# Parameterisation of multi-map from Internet traffic traces

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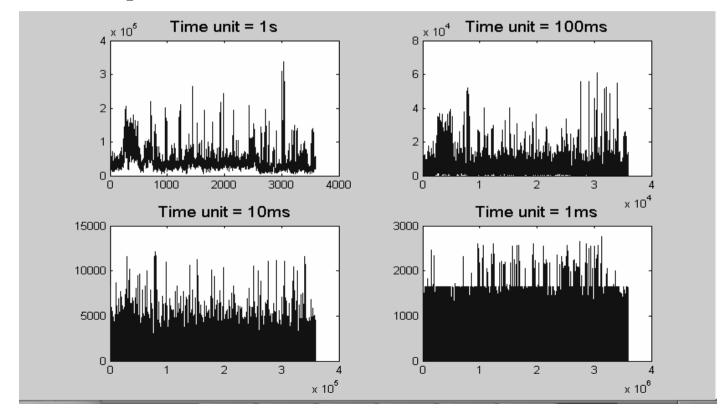


#### **Presentation Overview**

- Observation of Internet traffic analysis
  - Observed scalings
- Multi-map as a traffic model
  - Structures and equations
  - Parameters of the map
- Trace based parameterisation of the multi-map
  - step by step analysis
- Comparison of real versus synthetic traffic analysis
  - \* R/S scaling comparison, load and variance analysis
- Future directions
  - More trace analysis
  - Model use in network analysis

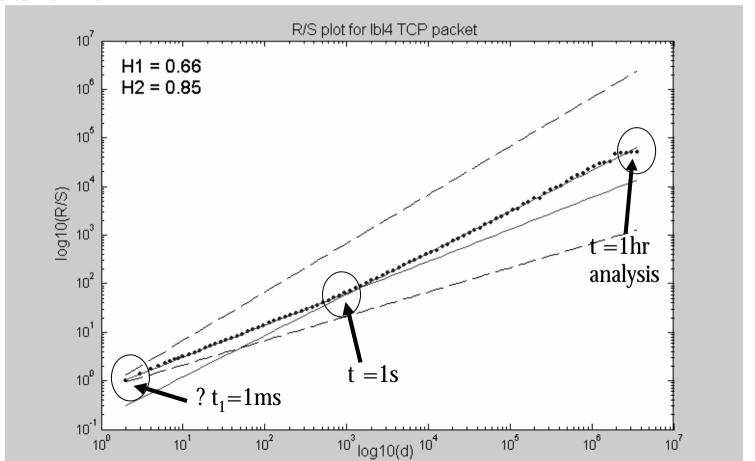
### Traffic trace analysis

- ❖ TCP traffic traces from WAN at Berkeley Labs
  - ❖ An hourly trace (lbl-4)
  - ❖ 1.3 million packets in the trace

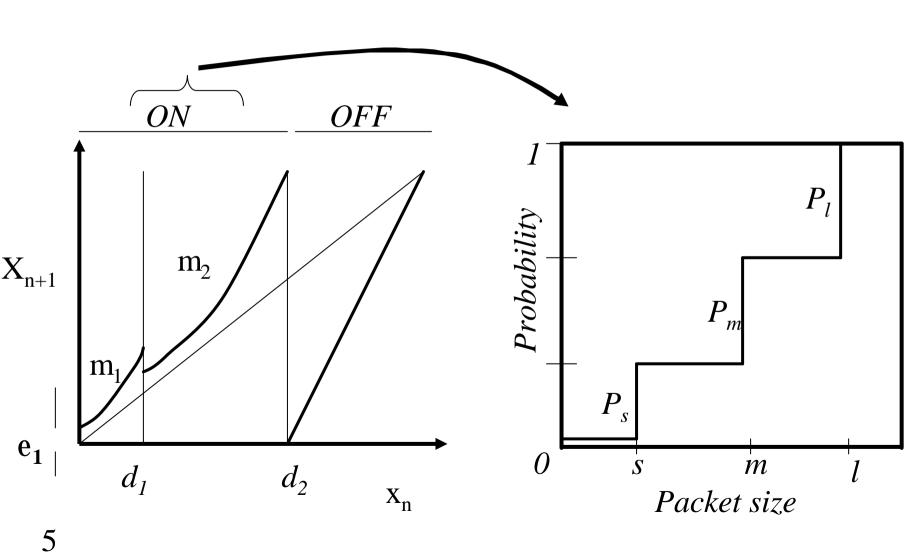


### Scaling of traffic traces

- ❖ R/S analysis showed two scaling ranges
  - ❖ Two Hurst parameters with cross over point at around 1s



#### Structure of multi-map model



### **Equations of multi-map**

Hidden dynamical layer

$$X_{n+1} = F(X_n) = \begin{cases} F_1(x_n) &= e_1 + x_n + \frac{1 - e_1 - d_2}{d_2^{m_1}} x_n^{m_1} & 0 < x_n < d_1 \\ F_2(x_n) &= e_2 + x_n + \frac{1 - e_2 - d_2}{d_2^{m_2}} x_n^{m_2} & d_1 \le x_n < d_2 \\ F_3(x_n) &= x_n - d_2 \frac{1 - x_n}{1 - d_2} & d_2 \le x_n < 1 \end{cases}$$

• where parameters 
$$x_n \in (0,1)$$
  $m_i \in (1,2)$   $d_i \in (0,1)$ 

Visible dynamical layer

$$y(x_n) = \begin{cases} 1 & 0 < x_n < d_2, \\ 0 & d_2 \le x_n < 1, \end{cases}$$

$$ON (packet)$$

$$OFF (no packet)$$

#### Parameterisation of the multi-map

- Packet size distribution analysis
  - \* Packet sizes s, m, l, & corresponding  $P_s$ ,  $P_m$ ,  $P_1$

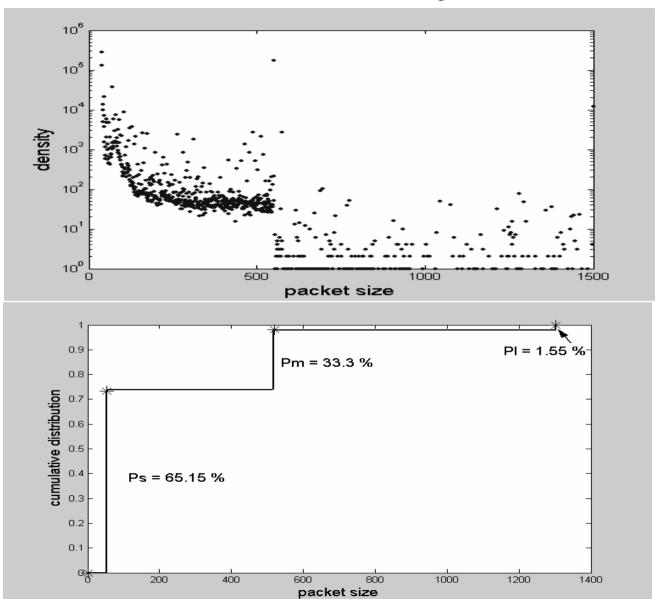
- Time scale and load analysis
  - $* d_2, ? t_2$

- Multi scaling analysis
  - $* m_1, m_2, e, d_1$

### Distribution analysis

- ❖ Packet size analysis based on Imix Internet packet mixture [Journal of Internet test]
  - ❖ Result of 342 million packet analysis at NLANR
  - ❖ Accurate correlation when compared to realistic Internet traffic
  - Tri-modal distribution analysis from traces
  - Output three mean packet sizes and their distribution
    - Small, medium and large sizes and respective probabilities

## Distribution analysis (contd.)

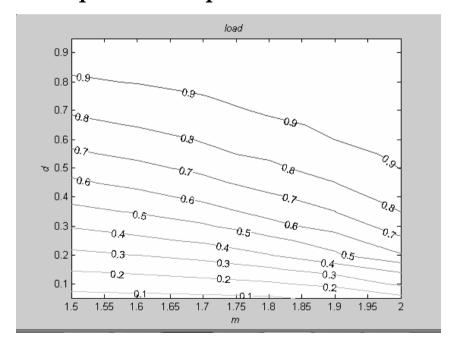


### Time scale and load analysis

- ❖ Variance and load calculated for each trace with regards to? t₁
  - \* smallest time scale unit the trace analysed at
- Respective analysis of iteration time
  - ?  $t_2 = P_1/C$ 
    - ❖ where P₁ is max packet size and C is link rate
  - $\bullet$  Hence one iteration corresponds to ?  $t_2$
- Scaling comparison achieved with equal time units

## 1 ime scale and load analysis – parameter $d_2$

- \* Proportion of time increments that have a packet and hence the load, relates to parameter  $d_2$
- ❖ Equivalence to single intermittency map in its structure
  - ❖ Based on look up table of parameters d, m and load



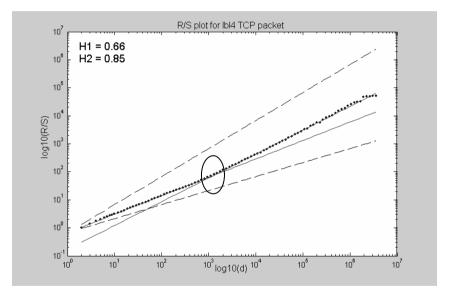
• Output – parameter  $d_2$  for specific load and  $m_2$ 

# Time scale and load analysis – constraints on parameter $d_2$

- \* Constraints on  $d_2$  [Samuel] leads to changes in parameters
  - If  $d_2$  lies outside regions 0.1 to 0.9
    - ❖ H value is lower than expected
    - $\bullet$  Hence keep  $d_2$  within the region
    - ❖ Results in changes in proportion of time increments that have a packet
    - $\star$  Leads to change in ?  $t_2$  iteration time unit

### Multi scaling analysis – H test

- Hurst parameter using R/S analysis
  - Advantage of showing distinctive scaling regions



- Output two H values with cross over point
  - $\bullet H_1, H_2, t = n_{t^*}?t_1$

# Multi scaling analysis – Parameters $m_1$ and $m_2$

- \* The *m* parameters are directly linked to the Hurst parameters [Mondragon]
- ❖ Equation of *m* from *H* parameters

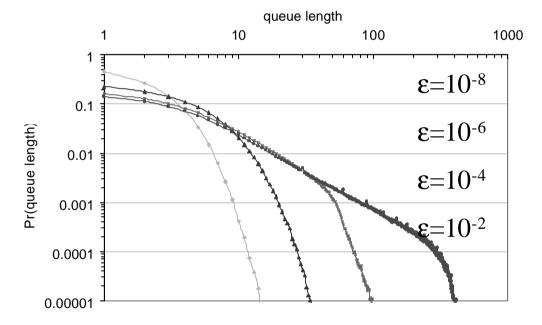
$$H = \left(\frac{3m - 4}{2m - 2}\right)$$

$$\Rightarrow m = \left(\frac{4 - 2H}{3 - 2H}\right)$$

• Output  $m_1$  and  $m_2$ 

#### Multi scaling analysis – Parameter e

- e parameter allows effective control of LRD
  - cut-off point in case of single intermittency map
  - Queue analysis result



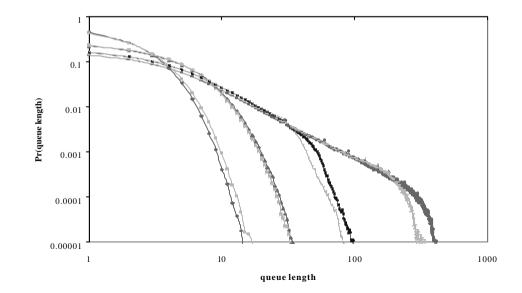
❖ Output e versus cross-over point

#### Multi scaling analysis – Parameter $d_1$

 $\diamond$  Parameter  $d_1$ 

$$d_{\scriptscriptstyle 1} = d_{\scriptscriptstyle 2} \left( \frac{\mathbf{e}}{1 - d_{\scriptscriptstyle 2}} \right)^{\frac{1}{m_{\scriptscriptstyle 2}}}$$

- Controls the cross over point
- Equivalence achieved with single intermittency map



#### Parameter value results -lbl4

- Packet size distribution analysis
  - ❖ Packet sizes -s = 45 bytes, m = 520 bytes, l = 1451 bytes,
  - $P_s = 0.6515, P_m = 0.333, P_1 = 0.0155$
- Time scale and load analysis
  - d2 = 0.1, ?  $t_2 = 500 \mu s$
- Multi scaling analysis
  - $\bullet$   $m_1 = 1.8$ ,  $m_2 = 1.6$ ,  $e = 1*10^{-6}$ ,  $d_1 = 1.9*10^{-5}$

## Companson of real versus synthetic traffic

#### Mean load

- Trace Multi-map
  - ❖ 330 bit/s293 bits/s
  - **❖** 0.2397 pps 0.232 pps

#### Variance

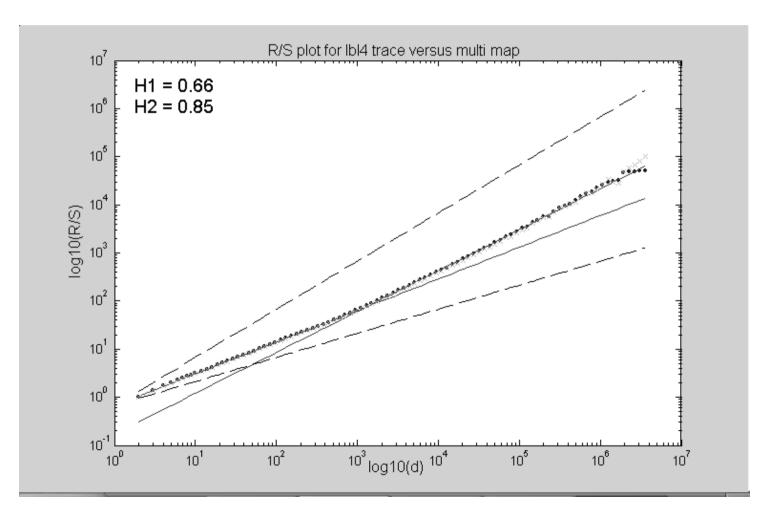
- Trace Multi-map
  - ❖ 167.8 bit/s

    137 bit/s
  - **♦** 0.527 pps 0.5 pps

#### H parameter

- Trace Multi-map
  - **❖** 0.66, 0.85 0.65, 0.82

# Comparison of real versus synthetic traffic from multi map



#### **Future Directions**

- More trace analysis
  - York trace
- Use of traces in network analysis
  - Advantages of multi-map
    - ❖ Parsimonious, effective parameterisation, fast
  - Multi service complex traffic scenarios
    - ❖ Traffic generation for different classes of traffic
    - ❖ Performance analysis