

Some background on Lab 1

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Lab 1

- Lab 1 is about comparing a simple model for network traffic (Poisson traffic) with actual network traffic (LAN traffic, video traffic)
- Lab 1 retraces one of the most fundamental insights of networking research ever:

“Typical network traffic is not well described by Poisson model”

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Poisson

- In a **Poisson process** with rate λ , the number of events in a time interval $(t, t+\tau]$, denoted by $N(t+\tau) - N(t)$, is given by

$$P[N(t+\tau) - N(t) = k] = \frac{(\lambda\tau)^k}{k!} e^{-\lambda\tau}, k = 0, 1, \dots,$$

- In a Poisson process with rate λ , the time between events follows an **exponential distribution**:

$$P[\text{Time between two events} \leq X] = 1 - e^{-\lambda X}$$

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In the Past...

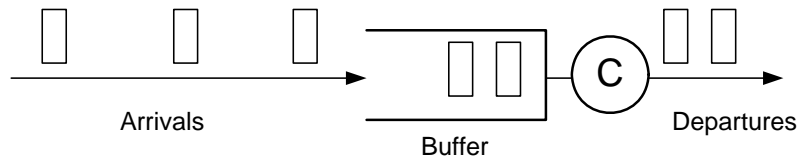
- Before there were packet networks there was the circuit-switched telephone network
- Traffic modeling of **telephone networks** was the basis for initial network models
 - Assumed Poisson arrival process of new calls
 - Assumed Poisson call duration

Source: Prof. P. Barford (edited)

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... until early 1990's

- Traffic modeling of packet networks also used Poisson
 - Assumed Poisson arrival process for packets
 - Assumed Exponential distribution for traffic



Source: Prof. P. Barford (edited)

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The measurement study that changed everything

- **Bellcore Traces:** In 1989, researchers at (Leland and Wilson) begin taking high resolution traffic traces at Bellcore
 - Ethernet traffic from a large research lab
 - 100 μ sec time stamps
 - Packet length, status, 60 bytes of data
 - Mostly IP traffic (a little NFS)
 - Four data sets over three year period
 - Over 100 million packets in traces
 - Traces considered representative of normal use

The data in part 3 of Lab 1 is a subset of the actual measurements.

Source: Prof. C. Williamson

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Extract from abstract

Results were published in 1993

- **“On the Self-Similar Nature of Ethernet Traffic”**
Will E. Leland, Walter Willinger, Daniel V. Wilson, Murad S. Taqqu

*“We demonstrate that Ethernet local area network (LAN) traffic is **statistically self-similar**, that none of the commonly used traffic models is able to capture this fractal behavior, that such behavior has serious implications for the design, control, and analysis of high-speed...”*

That Changed Everything.....

Source: Prof. V. Mishra, Columbia U. (edited)

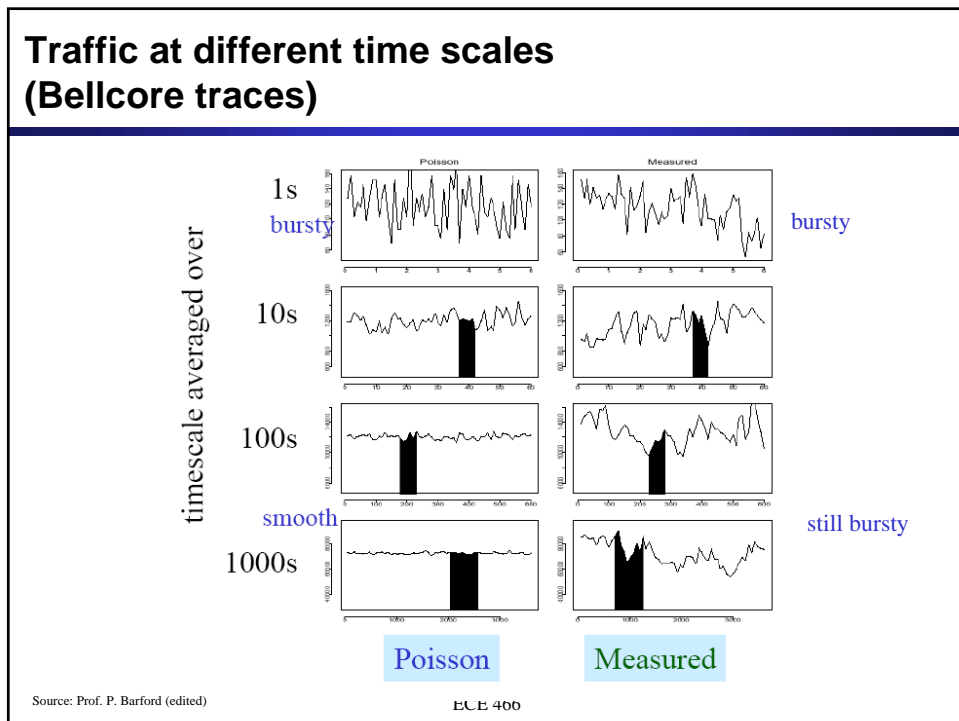
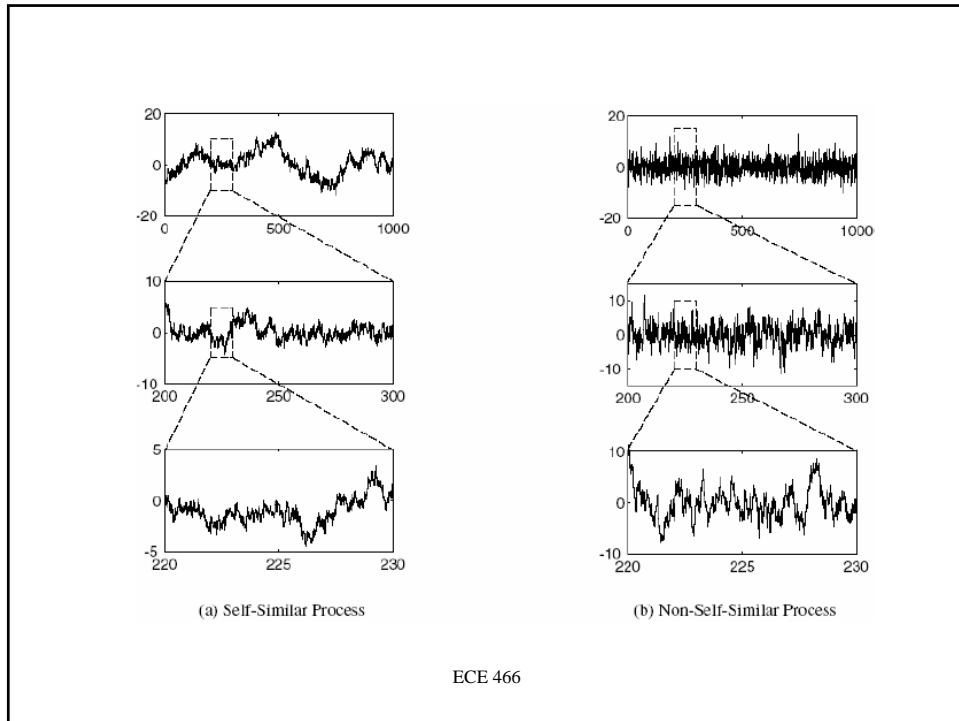
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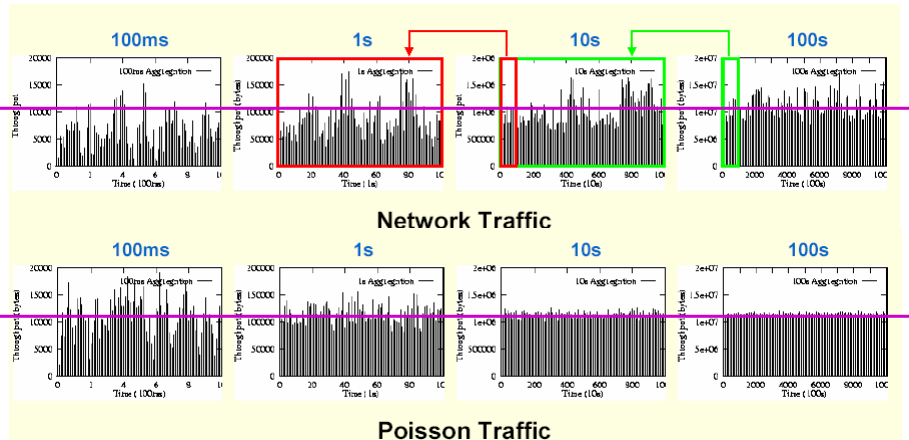
Fractals



Source: Prof. P. Barford, U. Wisconsin

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Source: Prof. V. Mishra, Columbia U.

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What is the observation?

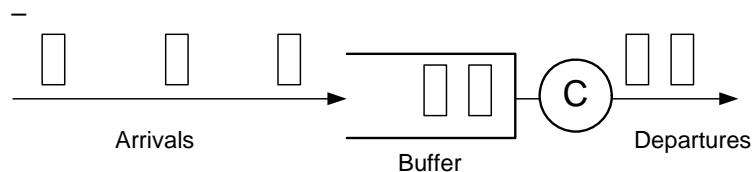
- A **Poisson process**
 - When observed on a fine time scale will appear bursty
 - When aggregated on a coarse time scale will flatten (smooth) to white noise
- A **Self-Similar (fractal) process**
 - When aggregated over wide range of time scales will maintain its bursty characteristic

Source: Prof. C. Williamson

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Why do we care?

- For traffic with the same average, the probability of a buffer overflow of self-similar traffic is much higher than with Poisson traffic
 - Costs of buffers (memory) are 1/3 the cost of a high-speed router !
- When aggregating traffic from multiple sources, self-similar traffic becomes burstier, while Poisson traffic becomes smoother



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Self-similarity

- The objective in Lab 1 is to observe self-similarity and obtain a sense.
- The challenge of Lab 1:
 - The Bellcore trace for Part 4 contains 1,000,000 packets
 - The computers in the lab are not happy with that many packets
 - Reducing the number of packets in plots, may reduce opportunities to discover self-similarity effect

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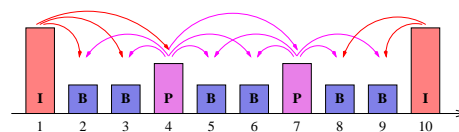
Part 2: Video Traffic

- Compressed video traffic is very bursty, as a result of the compression algorithm
- Uncompressed digital video consists of a sequence of images. The frame rate is 24-30 frames/seconds
- Video compression algorithms (MPEG-1,2,4, H.263) exploit that subsequent frames are very similar
 - Only transmit the difference between subsequent frames

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VBR Compression

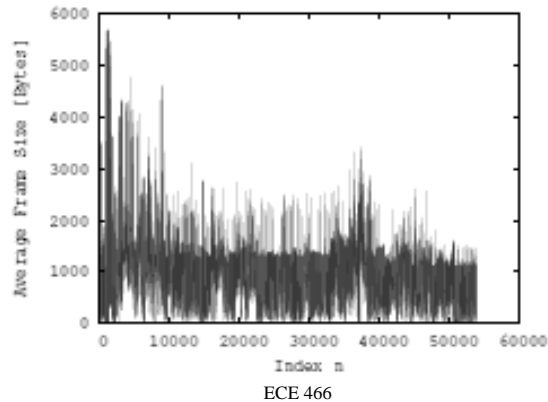
- Most compression algorithms generate three types of frames:
 - **I Frames** (intra-coded frames):
 - Still images, just like JPEG
 - **P Frames**: (predictive frames)
 - encode the differences from the most recent I or P frame
 - **B Frames** (bi-directional frames):
 - interpolations of the next and previous I or P frames
- The frames are generated in a repeated pattern, called the **Group-of-Picture (GOP)** pattern, e.g., IBBPBBPBB
- The result is that compressed video is sending at different times at different rates. This is called **Variable Bit Rate** or **VBR**.



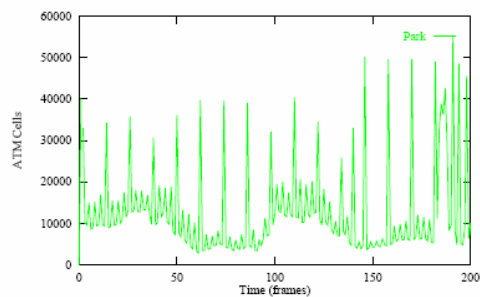
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Video Traffic

- This plot shows the size of frames from a compressed version of “Silence of the Lambs” (MPEG-4 part 2, Q=28)
- Encoding done at Arizona State University

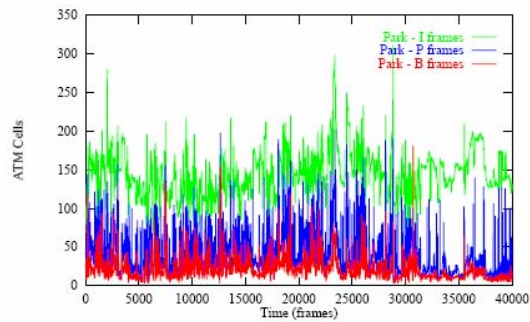


MPEG-1 Video Trace



- ◆ 30-minute trace from *Jurassic Park*, 24 fps
- ◆ Resolution: 384x288; YUV (4:1:1), 8-bit color
- ◆ Q-factors: I=10, P=14, B=18
- ◆ GOP Size: 12; GOP Pattern: IBBPBBPBBPBB
- ◆ Encoding done at University of Wurzburg (1995).

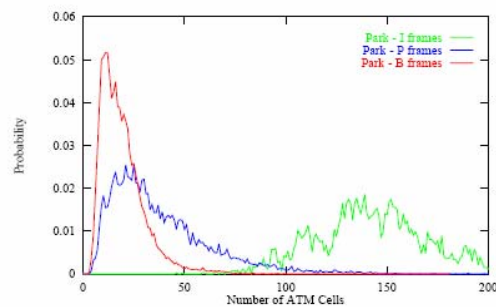
MPEG-1 Video Trace



◆ Frame Types:

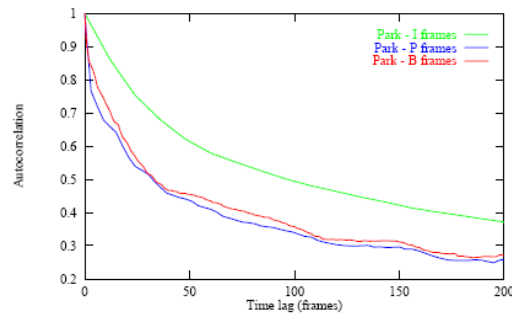
top - I-frames middle - P-frames bottom - B-frames

Marginal Distribution



- ◆ Marginal distribution per frame type
- ◆ Has been matched with Log-Normal distribution and Weibull distribution.

Autocorrelation Function



♦ Autocorrelation function broken down by frame type.

• Autocorrelation function

$$\begin{aligned}
 R(k) &= \frac{Cov[X_n, X_{n+k}]}{Var[X_n]} \\
 &= \frac{E[(X_n - \bar{X})(X_{n+k} - \bar{X})]}{Var[X_n]}
 \end{aligned}$$

HPDC-5

Distributed Multime

Making the concept of “Self-similarity” precise

- Self-similarity is a mathematically well-defined property
 - We do not cover this
- Self-similar traffic has certain statistical properties
 - Slow decay of autocorrelation function
 - long-range dependent
 - “Hurst parameter” and “index of dispersion” has values in characteristic ranges

This is done in the optional Part 4 of the lab

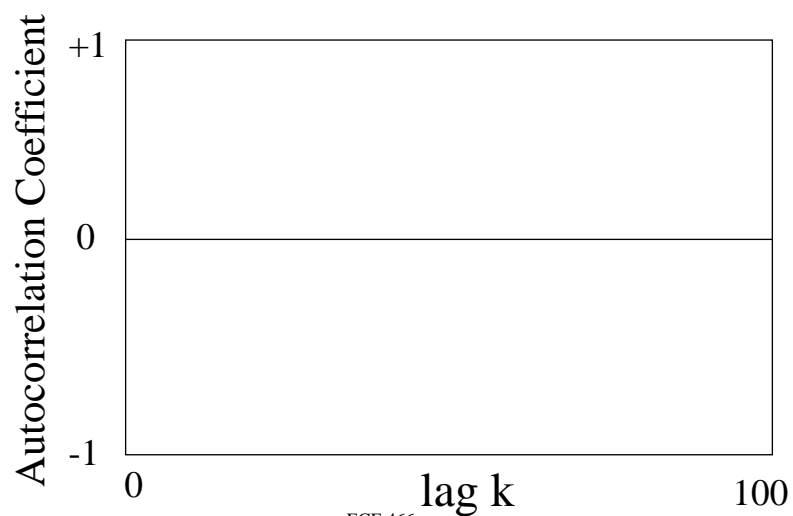
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Long Range Dependence

- Autocorrelation coefficient can range between:
 - +1 (very high positive correlation)
 - 1 (very high negative correlation)
 - Zero means no correlation
 - Autocorrelation function shows the value of the autocorrelation coefficient for different time lags k
- o **A long-range dependent process has an autocorrelation function** $R(k)$ that decreases hyperbolically (not exponentially)
- $\sum_k R(k) = \infty$ (long range dependence)

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Autocorrelation Function



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