

Simple Network Measurements Please!

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Part I: SNMP traffic data

- Simple Network Management Protocol
- Why? How? What?

Part II: Wavelets

- What can you do?
- Why not?

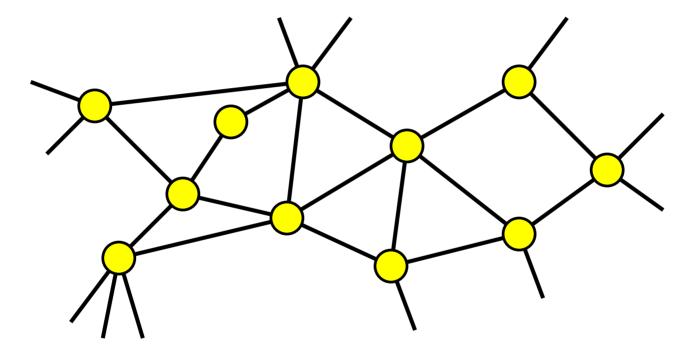
Part III: Modeling

- Putting time series and traffic modeling together
 - Traffic modeling deals with stationary processes (typically)
 - Time series gives us a way of getting a stationary process
 - But the analysis requires an understanding of the traffic model

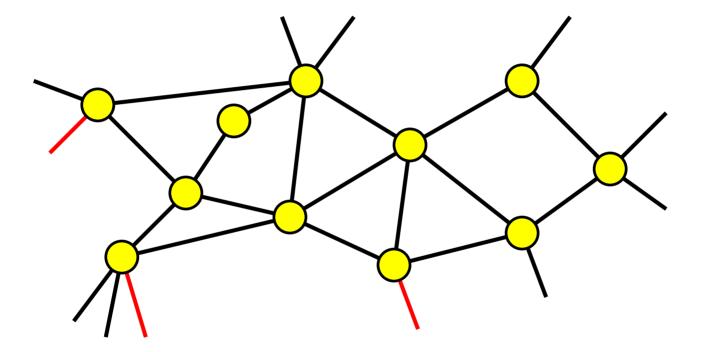


Part I: SNMP Traffic Data

Data Availability - Traffic Data



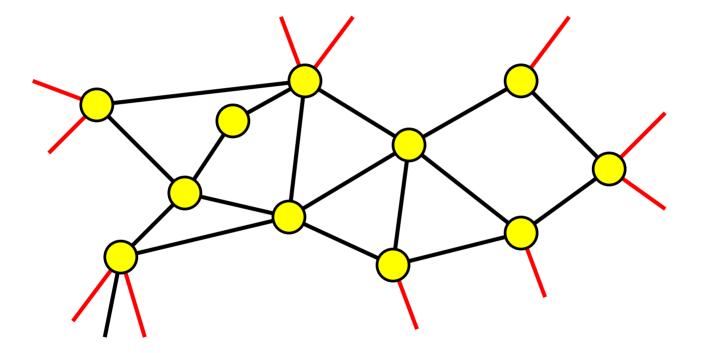
Data Availability - packet traces



Packet traces limited availability

- special equipment needed (O&M expensive even if box is cheap)
- lower speed interfaces (only recently OC48 available, no OC192)
- huge amount of data generated

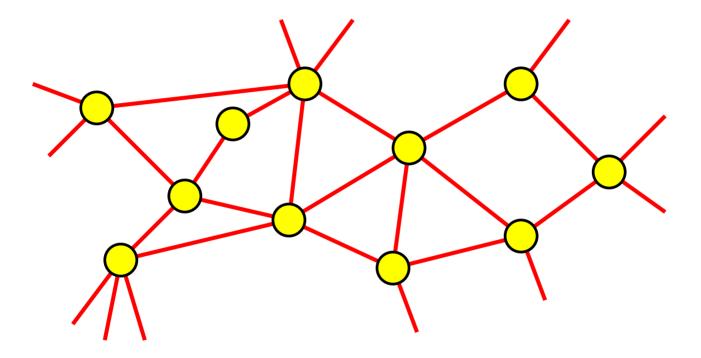
Data Availability - flow level data



Flow level data not available everywhere

- historically poor vendor support (from some vendors)
- large volume of data (1:100 compared to traffic)
- feature interaction/performance impact

Data Availability - SNMP



SNMP traffic data

- MIB II (including IfInOctets/IfOutOctets) is available almost everywhere
- manageable volume of data
- no significant impact on router performance

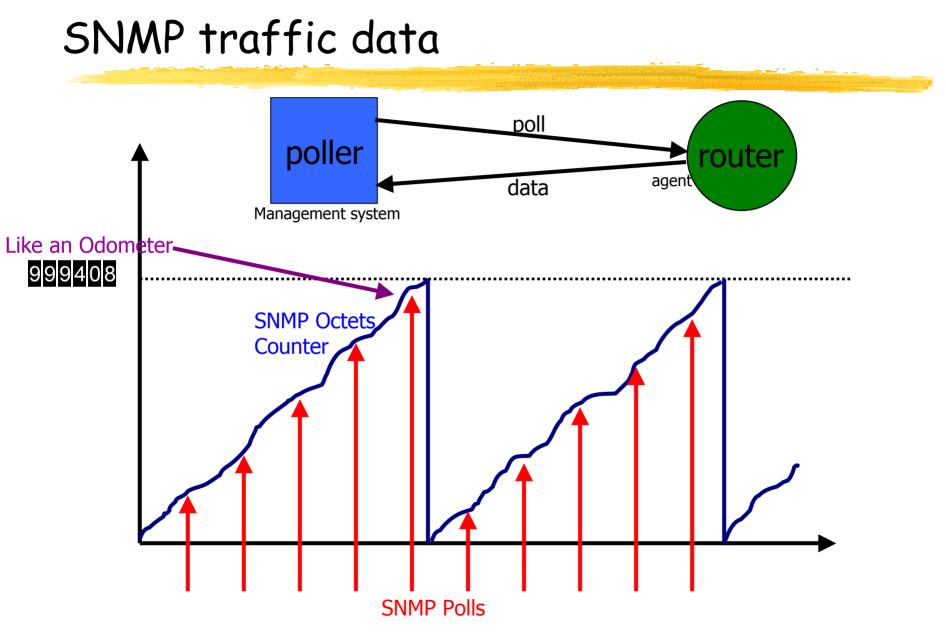
SNMP

Advantages (MIB-II: IfInOctets/IfOutOctets)

- Simple, Easy, available anywhere that supports SNMP
- Relatively low volume
- It is used by operations already (lots of historical data)

Disadvantages

- Data quality
 - Ambiguous
 - Missing data
 - Irregular sampling
- Octets counters only tell you link utilizations
 - Hard to get a traffic matrix
 - Can't tell what type of traffic
 - Can't easily detect DoS, or other unusual events
- Coarse time scale (>1 minute typically)
 - Lack of well tested relationship between coarse time-scale averages and performance (hence active perf. measurement) AT&T Labs - Research



Irregularly sampled data

- Why?
 - Missing data (transport over UDP, often in-band)
 - Delays in polling (jitter)
 - Poller sync
 - Multiple pollers
 - Staggered polls -
- Why care?
 - Time series analysis
 - Comparisons between links
 - Did traffic shed from link A go to link B
 - Calculation of traffic matrices
 - Totals (e.g. total traffic to Peer X)
 - Correlation to other data sources
 - Did event BGP route change at time T effects links A,B,C,...

Applications

Capacity planning

- Network at the moment is "hand-crafted"
- Want to automate processes
- Provisioning for failure scenarios requires adding loads

Traffic engineering

- Even if done by hand, you need to see results
- BGP

Event detection

- Operations are "fire-fighters"
- Don't care about events if they go away
- Don't see patterns

Business cases

Help sales and marketing make cases

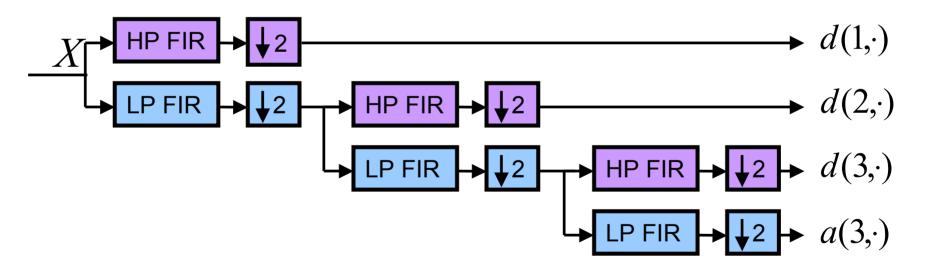


Part II: Wavelet Analysis

- Multi-scale
- Multi-resolution

Discrete Wavelet Transform

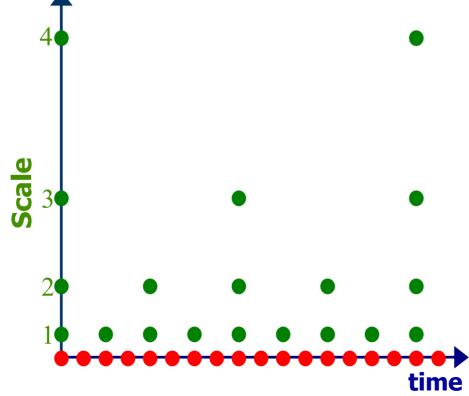
- Replace sinusoidal basis functions of FFT with wavelet basis functions
 - Implementation in pyramidal filter banks





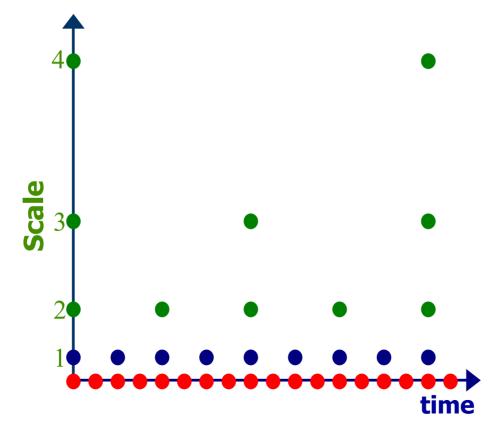
no redundancy, no loss of information

Each frequency/scale examined at a resolution matched to its scale



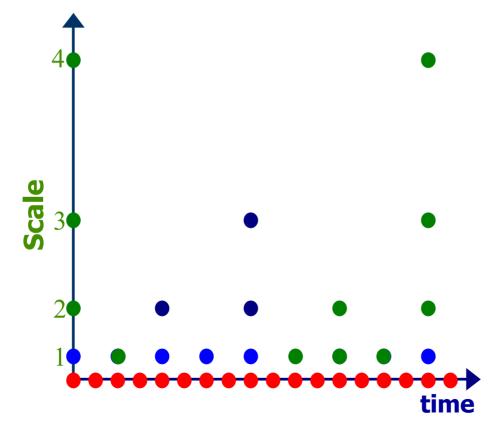
Dyadic grid: smoothing

Zero the fine scale details and reconstruct



Dyadic grid: compression

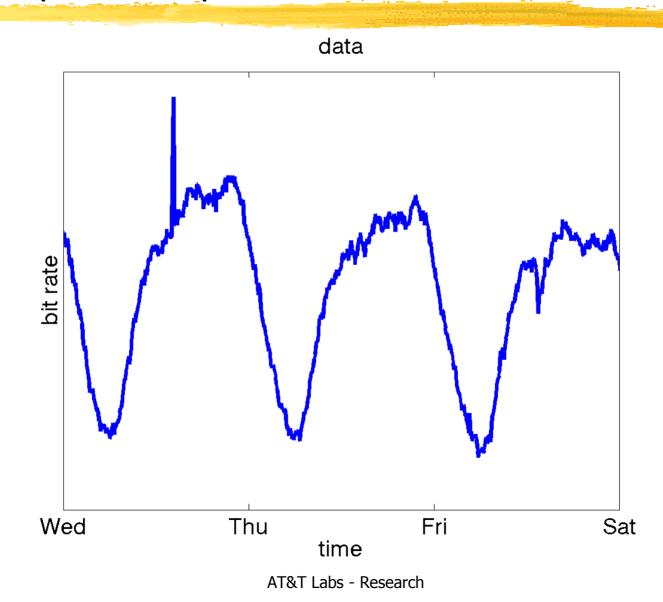
Keep the coefficients above some threshold



What can you do with wavelets

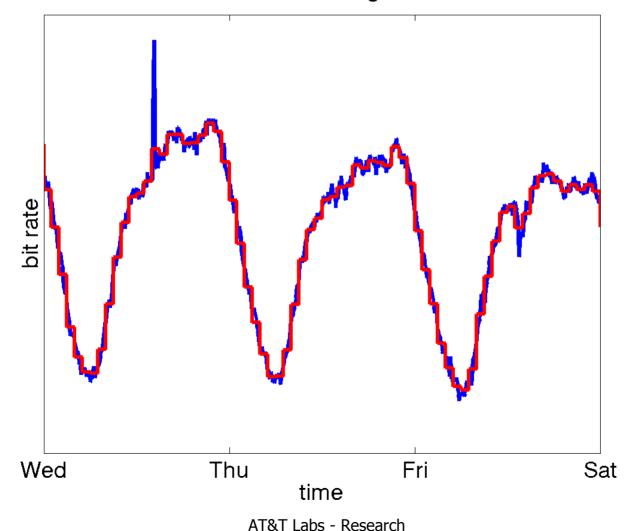
- Compression
- Smoothing/interpolation
- Anomaly detection/identification
 - DoS
 - Flash crowds
- Multiple dimensional analysis of data
- LRD/self-similarity analysis

Example: compression



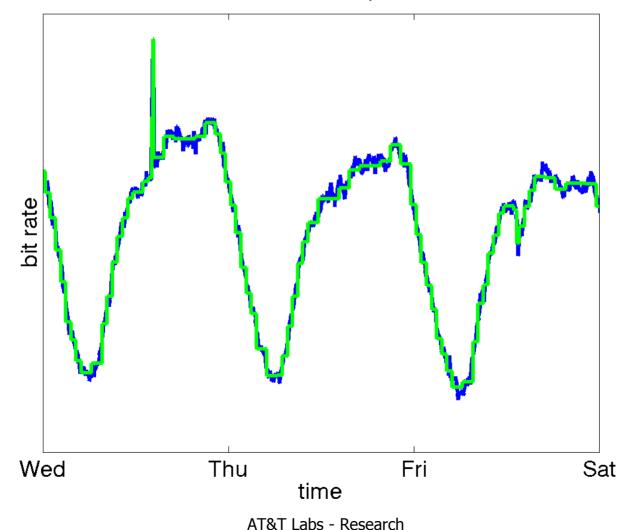
Example: compression (by averaging)

1 hour averages



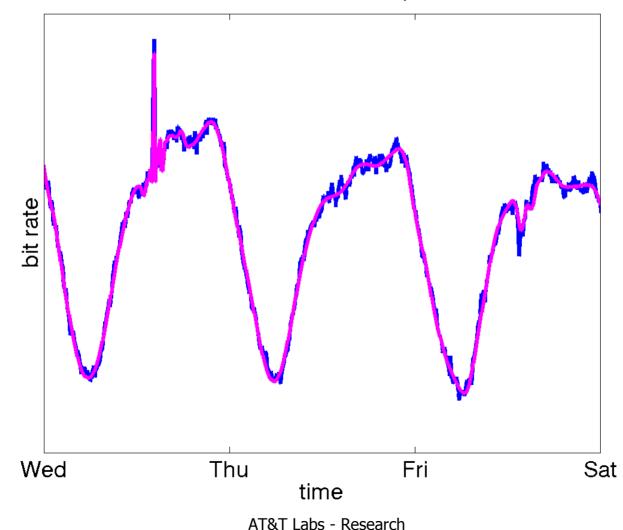
Example: compression (Haar)

Haar wavelet compression



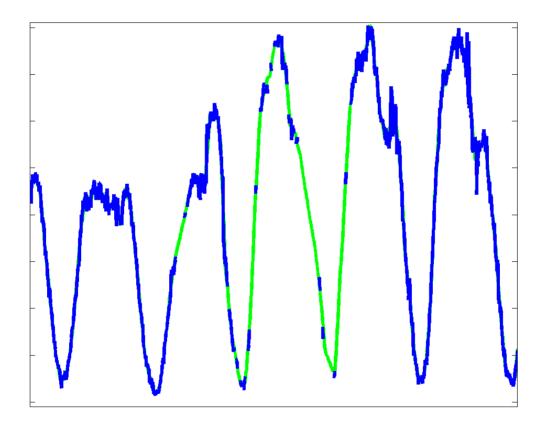
Example: compression (Daubechie's)

Daubechie's wavlet compression



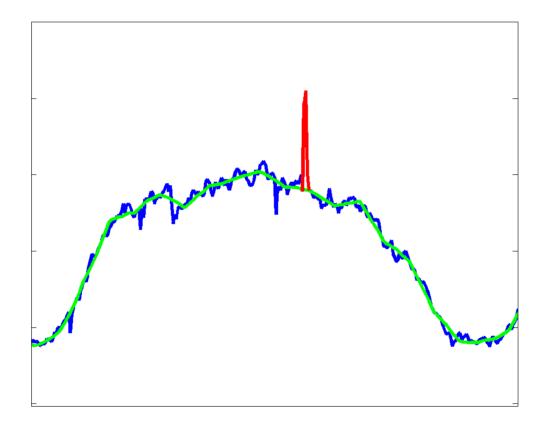
Example: interpolation

Wavelet based



Example: anomaly detection

Wavelet based



Wavelets, wavelets everywhere and not a ...

Parameter tuning

- How do know it will work next time?
- Scale of dyadic grid doesn't match patterns in data
 - 5 minute measurements
 - 24 hour cycle, 7 day cycle
 - But dyadic grid is in powers of 2
 - CWT looses many of the advantages of DWT

Example

- Compression
- Look for parameters/wavelet that don't loose important data
- What is the important data?
- If we had a model it could tell us what is important
 - Compress => estimate model parameters => test difference

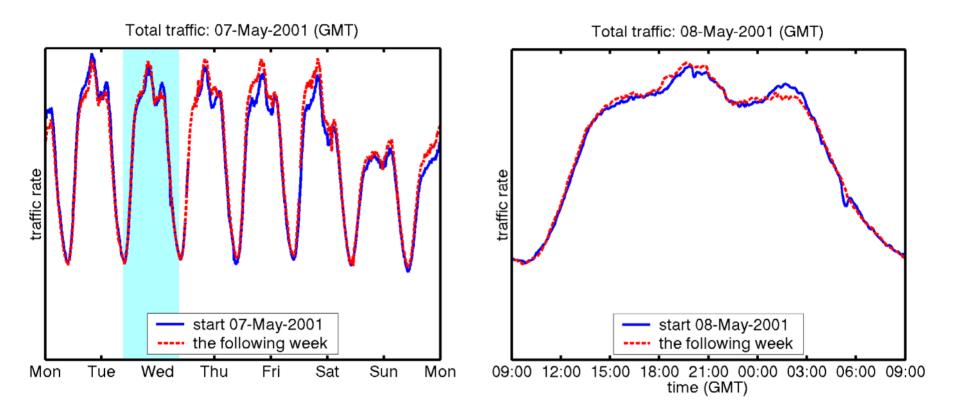


Part III: Modeling

Putting together theory from

- Time series analysis
- Traffic theory
- To SNMP data
 - In particular for backbone traffic

Total traffic into a city for 2 weeks



Model

Traffic data has several components

- Trend,
 - Long term changes in traffic
 - Seasonal (periodic) component,
 - Daily and weekly cycles
- Stationary stochastic component,
 - Normal variation
 - Transient anomalies,

DoS, Flash crowds, Rerouting (BGP, link failures)

 T_{t}

S₊

W₊

I+

many ways you could combine these components

standard time series analysis

- Sum $X_{+} = T_{+} + S_{+} + W_{+} + I_{+}$
- Product $X_{+} = T_{+}S_{+}W_{+}I_{+}$
- Box-Cox transform

A Simple Model (for backbone traffic)

- Based on Norros model
- Non-stationary mean
- Stochastic component unspecified (for the moment)

$$x_{t} = m_{t} + \sqrt{am_{t}} W_{t} + I_{t}$$
$$m_{t} = T_{t}S_{t}$$



Behaves as expected under multiplexing

$$x = \sum_{i} x_{i}$$
$$m = \sum_{i}^{i} m_{i}$$
$$a = \frac{\sum_{i}^{i} m_{i} a_{i}}{\sum_{i} m_{i}}$$

- Good model for backbone traffic
 - Lots of multiplexing
- Simple, estimable parameters, flexible, can make predictions, data supports it

What does a model get you?

Decomposition

- MA for trend (window > period of seasonal component)
- SMA for seasonal component (average at same time of day/week)
- Several methods for segmenting I_t

Interpolation

- Linear, or wavelet based for short gaps (<3 hours)</p>
- Model based for long gaps (>3 hours)

Understanding of the effect of multiplexing

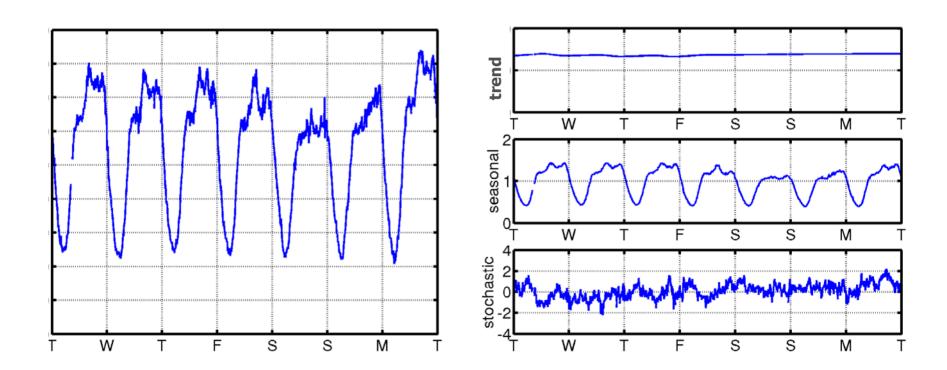
- Should be understood
 - People still seem to misunderstand
- How smooth is backbone traffic (is it LRD)

Capacity planning

Example: decomposition

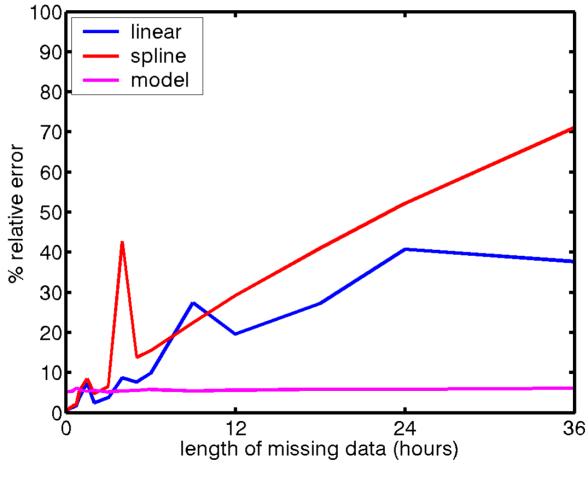
Data

=> Decomposition



Example: interpolation

Model based vs linear



AT&T Labs - Research

Conclusion

SNMP is a good data source

- Available everywhere
- You need to do some work to extract useful data
- There is still more info. to get (packet traces, flow data, ...)
- Wavelets are a flexible tool for extracting info
 - Not always obvious how to set parameters
- Traffic model gives you a little more
 - A framework for other algorithms
 - A way to decide what information is important
 - A way of seeing how smooth traffic really is
 - Effect of multiplexing

Algorithms are applicable to other traffic data