

## INTERNET TRAFFIC AND QoS

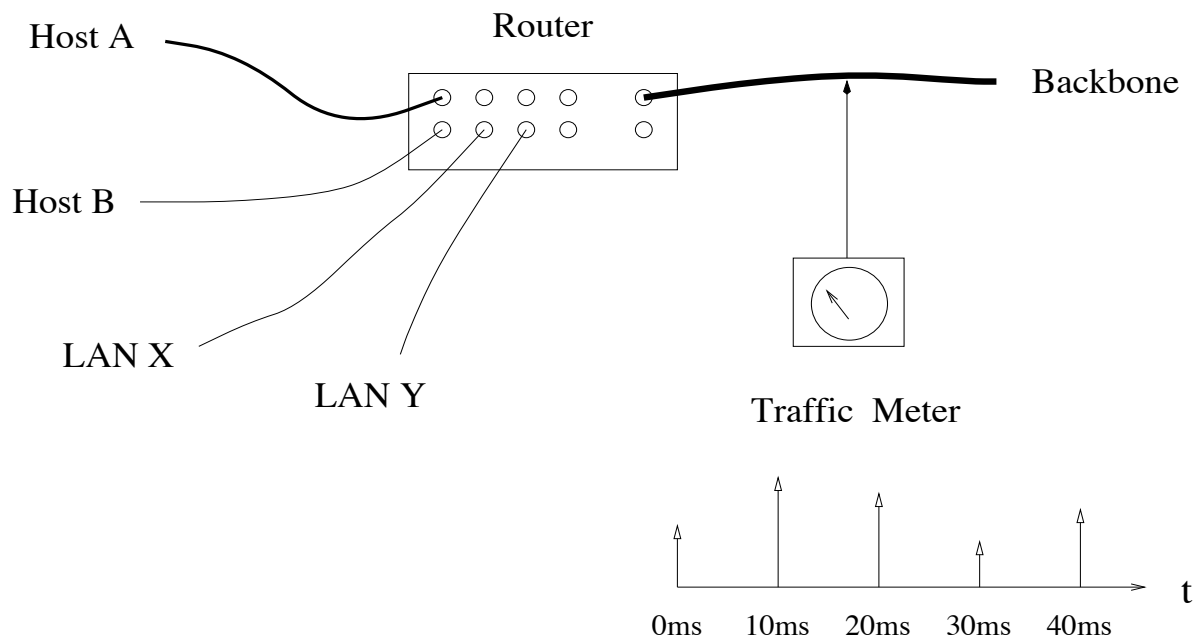
Simplest of all: constant bit rate (CBR)

- flat is good
- because predictable
- e.g., telephone call, real-time MP3 audio

Internet data traffic: variable bit rate (VBR)

- session arrivals: random
- exponential interarrival time
- swimming with the fishes: Poisson process
- e.g., telephone calls, TCP connections, fast food

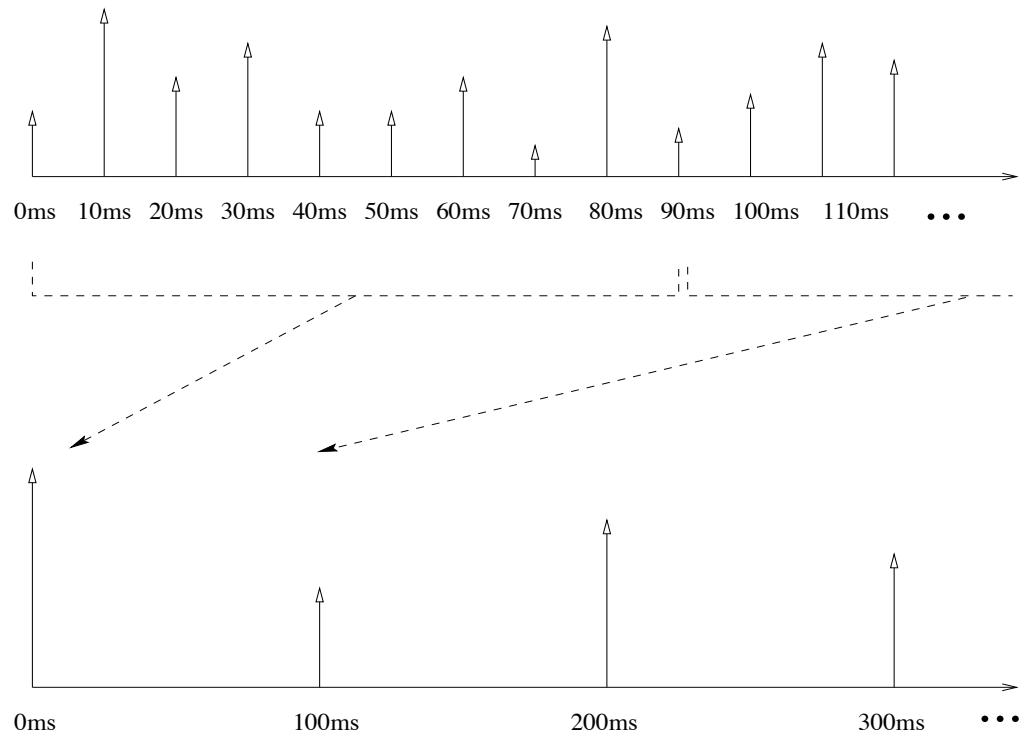
What does Internet traffic look like?



→ logging

→ traffic time series (at 10ms granularity)

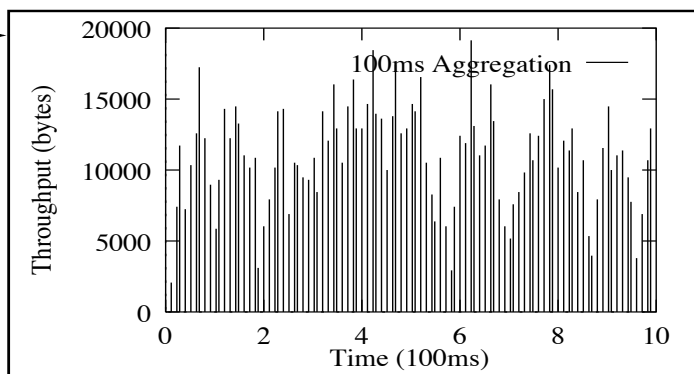
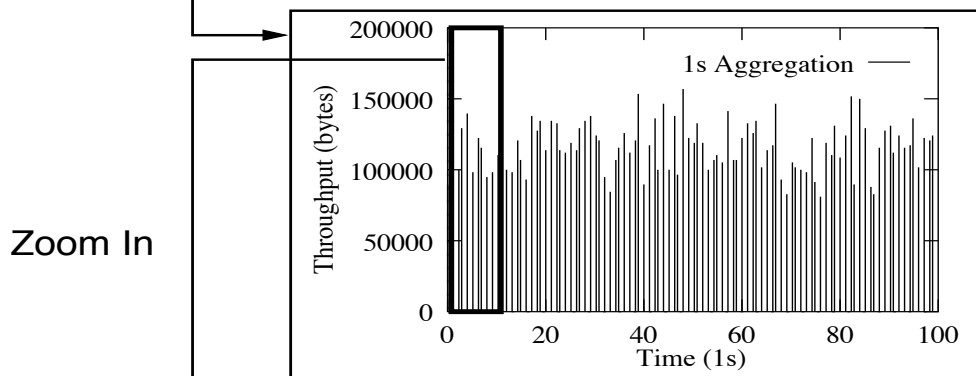
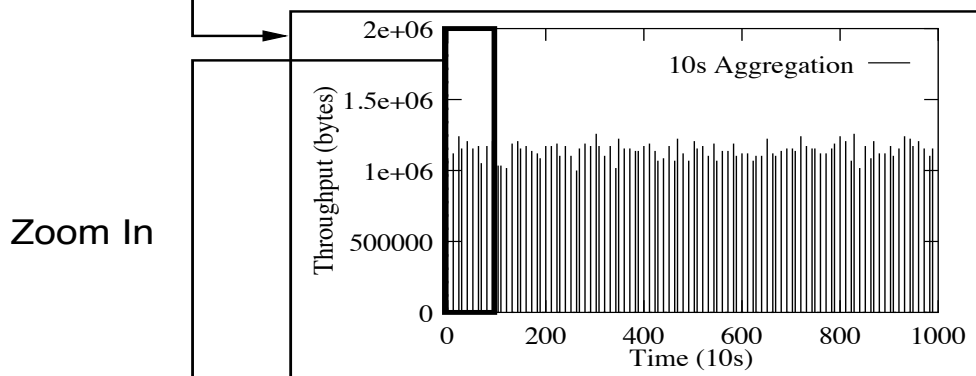
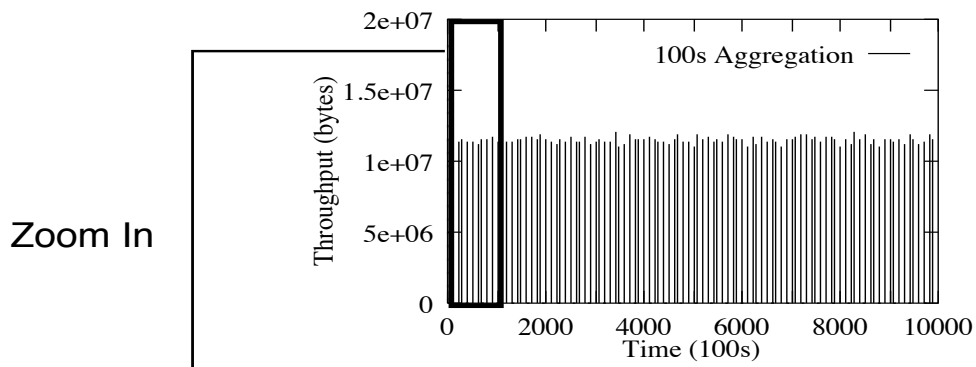
### Aggregation (time):



→ analogous to computing sample mean

→ aggregation over multiple time scales

→ what to expect?



Deaggregation

Aggregation

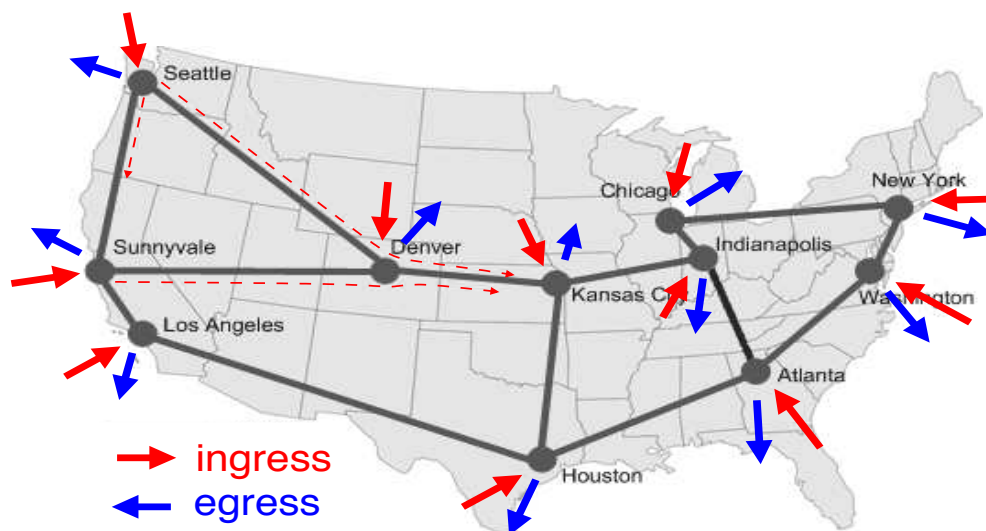
Aggregated traffic becomes flat

- “flat is good” rule for QoS provisioning
- bandwidth dimensioning
- technically: law of large numbers in action
- not correlated in time
- efficient and happy customers

Also aggregation over multiple users

- called statistical multiplexing
- assuming independence between different users
- nice normal distribution shape
- allows non-peak reservation
- consider peak-to-mean ratio: less costly

- LLN: principal engineering tool used by large transit providers and large access providers
  - “largeness” is key
  - even though components are random, system is well-behaved and predictable
  - apply at ingress/egress and backbone links
  - measurement-based tool: traffic matrix



Network engineering:

- Feedback traffic control
  - closed-loop control (“adaptive”)
  - small time scale: msec
  - mainly by end systems
  - e.g., congestion control
- Resource provisioning
  - open-loop control (“in advance”)
  - large time scale: seconds, minutes, and higher
  - mainly by service providers

Question: what do ISPs do to keep customers happy

QoS policy:

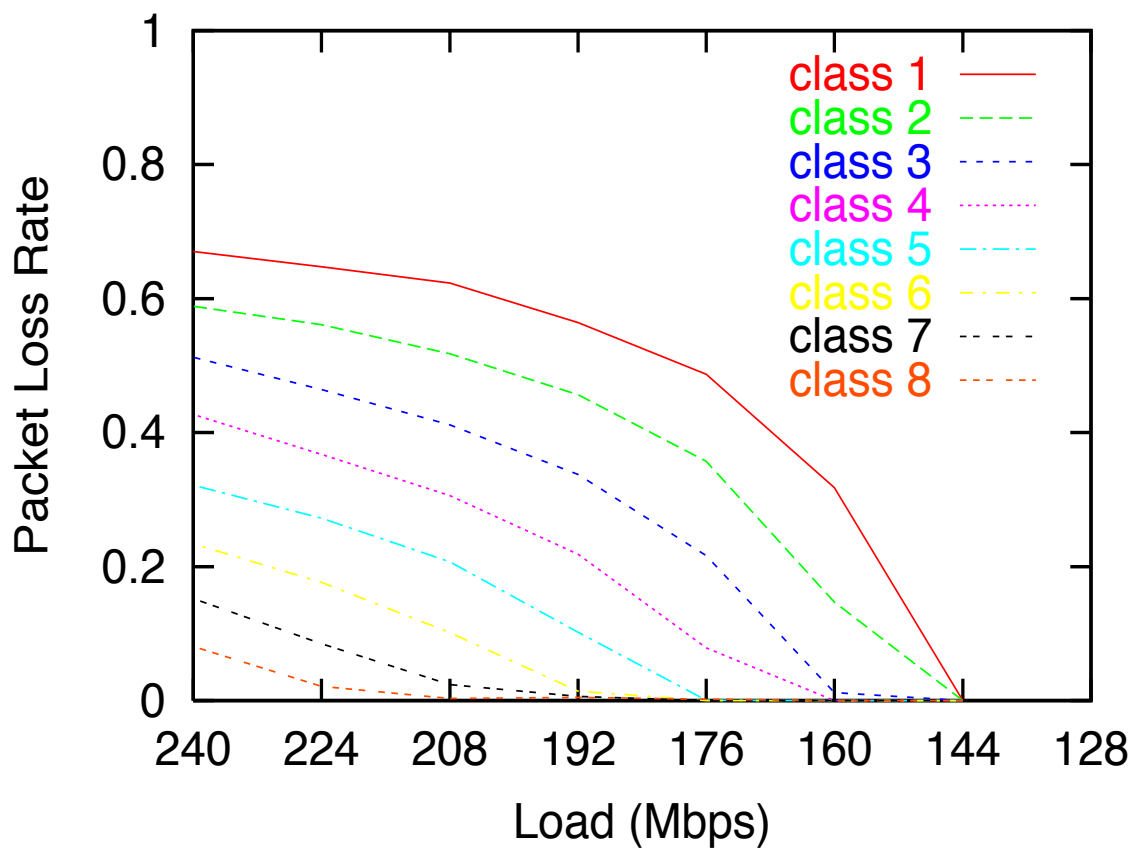
- Per-user (or flow) reservation for super-quality service  
→ guaranteed service
- Shared service classes (platinum, gold, silver, bronze) for good service  
→ differentiated service

Internet standards:

- IETF IntServ  
→ RSVP protocol  
→ analogous to leasing a line
- IETF DiffServ  
→ different types of router behavior  
→ AF, EF, Cisco's LLQ for VoIP



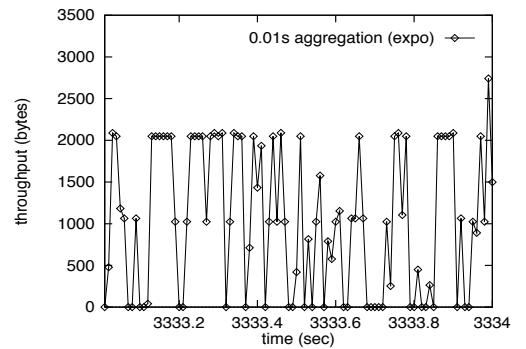
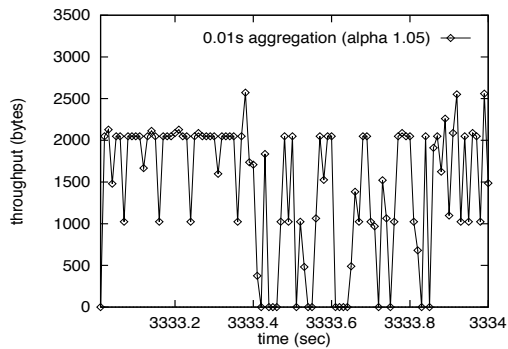
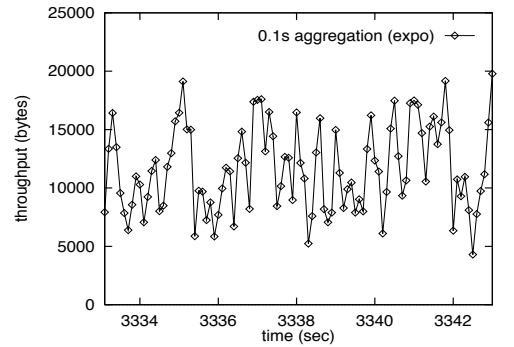
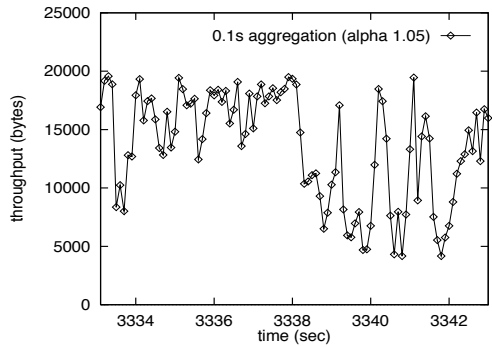
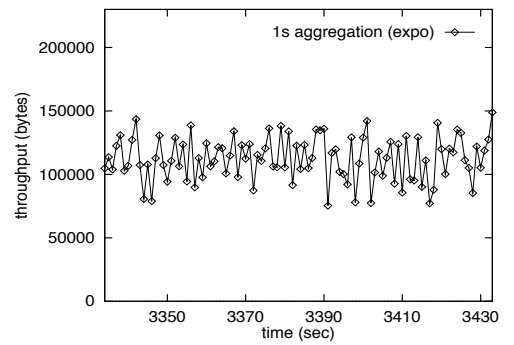
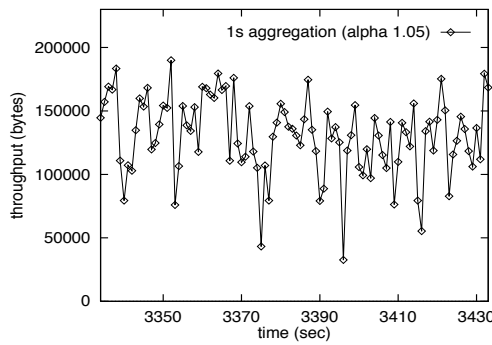
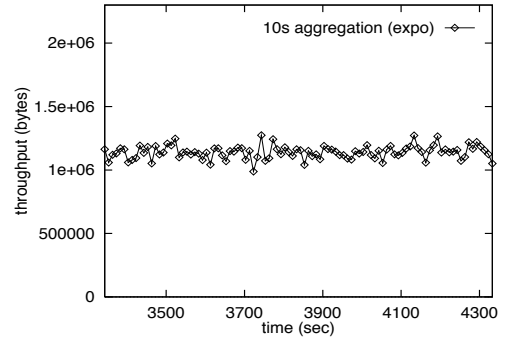
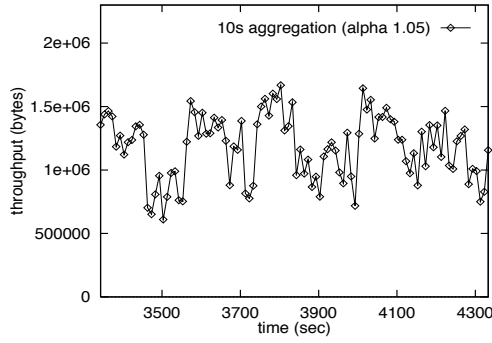
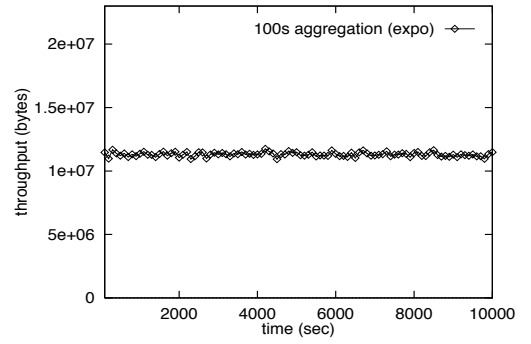
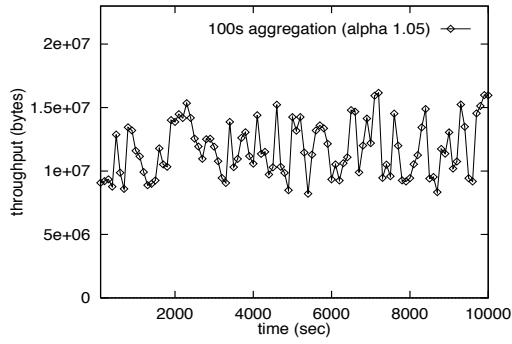
Cisco 7206VXR router: packet loss rate



- 8 classes
- OC-3 link
- varying offered load

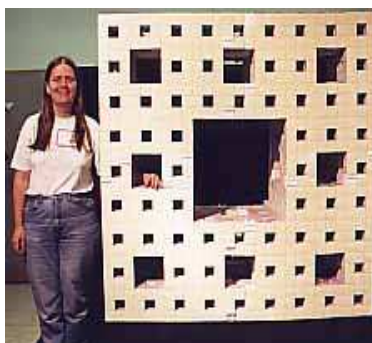
Back to Internet traffic:

- what does it look like?
- doesn't become flat with time aggregation
- stays bursty!
- in a peculiar fashion: self-similar or fractal



Some fractal objects:

Menger sponge (picture from [www.ics.uci.edu/~eppstein](http://www.ics.uci.edu/~eppstein)):



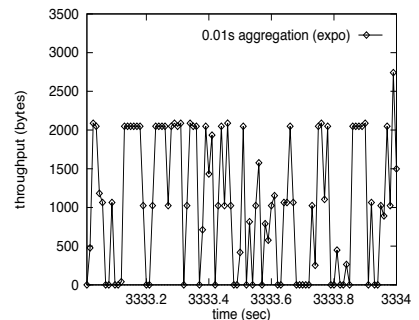
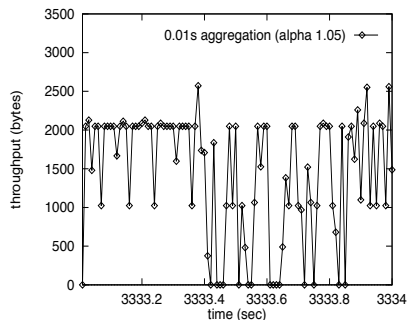
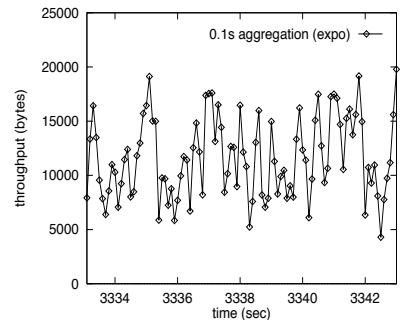
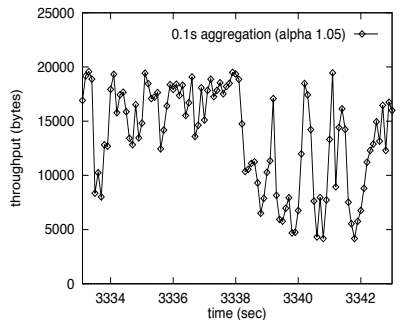
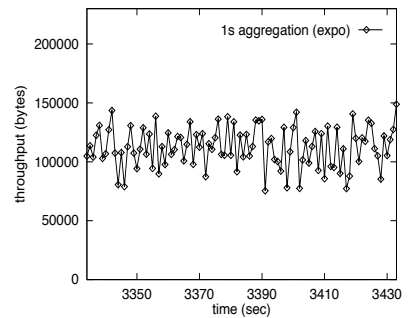
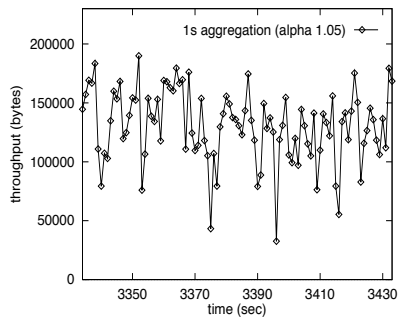
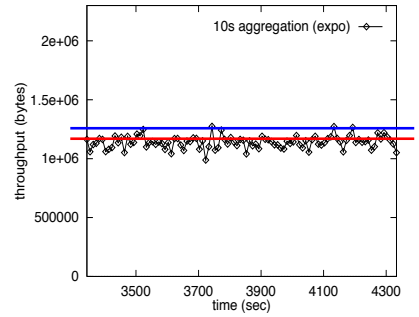
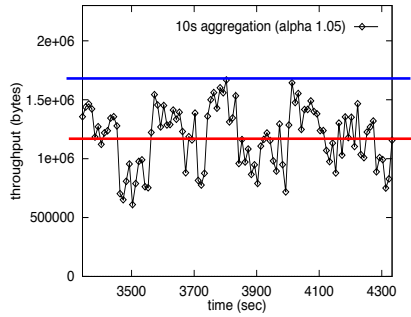
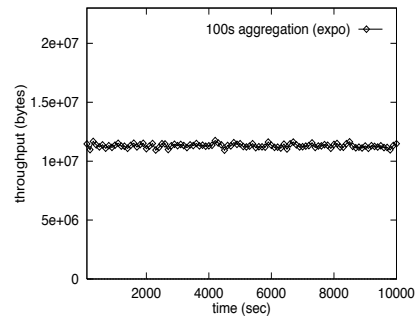
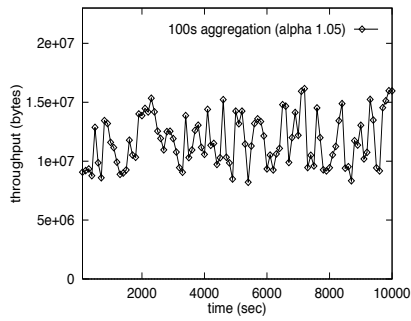
Fractal fern:



→ are fractal objects random?

# Internet: self-similar

# Telephony: Poisson-like

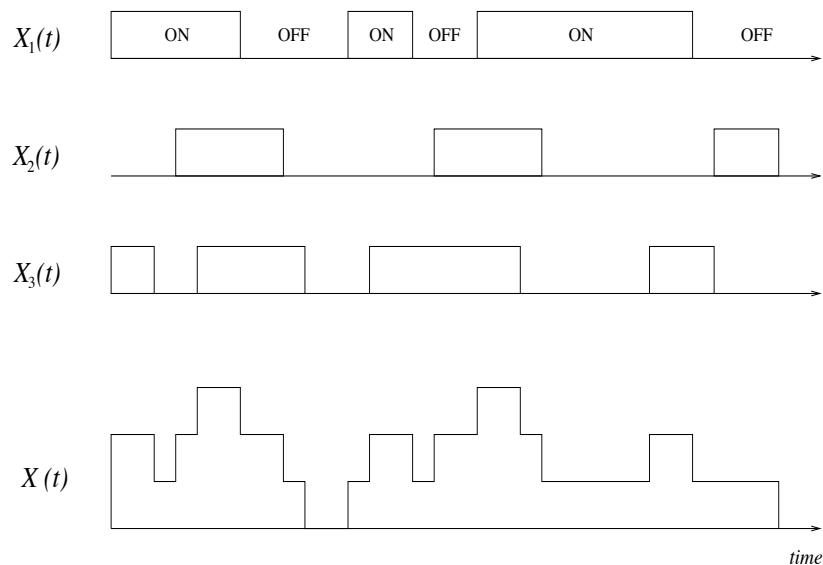


peak  
avrg

Consequences:

- cannot use “flat is good” method anymore
- intrinsic trade-off between QoS and efficiency
- bad news for QoS provisioning
- traffic must be correlated in time (why?)

Ex.: on/off model



- on-period: TCP file transfer
- on-period length: file transfer completion time
- ignore internal details within on-period: sawtooth
- on-period could be VoIP session: CBR
- not exactly: a user talks only 40% of the time
- approximate view: ok

We know session arrivals are (approximately) Poisson; what about session lifetimes?

Important fact: TCP session lifetimes are heavy-tailed

- $\Pr\{Z > x\} \approx x^{-\alpha}$
- as opposed to:  $\Pr\{Z > x\} \approx e^{-bx}$
- exponent:  $1 < \alpha < 2$  (closer to 1)
- note: different from Internet connectivity power-law
- much more likely session will last a long time
- has finite mean but infinite variance

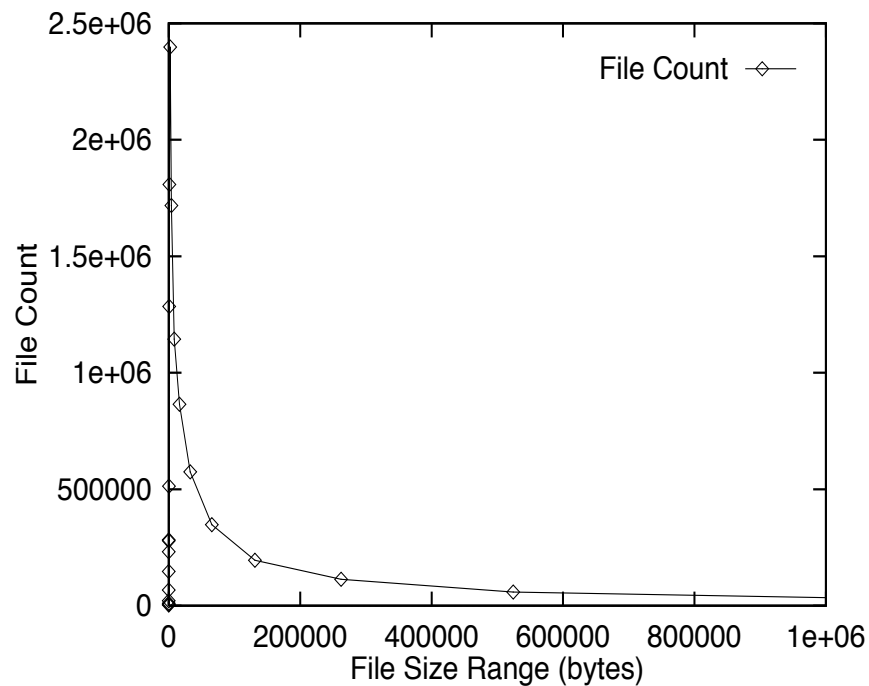
Why would TCP session lifetimes be heavy-tailed?

- TCP traffic makes up bulk of Internet traffic



Tale of elephants and mice:

→ UNIX and WWW file systems



→ many small ones (mice)

→ a few very large ones (elephants)

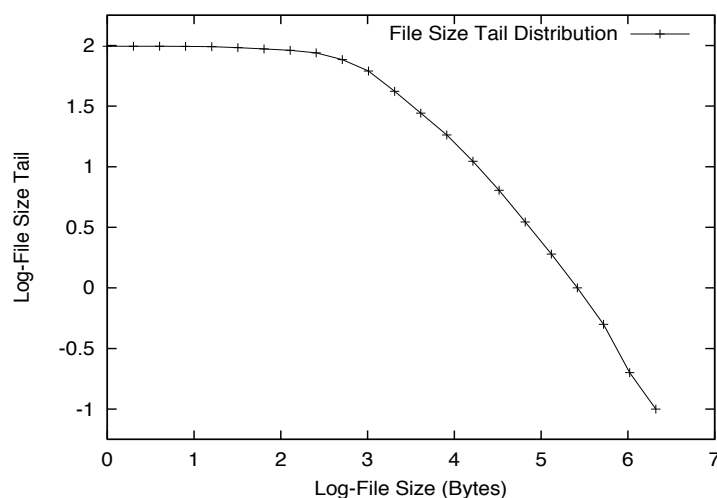
→ 10% consumes 90% of bandwidth

How to check if files sizes are heavy-tailed?

Since  $\Pr\{Z > x\} \approx x^{-\alpha}$ , take logarithm on both sides:

$$\longrightarrow \log \Pr\{Z > x\} \approx -\alpha \log x$$

$\longrightarrow$  linear function with negative slope  $-\alpha$



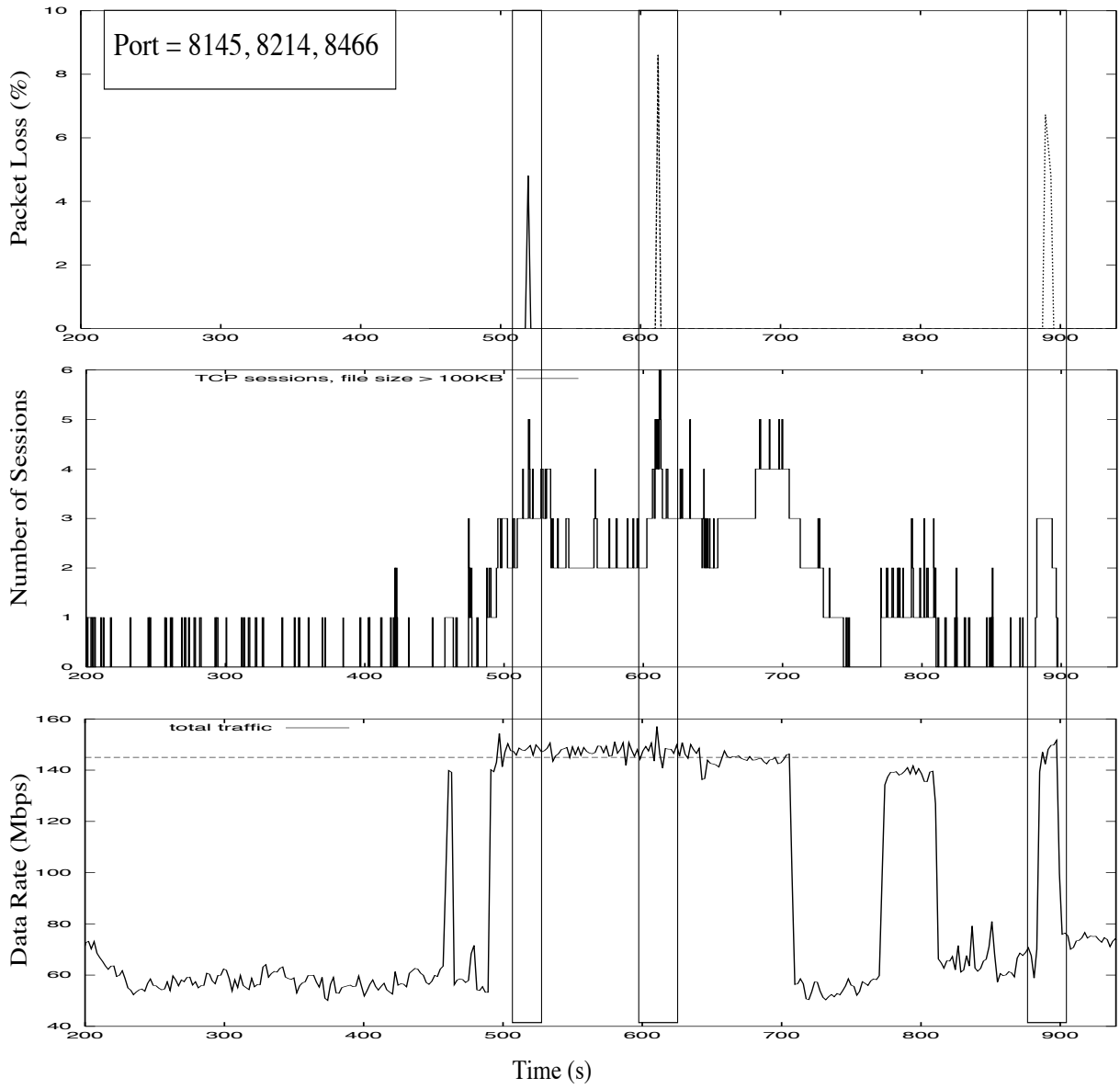
$\longrightarrow$  holds true for large  $x$

$\longrightarrow$  what's the slope  $\alpha$ ?

$\longrightarrow$  we don't care about details of small sizes (why?)

Elephants in action:

→ at backbone router



Can the problem be solved?

→ no: as long as elephants and mice holds

Turns out to be a wide-spread phenomenon is sociology, networks, and elsewhere

→ size (population) of cities

→ popularity

→ frequency of words in books

→ etc.

In the real world:

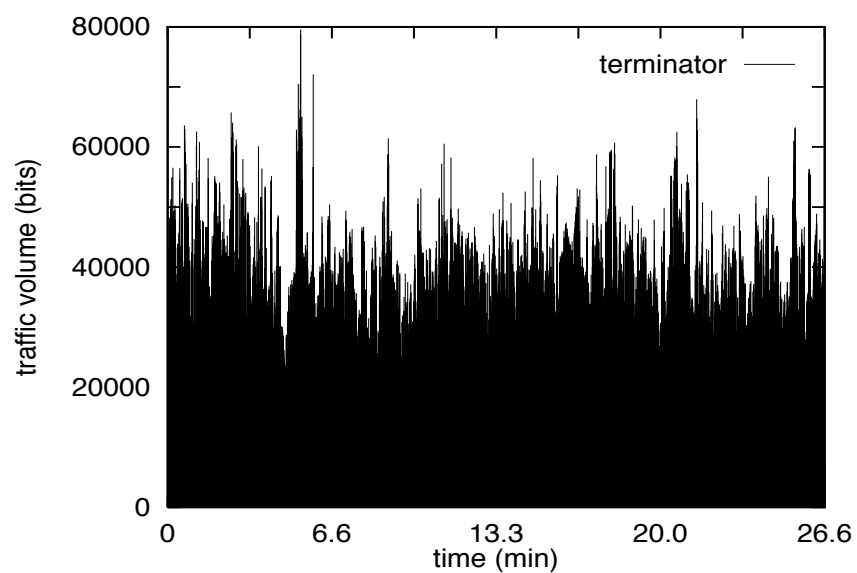
→ norm: skewed distribution of sizes

→ power-law

**Bandwidth allocation rule of thumb: 50%  
overprovision**

## Real-time VBR source profile

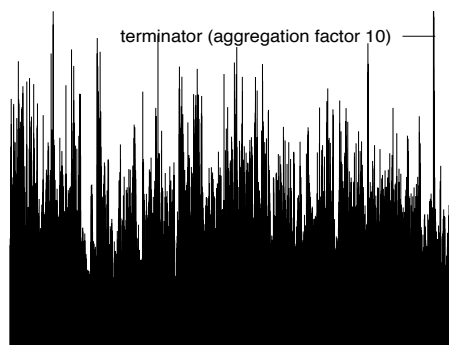
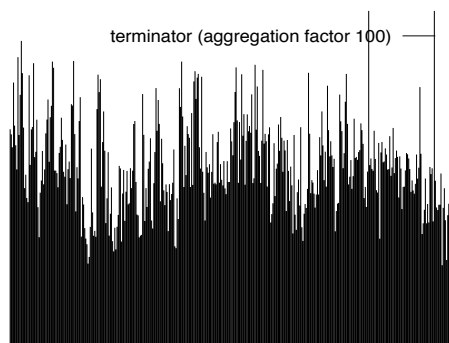
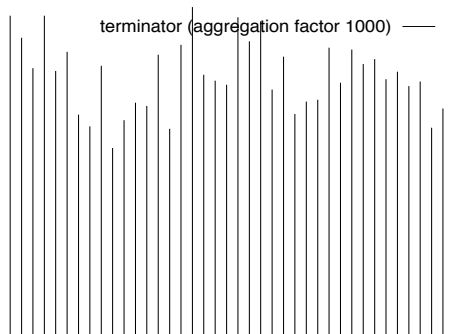
Consider traffic profile of compressed video (e.g., MPEG)



→ periodic real-time application

→ period  $T = 1/f$  ( $f$ : frame rate)

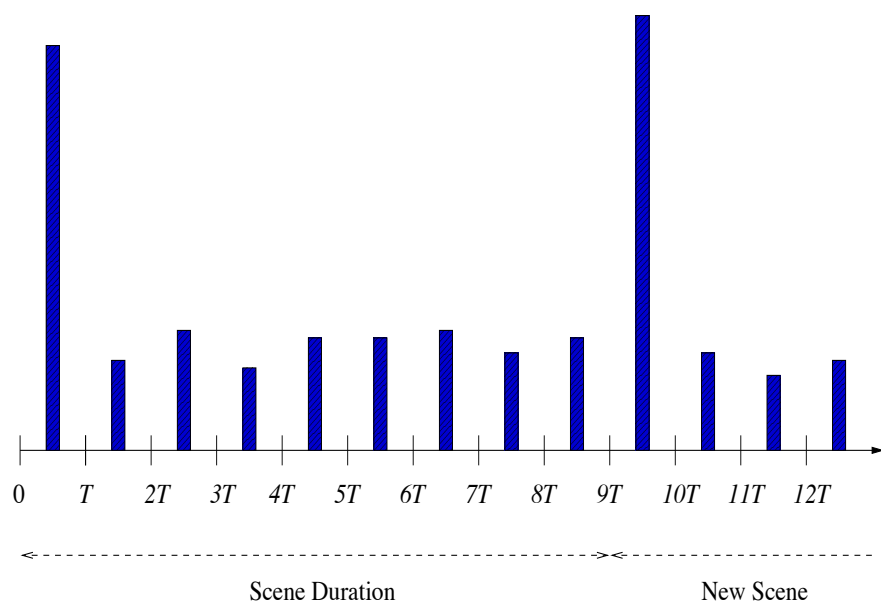
Burstiness structure:



→ burstiness persists across multiple time scales

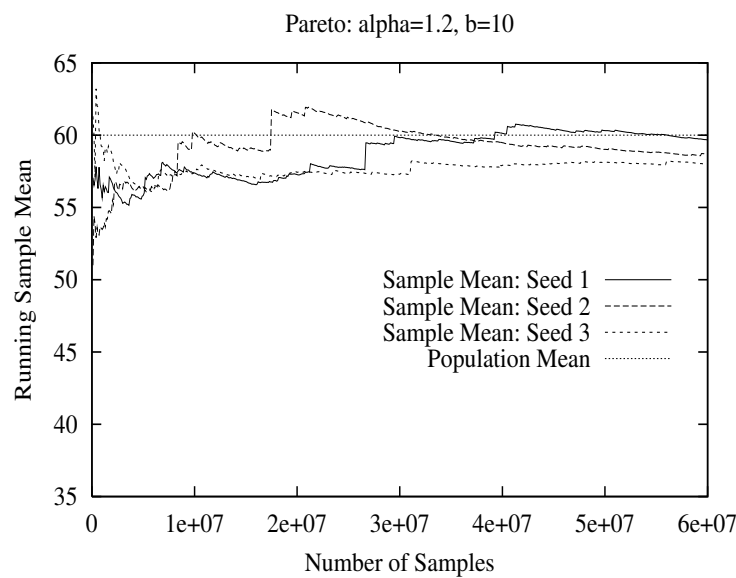
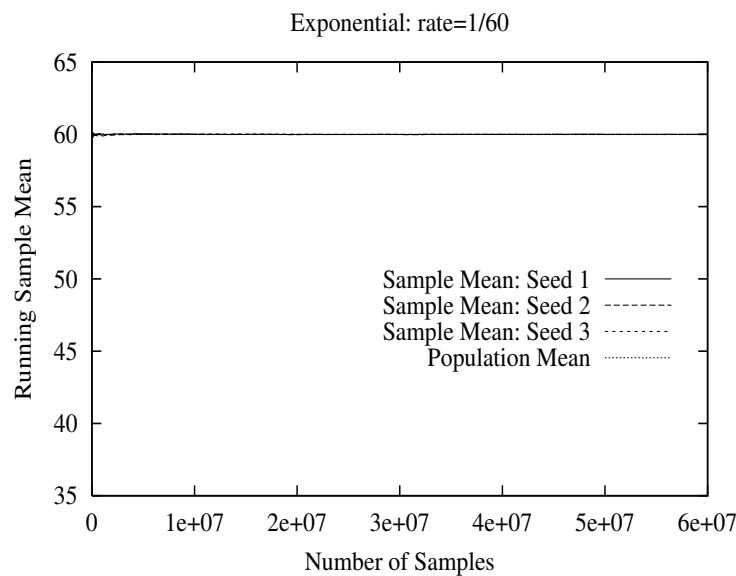
Possible causes:

- Heavy-tailed scene durations
  - facilitates inter-frame compression
- Repeating GOP pattern
  - e.g., I B B P B B



## Note on sampling and convergence.

Sample mean convergence rate: exponential vs. Pareto



extremely slow convergence: concern when generating artificial workload