# Design and Analysis of a Content-Oriented Internet

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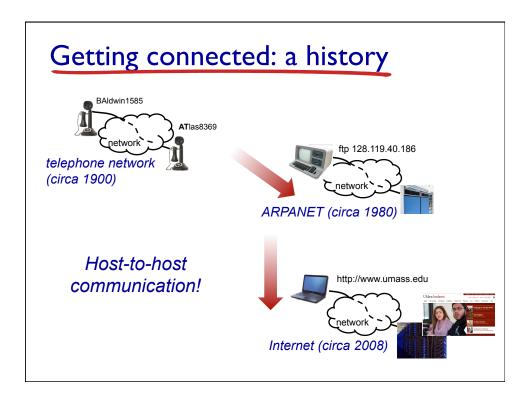
Distinguished Faculty Lecture, April 2014

#### Overview

- introduction: "getting connected"
- Internet 101
- content-oriented networks:
  - "over the top" approaches
  - network-based approaches
- wrap-up

#### Goals:

- learn something about networking
- appreciate research challenges in content networking
  - learn about research here at UMass



#### The Internet in 2014

- content is king!
  - video: 64% of all global consumer Internet traffic in 2012
  - TV, VOD, P2P: 80-90 % global consumer traffic by 2017
- what not where



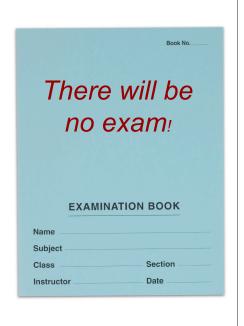
Challenge: can a network architecture designed for wired, host-host communication meet demands of today's (and tomorrow's) content-oriented mobile Internet?

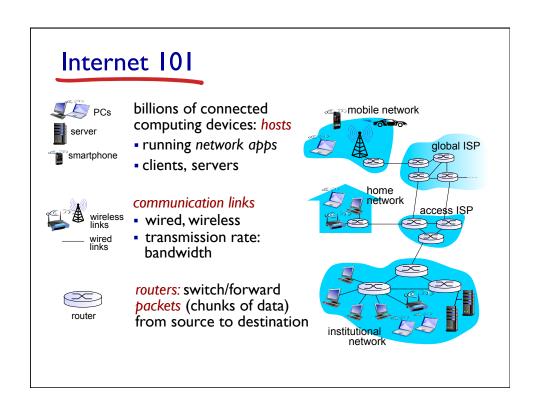
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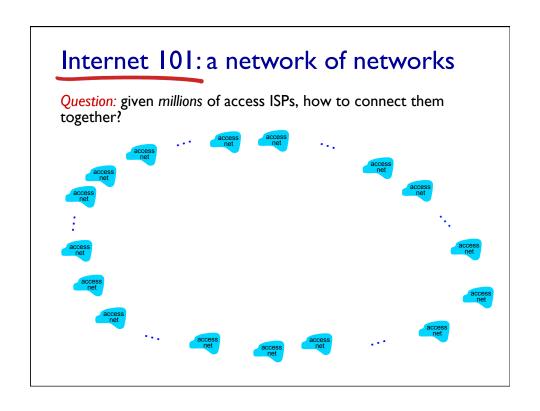
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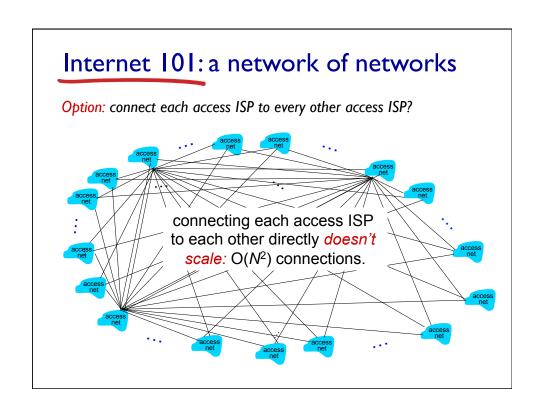
#### Internet 101

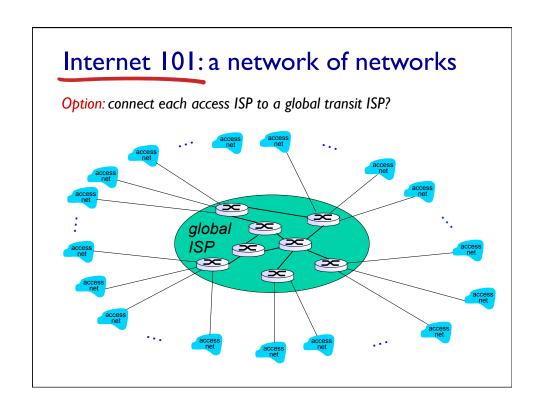
- hosts: clients, servers
- packets, routers
- Internet: a network of networks
- protocols

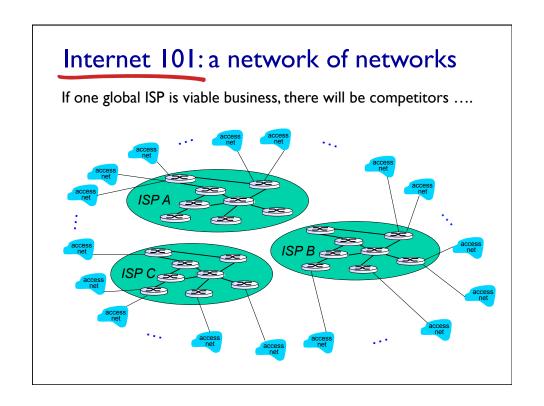


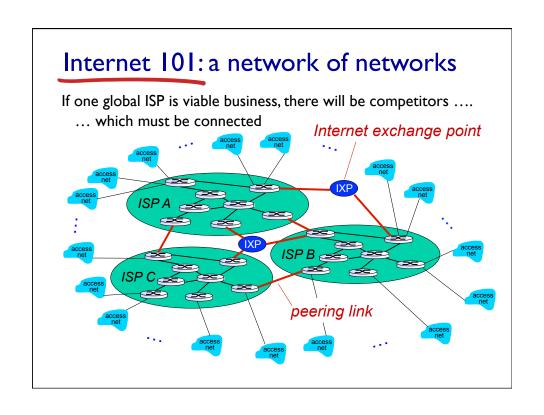


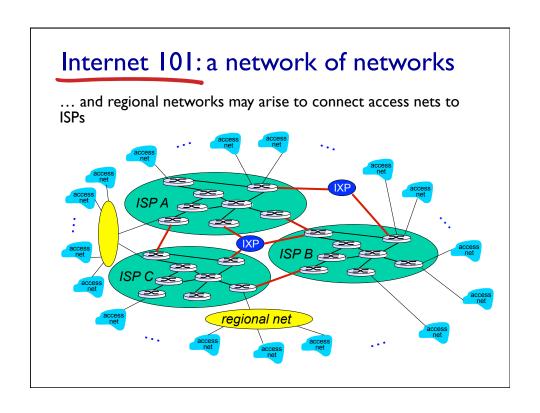


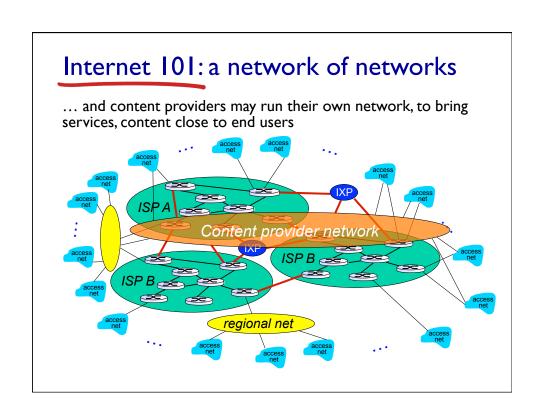








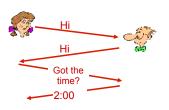




#### Internet 101: protocols

#### human protocols:

- "what's the time?"
- "I have a question"
- introductions
- ... specific messages sent
- ... specific actions taken when messages received



#### network protocols:

- hardware, software rather than humans
- define format, meaning of messages sent/received, actions taken on transmission/receipt
- all communication activity in Internet governed by protocols



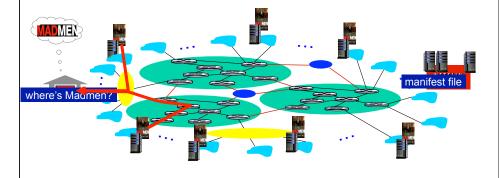
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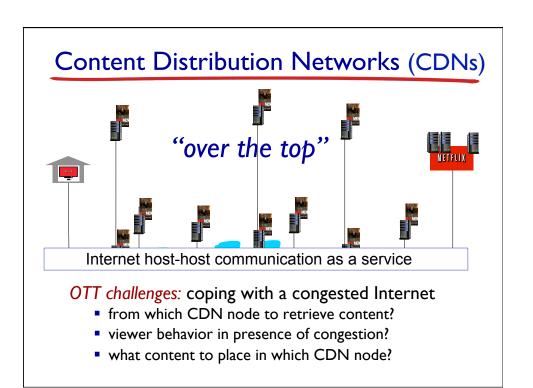
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#### Content Distribution Networks (CDNs)

- CDN: stores copies of content at CDN nodes
  - e.g. Netflix stores copies of MadMen
- subscriber requests content from CDN
  - directed to nearby copy, retrieves content
  - may choose different copy if network path congested



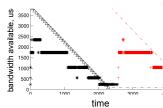


## CDNs: locating a "good" server

- CDNs (Akamai, Netflix): proprietary algorithms matching user with "nearby" server with high-bandwidth congestion-free path to client
  - "maps" of Internet topology
  - historical data (measurements) of Internet performance

Nygren, Sitaraman, Sun, "The Akamai network: a platform for high-performance internet applications," SIGOPS Oper. Syst. Rev. 44, 3 (August 2010)

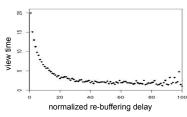
- client control: request lower/higher quality video encoding, using less/ more bandwidth
- client control: seek new server if performance drops below minimum

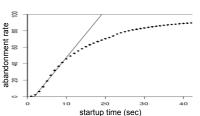


Adhikari, Guo, Hao, Varvello, Hilt, Steiner, Zhang, "Unreeling netflix: Understanding and improving multi-CDN movie delivery," IEEE INFOCOM, 2012.

#### CDN and user behavior

- Question: how does improved CDN performance affect user behavior?
  - abandonment, engagement, repeat viewership
  - quantitative, causal (avoid confounding factors)
- (big) data analysis: 6.7M users, 23M views, 100K unique videos

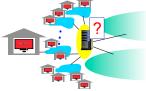




Video Stream Quality Impacts Viewer Behavior: Inferring Causality using Quasi-Experimental Designs, Shunmuga, Sitaraman, ACM Internet Measurement Conf. (IMC), Boston, MA, Nov 2012

#### CDN: content placement in servers

- Question: which content to place in which servers?
  - Netflix: all servers identical
  - predict future content access using ML techniques: content viewing, popularity ranking by neighbors?

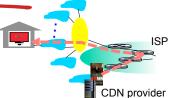


- populate server, make recommendation accordingly?
- degree of difference among regional servers?

.... on going work (Dernbach, Kurose, Mahadevan) with Technicolor Research

# **DETOUR** network neutrality

Question: to what extent can ISP regulate (or differentially charge) traffic flows within its network?



#### FCC "Open Internet Order" (2010):

- [Transparency rule:] ... shall publicly disclose accurate information ... sufficient for consumers to make informed choices ... and for content, application, service, and device providers to develop, market, and maintain Internet offerings
- [No blocking rule:] ... shall not block lawful content, applications, services, or non-harmful devices, subject to reasonable network management.
- [Non discrimination rule:] ... shall not unreasonably discriminate in transmitting lawful network traffic over a consumer's broadband Internet access service.



- 2000-2005: deregulation ISPs redefined as "information service" providers rather than "telecommunication service" providers
- ISP CDN provider
- 2005: ISP (Madison River) FCC consent degree: stop dropping VoIP packets
- 2008: FCC order against Comcast for throttling BitTorrent file sharing. Overturned 2010: FCC lacks sufficient statutorilymandated responsibility under Title I
- Feb. 2014: Verizon v FCC: vacates Open Internet Order
- March 2014: Netflix, noting degrading performance to Comcast subscribers, agrees to "pay-to-peer" with Comcast

The future?

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#### Architecture: form follows function

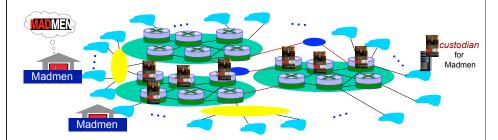






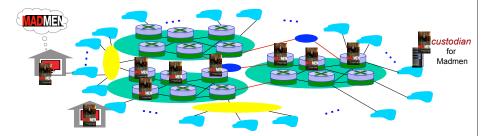






- $\ensuremath{ \bullet }$  routers equipped with massive storage
- client request routed towards custodian
- content returned, cached enroute
- client requests may be satisfied by in-network caches

#### In-network caching

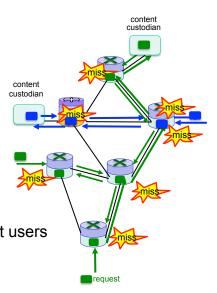


#### Many challenges!

- routing to custodian: based on name, or address?
  - how to search for content
- mobile users, content custodians
- \* cache management algorithms
- modeling, design, analysis of cache networks

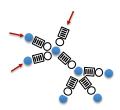
#### Cache networks

- client requests content
- request routed (e.g., shortest path) to known content custodian
- en-route to custodian, caches inspect request
  - hit: return local copy
  - miss: forward request towards custodian
- during content download, store in caches along path
- content requests from different users interact: cache replacement



## Challenge: networks of caches

- network effect: interaction among content request/ reply flows from different users:
  - content replacement: requested content by one user replaces content previously requested by others



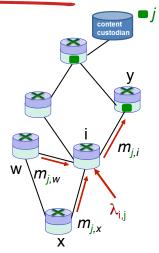
Packet-switching: queueing networks (Kleinrock, 1963)

## Modeling a network of caches

- node i: exogenous (external)
  arrivals for content j: λ<sub>ii</sub>
- node i: internal arrivals (miss stream) for content j from downstream neighbors h: m<sub>i,h</sub>
  - complex, correlated process
- r<sub>i,j</sub>: aggregate rate of arrival requests at i for content j

$$r_{i,j} = \lambda_{i,j} + \sum_{\substack{\text{all downstream neighbors, } h}} m_{j,k}$$

 ZDD: zero download delay assumption

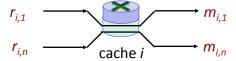


#### Cache networks: approximate analysis

- SCA: standalone cache i approximation algorithm: given r(i,j), compute miss rate for all content j
- Independence Reference Model (IRM) of incoming requests:

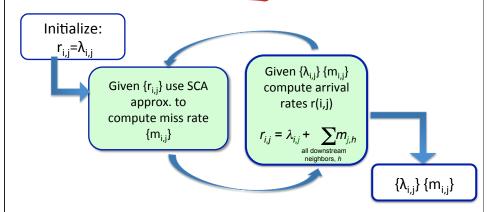
 $Pr(X_t = j \mid X_1,...,X_{t-1}) = Pr(X_t = j)$ 

SCA approximation algorithm for LRU: [Dan 1985]



But we need  $\{(r_{i,j}, m_{i,j})\}$  for a *network* of caches

#### Fixed-point iteration



 fixed-point approximation relatively accurate: main source of error is independent reference model

"Approximate Models for General Cache Networks," Elisha J. Rosensweig, Jim Kurose and Don Towsley, IEEE NFOCOM 2010

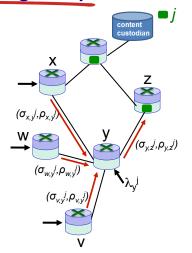
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## Cache networks: bounding analysis

Question: can we provably bound characteristics of request flows between caches?

- $\rho_{y,y}^{j}$ : bound on average arrival rate of requests for content item j, from cache y
- $\sigma_{v,y}^{j}$ : bound on burstiness of requests for content item j, from cache v to cache y

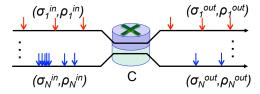
$$\int_{t_1}^{t_2} r_{y,z}^{j}(t) dt < (t_2 - t_1) \rho_{v,y}^{j} + \sigma_{v,y}^{j}$$



## From $(\sigma_1^{\text{in}}, \rho_1^{\text{in}})$ to $(\sigma_1^{\text{out}}, \rho_1^{\text{out}})$

network calculus for cache flows:

given input bounds, compute output bounds



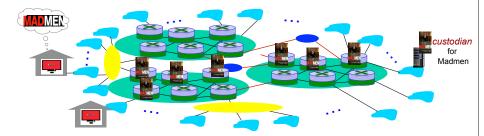
Theorem: For a cache of size C:

$$\rho_i^{out} = \min(\rho_i^{in}, M_i(\rho_1^{in}, \dots, \rho_n^{in}, C))$$

Can calculate  $\rho_i^{out}$  from  $\{\rho_i^{in}\}$ ,  $\sigma_i^{out}$  also

E. Rosensweig, J. Kurose, "A Network Calculus for Cache Networks," IEEE Infocom 2013. E. Rosensweig, D. Menasche, J. Kurose, "On the Steady-State of Cache Networks," IEEE INFOCOM 2013 (Best paper award)

## In-network caching

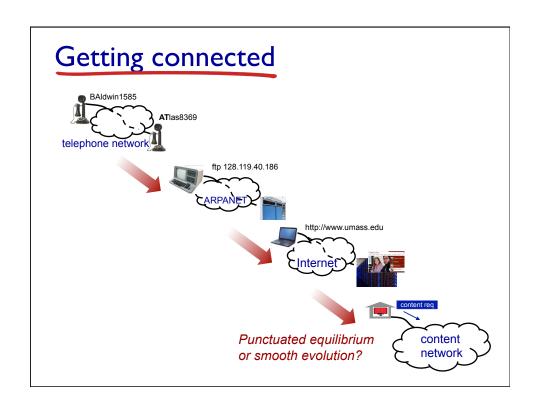


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## Thanks!

**UMass** 

faculty

collaborators

... and staff

and friends

M. Adler

W. Israel

C. Krishna

V. Lesser

B. Levine

S. Mahadevan

D. McLaughlin

G. Miklau

R. Moll

E. Riseman

P. Shenoy

J. Stankovic

D. Towsley

A. Venkataramani

B. Woolf

M. Zink



#### Thanks!

UMass students and postdocs S. Abdallah S. Heimlicher A. Nyzio M. Somasundaram M. Badov B. Horling J. Padhye J. Steinberg S. Bhattacharyya Y. Huang Partan J. Steshenko M. Bradshaw M. Stern R. Hwang D. Pepyne C. Casetti T. Ireland Pingali K. Suh X. Tie V. Chaganti S. Jaiswal Pingali S. S. Chen P. Ji Ramjee H. Uppal Ribeiro Y. Chen B. Jiang B. G. VanLeemput W. Chen S. Kasera E. Rosensweig S. Vasudevan B. Wang R. Chipalkatti R. Khalili D. Rubenstein M. Dehghan R. Koodli K. Watts S. Sahu J. Dey V. Lakamraju Salehi W. Wei B. Donovan H. Lee H. Schulzrinne D. Westbrook D. Figueiredo Seetharam M. Yajnik B. Liu A. V. Firoiu Y. Liu S. Sen Yang T. Friedman F. LoPresti P. Serrano D. Yates S. Gangam E. Lyons J. Shapiro X. Zhang L. Gautier V. Manfredi A. Sharma C. Zhang Z. Ge D. Menasche C. Shen Z. Zhang M. Ghaderi A. Misra A. Shrivastava C. Zhang M. Girkar S. Moon R. Simha H. Zhang Y. Gu R. Nagarajan M. Sims C. Zhang Y. Guo T. Zhu E. Nahum S. Singh D. Gyllstrom G. Neglia S. Singh Z. Zhu

#### To learn more:



- CS 290nw: A networked world
- CS 453: Computer networks