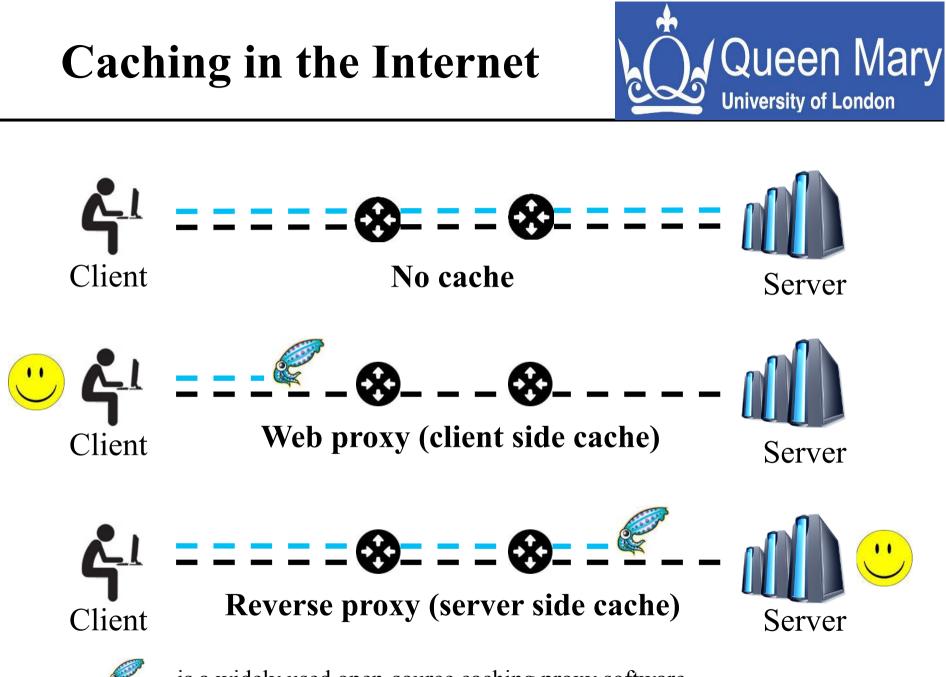
Yonggong Wang, Zhenyu Li, Gaogang Xie Chinese Academy of Sciences

> Gareth Tyson, Steve Uhlig QMUL

Yonggong Wang, Zhenyu Li, Gareth Tyson, Steve Uhlig, Gaogang Xie. *Optimal cache allocation for Content-Centric Networking.* Proc. of IEEE ICNP, 2013.



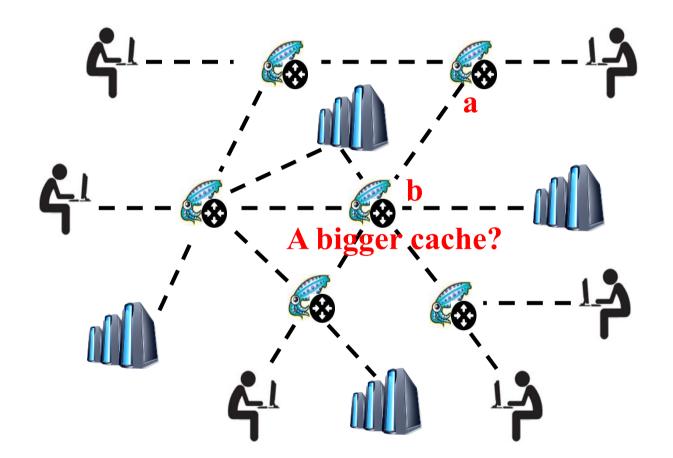
- Background
- Optimal cache allocation
- Evaluation
- Conclusion



is a widely used open-source caching proxy software







**Cache everything everywhere** 



Q: Where should we allocate the cache space? Core, edge, or both?

- A1: More cache in the "Core" Cache space should be proportional to the centrality metric, e.g., the degree of node. (INFOCOM NOMEN 2012)
- A2: More cache at the "Edge" Keeping more cache at the "edge" is more efficient than at the "core". (SIGCOMM ICN 2012)
- A3: Cache at the "Edge" is good enough The benefit of caching at "Both" is very limited: < 10%. (SIGCOMM 2013)

## Aims of this work



- Find the optimal cache allocation in a given topology assuming a given content popularity distribution and pre-fetching
- 2. Explore the factors that impact the optimal cache allocation and the corresponding caching performance

Approach: Black-box ~ use optimization to guess which strategy fits which situation

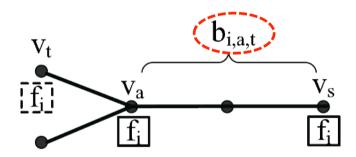


- Background
- Optimal cache allocation
- Evaluation
- Conclusion

## **Benefit of caching**



- CCN network: G=(V, E)
- Every content  $f_i$  is originated at a single server node
- Benefit of caching:



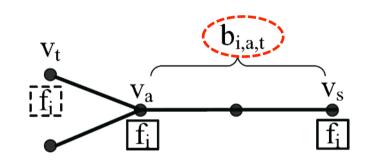
- $v_t$  and  $v_s$  denote the client and server of content  $f_i$
- Without caching, traffic flow for  $v_t$  to get  $f_i = 3$  (hops)
- If  $f_i$  cached at  $v_a$ , traffic flow = 1.
- Benefit of caching  $f_i$  at  $v_a$  for  $v_t = 2$ , i.e.,  $b_{i,a,t} = 2$

## **Optimal content placement**



- Probability  $p_i$  of the content  $f_i$  to be requested
- Bounded total cache space c<sub>total</sub>

Maximize:



Optimal Subject to: content placement



$$\sum_{f_i \in F} p_i = 1 \tag{2}$$

$$x_{i,a} = \{0,1\}, \forall f_i \in F, v_a \in V$$
 (3)

$$\sum_{f_i \in F} \sum_{v_a \in V} x_{i,a} \le c_{total} \tag{4}$$

Steve Uhlig 9

## **Knapsack formulation**



If  $p_i$  is known, the objective function can be rewritten into the following Knapsack problem:

$$max(\sum_{f_i \in F} \sum_{v_t, v_a \in V} p_i \cdot x_{i,a} \cdot b_{i,a,t})$$
(5)  
$$= max(\sum_{f_i \in F} p_i \sum_{v_t, v_a \in V} x_{i,a} \cdot b_{i,a,t})$$
(6)  
$$= max(\sum_{f_i \in F} p_i \cdot b_i^{c_i})$$
(7)  
Knapsack problem!

where  $b_i^{ci}$  is the benefit of allocating  $c_i$  cache entries for content  $f_i$  across the whole network.

• Assuming unique origin for  $f_i$ , solve the cache location problem in the SPT rooted at the origin server of  $f_i$ 

## Methodology



Input: topology, content popularity, content server

Steps:

1. Compute the benefit of cache placement on the SPT rooted at each server

2. Resolve the final objective function as a knapsack problem

<u>Output:</u> a N x N binary matrix, X, describing the optimal content placement

N: #content chunks; n: #CCN routers

• Solution: Optimal cache allocation can be obtained by summing the columns of X.



- Background
- Optimal cache allocation
- Evaluation
- Conclusion

## **Evaluation setup**

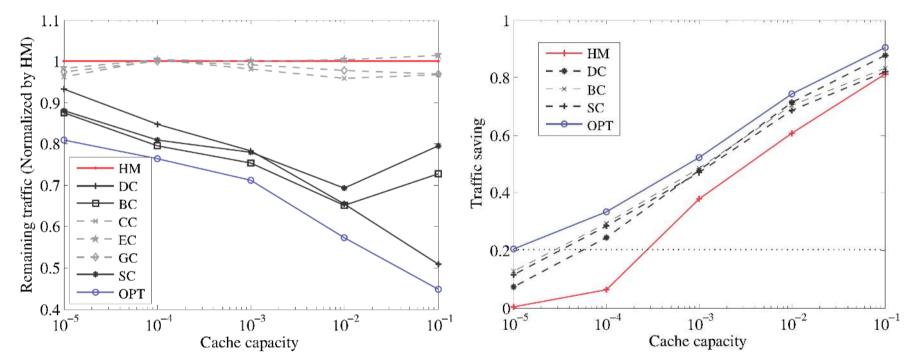


- **Simulation tool**: custom-made lightweight discrete event based simulator designed to scale to 1000s nodes
- **Topology**: Barabási-Albert (BA) & Watts-Strogatz (WS)
- Content popularity: Zipf
- Cache placements: Pre-fetching (OPT) vs. LFU
- Cache capacity: c<sub>total</sub> expressed as fraction of nN
- Default parameters:
  - #Routers (N): 1000
  - #Servers: 100 (randomly chosen across network)
  - #Content (n): 10k equal-sized objects (randomly distributed across servers)
  - C<sub>total</sub>: 1%

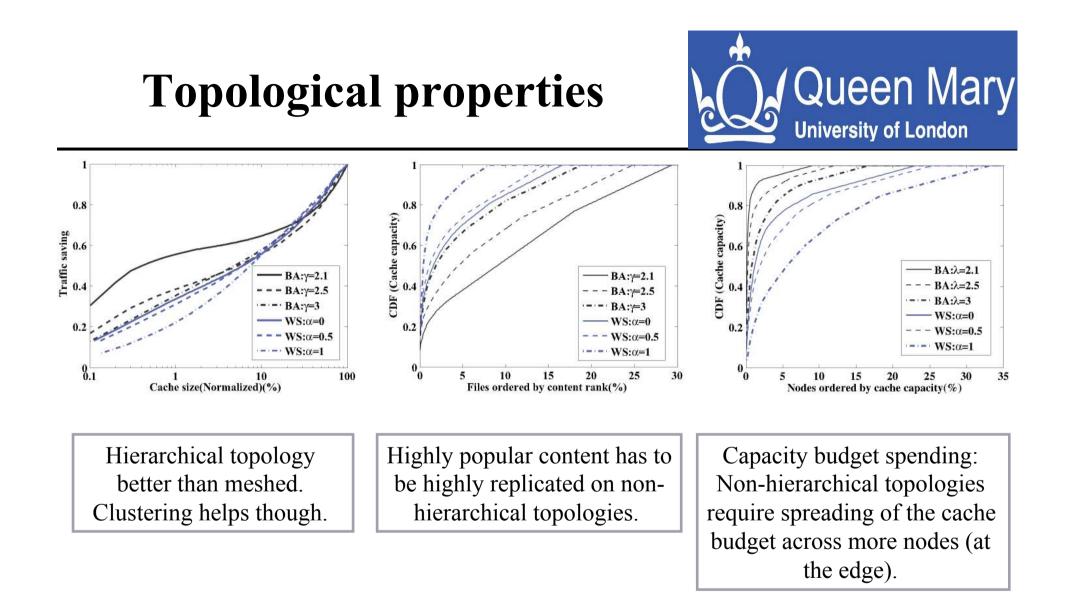
#### **Traffic savings**



HM: homogenous allocation; OPT: optimal cache allocation; DC: Degree Centrality; BC: Betweenness Centrality; CC: Closeness Centrality; EC: Eccentricity Centrality; GC: Graph Centrality; SC: Stress Centrality.

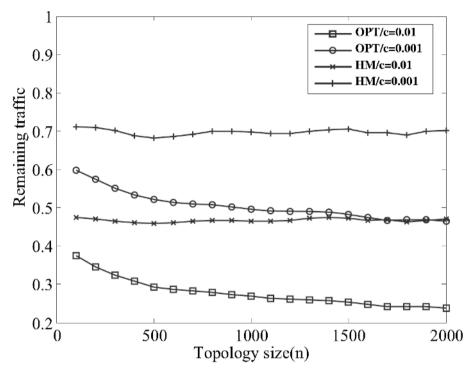


Cache allocation strategy matters, especially when the total cache budget is small.



**Topology structure fundamentally affects the appropriate caching strategy.** 



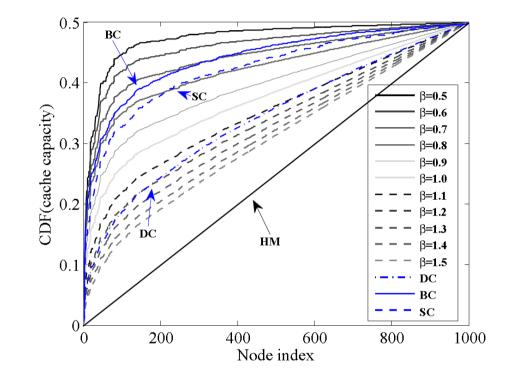


Traffic saving of homogeneous allocation does not depend on network size.

**Optimal allocation benefits from "economies of scale", by exploiting the topology structure.** 

# Content popularity distribution



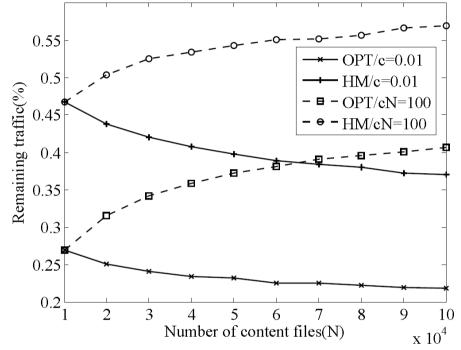


Uniform content popularity distribution leads to cache capacity allocated to a few central nodes.

Depending on the skew in the content popularity, centrality-heuristics may be appropriate in allocating the cache capacity.

#### Number of content objects



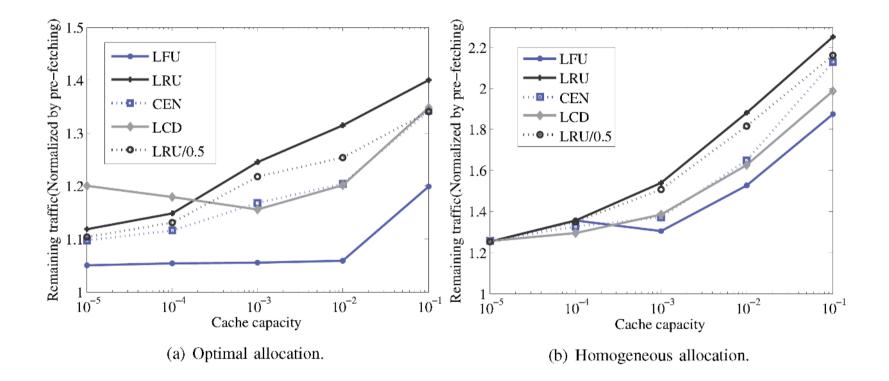


If cache budget increases proportionately with content objects (c = fixed percentage), traffic savings improve, irrespective of the content placement strategy.

If total cache budget is constant while number of objects increase, caching degrades.

Finding the sweet spot: if number of objects increase, cache budget has to increase, but less than linearly to keep traffic saving constant.





Compared to pre-fetching, cache replacement policies perform worse as cache capacity increases.

As expected, LFU performs better than other cache replacement policies.



- Background
- Optimal cache allocation
- Evaluation
- Conclusion

#### Conclusion



- **Q:** What is the right cache allocation strategy for my network?
- A: It depends, but has to be smart enough depending on your specific context.
- BA-like topologies (i.e., interdomain): cache in the core.
- WS-like topologies (i.e., ISP): cache at the edge.
- Larger network requires smart caching strategy.
- More content to be cached => cache placement strategy matters more.
- Uniform popularity => caching in the core
- Heterogeneous popularity => spread caches across network
- LFU fine for small cache budget
- Large cache => smarter cache strategy (e.g., OPT)



### ICN: pain or gain? a data-driven perspective

Yi Sun, Wei Wang, Yang Guo, Bo Deng (CAS), Steve Uhlig (QMUL), Mohamed-Ali Kaafar (INRIA), Alexander Afanasyev (UCLA), Yun Jin (PPLive), Haiyong Xie (USTC)



- Dataset & methodology
- NDN background
- Evaluation
- Conclusion

## Dataset (1)



## Topology:

- Traceroute-enabled PPTV clients
- Collected traceroutes over 2 month (10/11 2012) performed from clients (full-mesh)
- 26GB of data, from 1.68 million users
- Sampling: 80k routers, 82 ISPs and 559 cities in China
- Inferred "link latencies" from traceroutes
- Alias resolution for router-level topology

## Dataset (2)



#### Demand:

- 2-week long logs from PPTV servers
- 4.5M users
- 270K content objects
- 26M viewing records



- Simulator: ns-3 ndnSIM
- Build router-level topology between clients based on the traceroutes:
  - Use link delays
  - Link bandwidth set to 622Mbps
- Content originators: 224 PPTV CDN servers that can serve any content
- Compare to pure CDN-based content delivery
- Cache sizes: 1GB, 10GB, 100GB and 1TB
- Cache replacement policies: LRU, LFU and FIFO



- Dataset & methodology
- NDN background
- Evaluation
- Conclusion

### NDN background

Content Provider

Application

NDN

CS

PIT

FIB

(3)

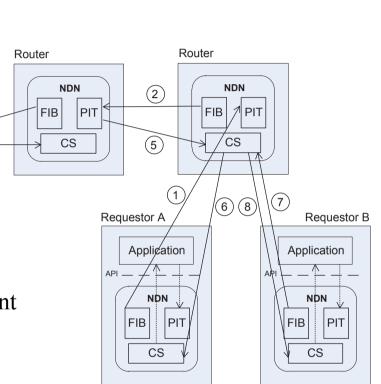
(4)



**Content Store (CS)**: cache the named data packets according to a specific policy (e.g., LRU, LFU, FIFO)

**Pending Information Table (PIT)**: keeps track of the pending forwarded Interest packets, enabling the aggregation of requests, so that returned data can be sent downstream to multiple request origins.

**Forwarding Information Base (FIB)**: used to forward Interest packets towards potential providers of the content.



### Assumptions



NDN-related:

- Every router has a CS
- Object is broken down into packets, each cached and transmitted separately
- Object is cached along the path between any CS storing it and origin CDN server
  Non-NDN:
- All caches have the same size
- Every CDN server stores ALL content
- Closest CDN server is the origin of a given request

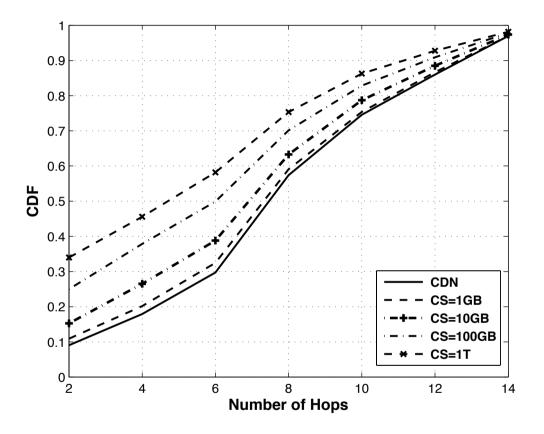


- Dataset & methodology
- NDN background
- Evaluation
- Conclusion



- Hops of transmission path: distance between clients and CS hit
- Hops saved compared to CDN: difference in hop count between cache and origin CDN server
- **Traffic reduction**: fraction of traffic saved from hop reduction of transmission path
- **Hit rate**: location where hits take place in distance from the CDN server

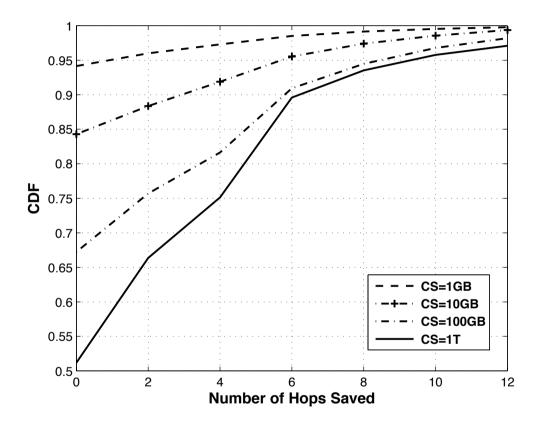




## Larger cache size provides diminishing returns in transmission path length.

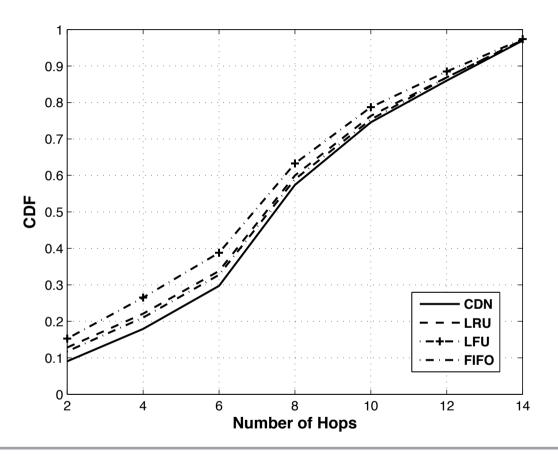
#### Cache size: hops saved





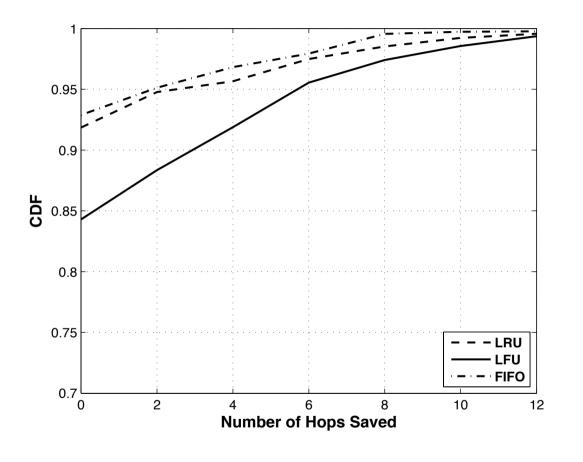
Only large caches provide significant hop savings compared to CDN.

#### Cache policy: transmission path Queen Mary



## Limited impact of cache replacement policy on transmission path length, compared to CDN.

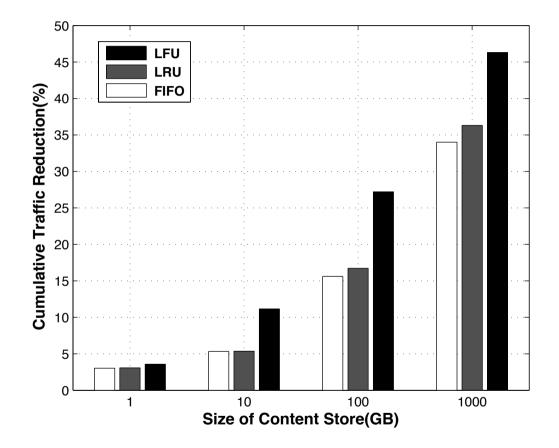




#### LFU provides best hop savings.

#### **Traffic reduction**

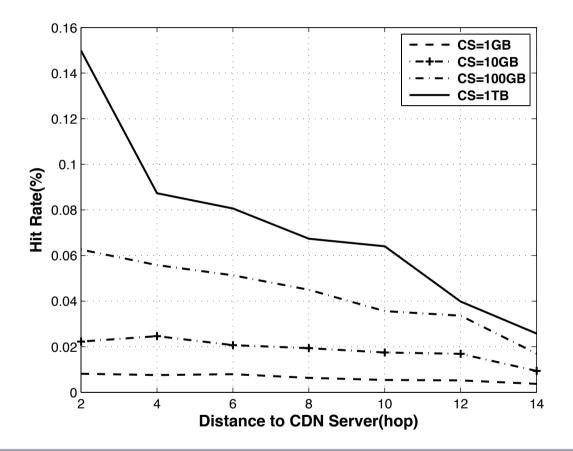




Significant traffic reduction requires large enough caches.



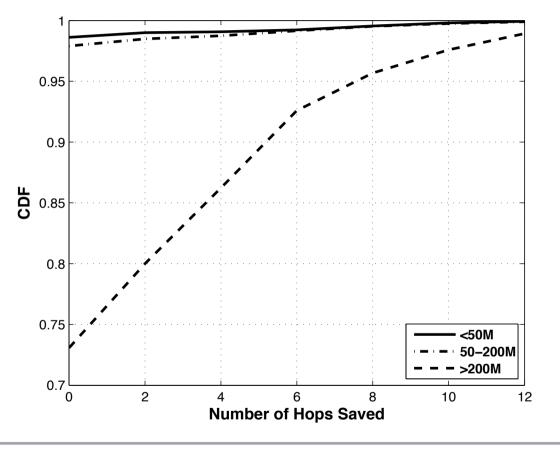




## Hit rate of large caches take place close to content origin.



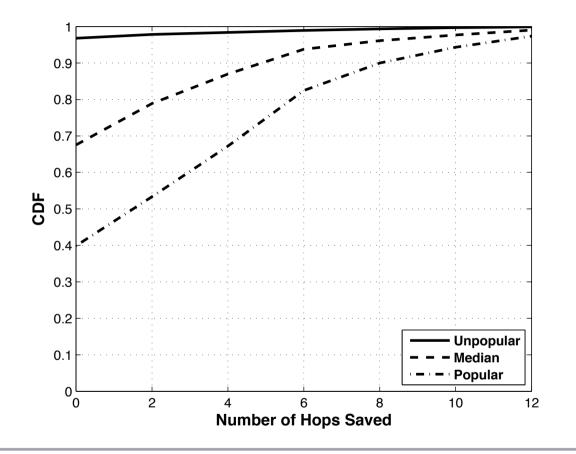




## Only large files bring significant transmission path savings.

## **Content popularity**





More popular content see larger transmission path savings.

## ICN and QoS



- Throughput: ICN 5 to 20% higher than CDN
- Avg transmission delay: ICN up to 25% lower than CDN
- Packet loss: ICN up to 30% lower than CDN
- Jitter: ICN up to twice larger than CDN



- Dataset & methodology
- NDN background
- Evaluation
- Conclusion

## ICN: pain or gain?



- Strengths
  - Shorter transmission path (1.5 hop on avg)
  - Traffic saving (27% with 10GB cache and LFU)
  - Improved QoS
- Unclear
  - Recovery cost: 50 days for 1GB caches, 3.5 years for 100GB
- Weaknesses
  - Limited gain with small caches
  - Not worth caching small/unpopular/unskewed content
  - Jitter

=> Compared to a CDN, ICN may or may not look promising. However, very popular content is likely to benefit from it, as well as content that requires QoS.