



# Networking with Revd Bayes

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# Introduction

- $P(H|D) = P(H)P(D|H) / P(D)$
- H the Hypothesis
- $P(H)$  – the “Prior” probability
- Observe data D

Hypothesis “Bayes is dead”

- $P(H)$  .9 from this picture




*Marconi*

# Make an observation



# Conclusion

- $P(D|H)$ , say .5
- $P(D|H')$ , say .01
- $P(D)$  hence .451

Bayes	Clear	<input checked="" type="radio"/> Probability	<input type="radio"/> Odds	
$P(H)=$		<input type="text" value=".9"/>	$\Omega_0=$	<input type="text" value="9.000000000"/>
$P(D H)=$		<input type="text" value=".50"/>	LR=	<input type="text" value="50"/>
$P(D H')=$		<input type="text" value=".01"/>		
Compute $P(H D)$		<input type="text" value="0.997782705"/>	$\Omega_1=$	<input type="text" value="450.0000000"/>

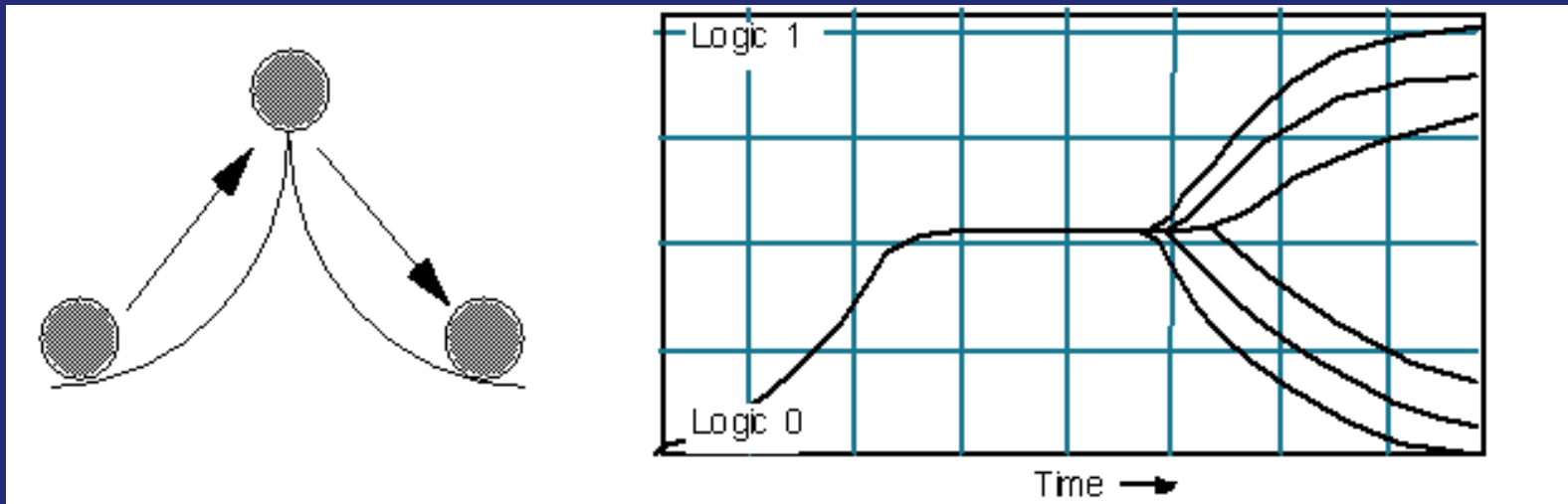
- Posterior  $P(H|D)$  is .99778..
- Conclusion “Bayes is almost certainly dead”

# Hardware fails

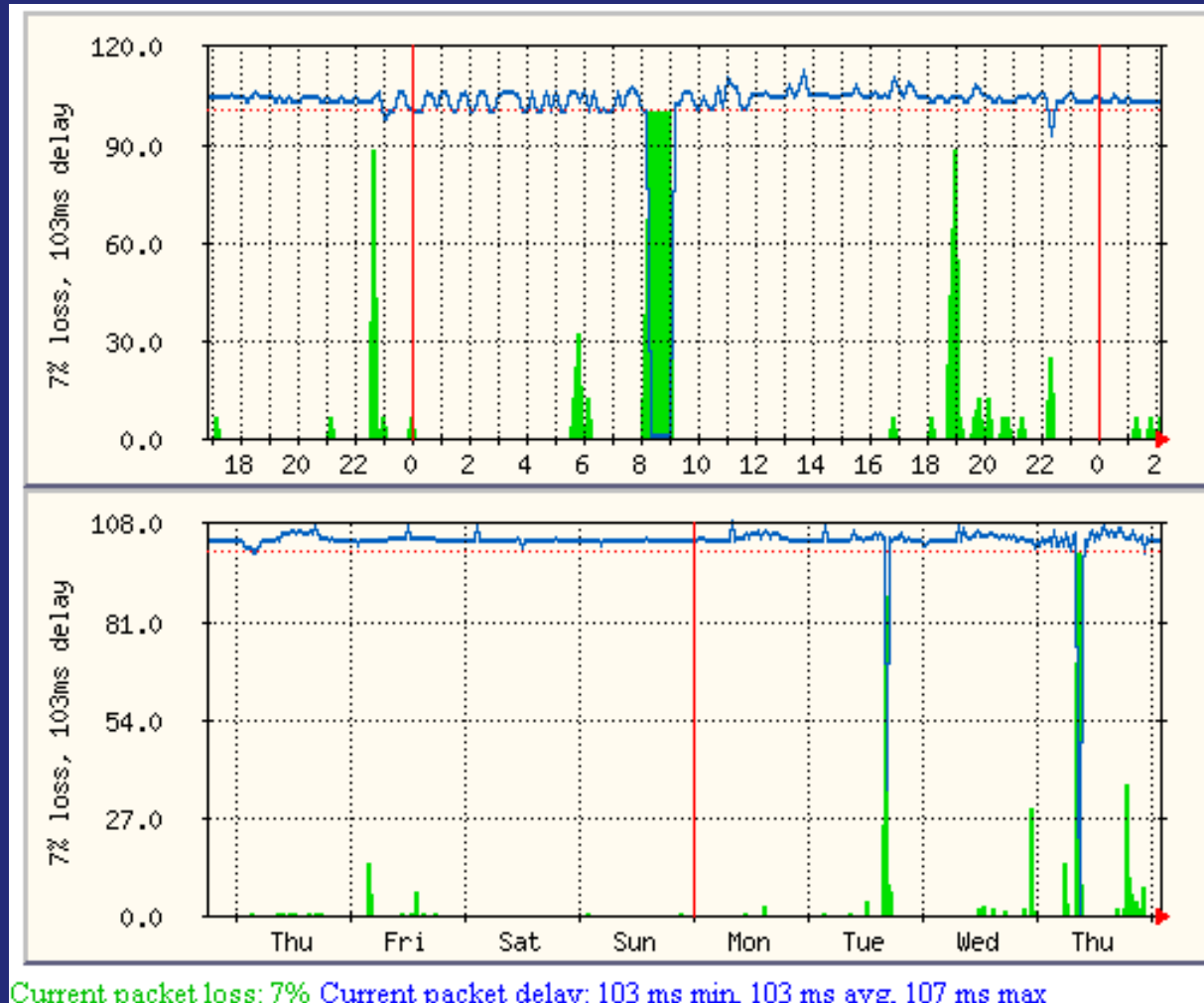
## ...a philosophical problem since 1328

**Buridan, Jean** (1300-1358), French Scholastic philosopher, who held a theory of [determinism](#), contending that the will must choose the greater good. Born in Bethune, Buridan was educated at the University of Paris, where he studied with the English Scholastic philosopher William of [Ockham](#). After his studies were completed, he was appointed professor of [philosophy](#), and later rector, at the same university. Buridan is traditionally, but probably incorrectly, associated with a philosophical dilemma of moral choice called "Buridan's ass." In the problem an [ass](#) starves to death between two equally alluring and equidistant bundles of hay because it has no rational basis for preferring one bundle over the other.

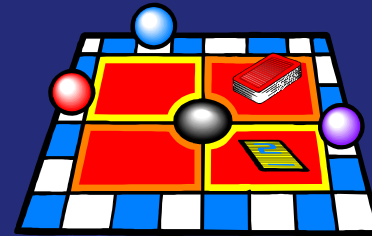
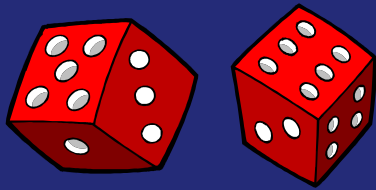
## It's not just bad engineering



# Networks drop packets



# Consider a well known game...

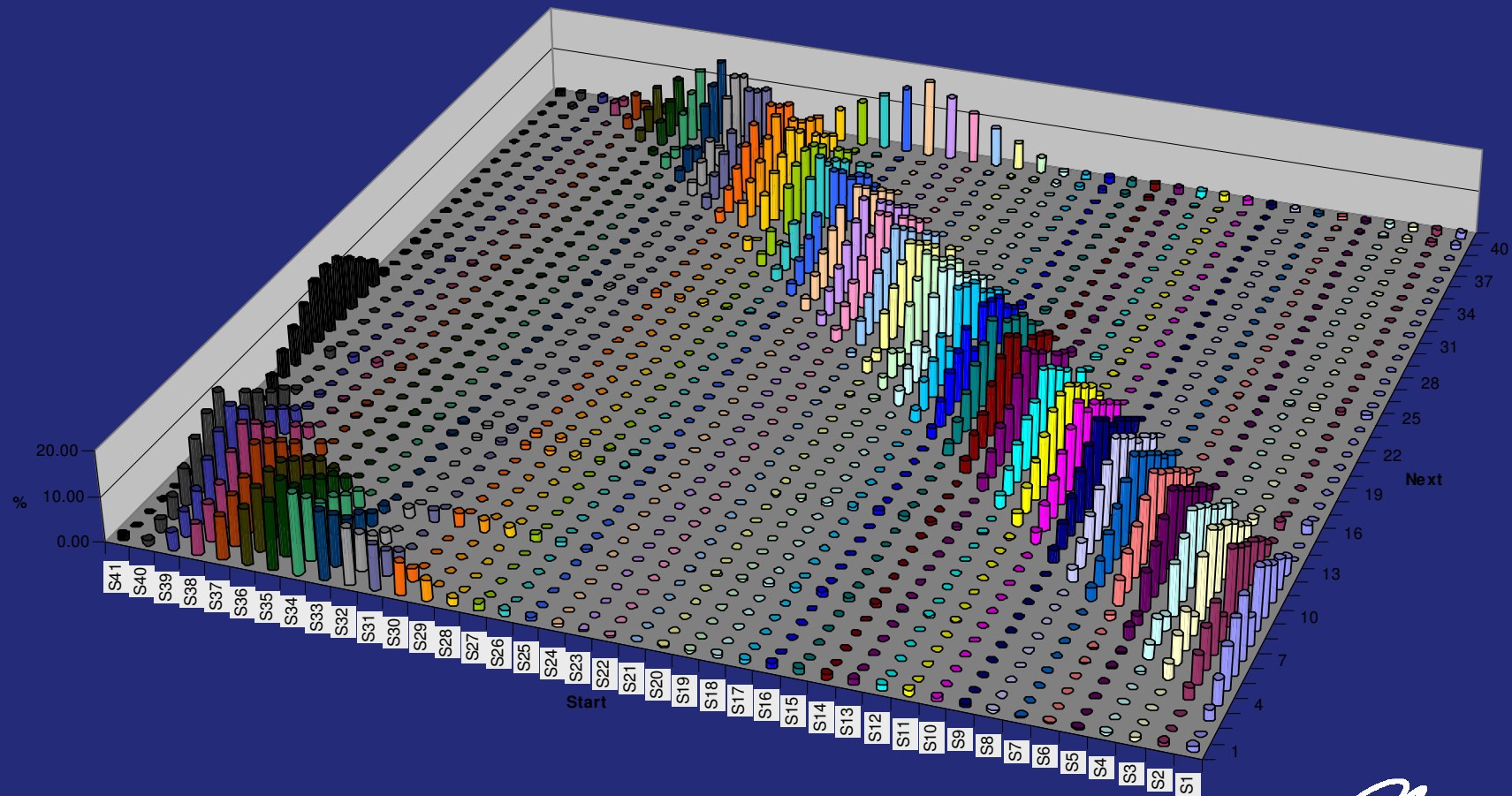


A board of 41 squares

Moves based on the roll of two dice

Some rules...

# Our Markov Matrix





# The Autonet Skeptic

Roddeheffer & Schroder, DEC SRC, 1991:

“The skeptic limits the failure rate of a link by delaying its recovery if it has a bad history.”

## Requirements:

- A link with a good history must be allowed to fail and recover several times without significant penalty.
- In the worst case, a link's average long-term failure rate must not be allowed to exceed some low rate.
- Common behaviors shown by bad links should result in exceedingly low average long-term failure rates.
- A link that stops being bad must eventually be forgiven its bad history.

# Why learning

## Our example had rules, but maybe:

- We don't know the rules
- We can't work out the rules
- There are too many rules
- The rules change (argh!!)

## Examples:

- Internet Router configurations
- Link failures
- System log files
- Napster

# Argh!!! The rules might change

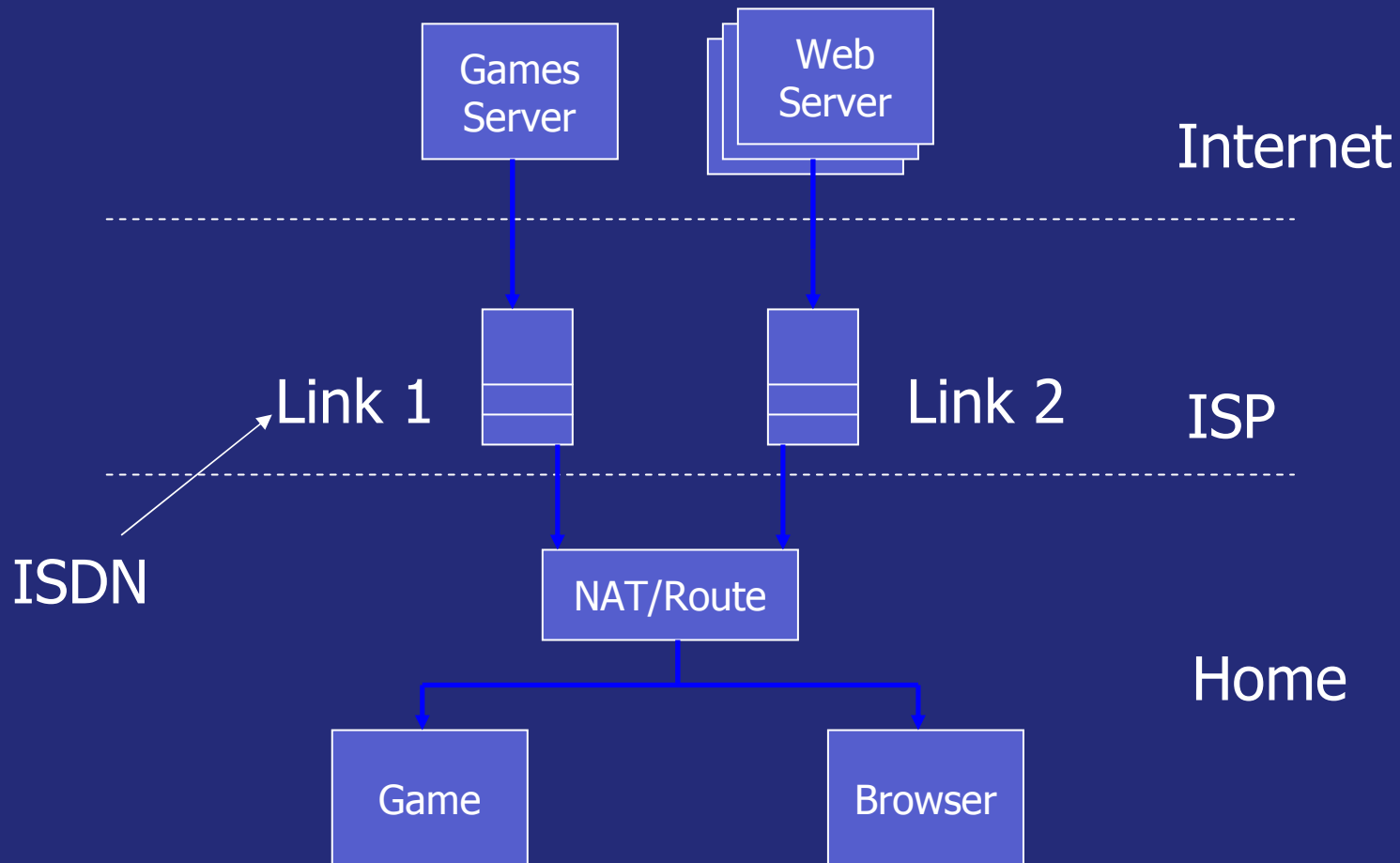
Machine learning is applied to lots of non-stationary data:

Ælfred kyning hāteð grētan Wærferð biscep his wordum  
luflice ond frēondlice; ond ðē cýðan hāte ðæt mē cōm  
swīðe oft on gemynd, hwelce wiotan iū wæron giond  
Angelcynn, ægðer ge godcundra hāda ge woruldundra;



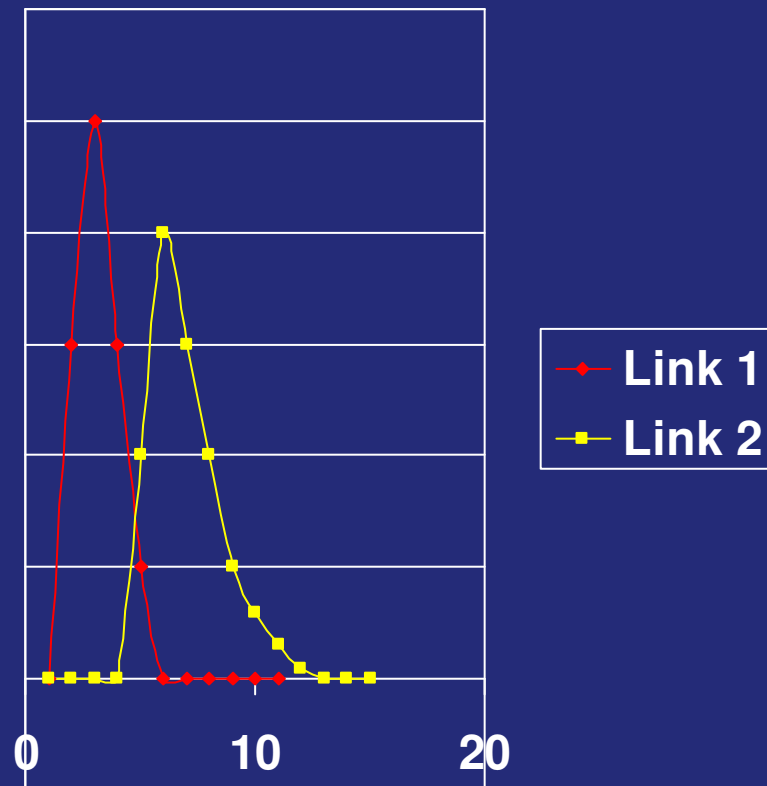
...it's all about timescales

# QoS the easy way



# RTTs and history

e.g.



Keeping history (like CM) needs some thought

E.g. Dynamic routing

- Might need clustering of RTT history before use
- Change estimation algorithm to depend on RTT classification

# Link reliability

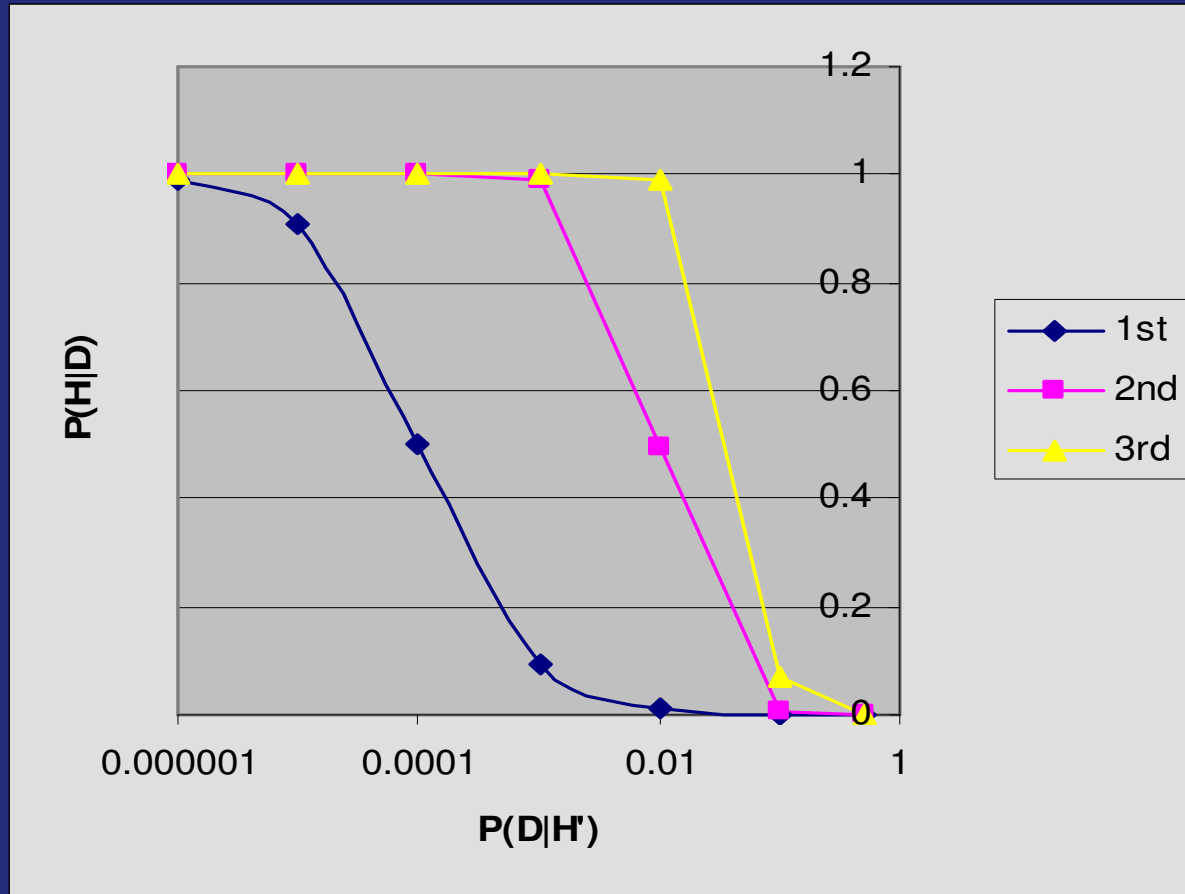
## Say we set out to measure link reliability

- Track up/down events and link BER
- Might try to allocate to “classes” based on “type”
- Or ... might try to learn “classes”
  - Might find a T1 link from vendor A and vendor B differ radically
  - After all, OS TCP implementations do!

# Silly routing example

- Now presume for a class of links we have a measured reliability of “4 nines” – in any given 30 second interval there is a 99.99% chance the link works OK.
  - Prior  $P(H) = 0.0001$
- When we receive a LSA down what should we do?
  - What is  $P(H|D)$ ?
- Understanding that “pathologies” exist in some BGP implementations:
  - Erroneous LSA down/up pair due to transient or load
  - Bad software (never surely!)
  - Operational issues
  - Investigate influence of  $P(D|H')$ ....

# Two (or three) eyes are better than one!



Confidence after 1, 2 and 3 LSA (independent) down messages.



# Enough Bayes already

**Marconi Labs, Cambridge; objective:**

**“Enhance technological competence and competitiveness of Marconi”**

- through world-class research in communications and internet technology
- sponsorship of appropriate research within Univ of Cambridge and partner universities,
- vigorous technology *transfer*.

# Hot Topics

## Optical switching and routing

- Electronic/Optical trade-offs

## Network Management

- What does it take to manage a lump of glass

## Network Modelling

- Lots of measurements

## Machine Learning applied to networks

- Factor uncertainty into decision processes

# University Projects

## In place

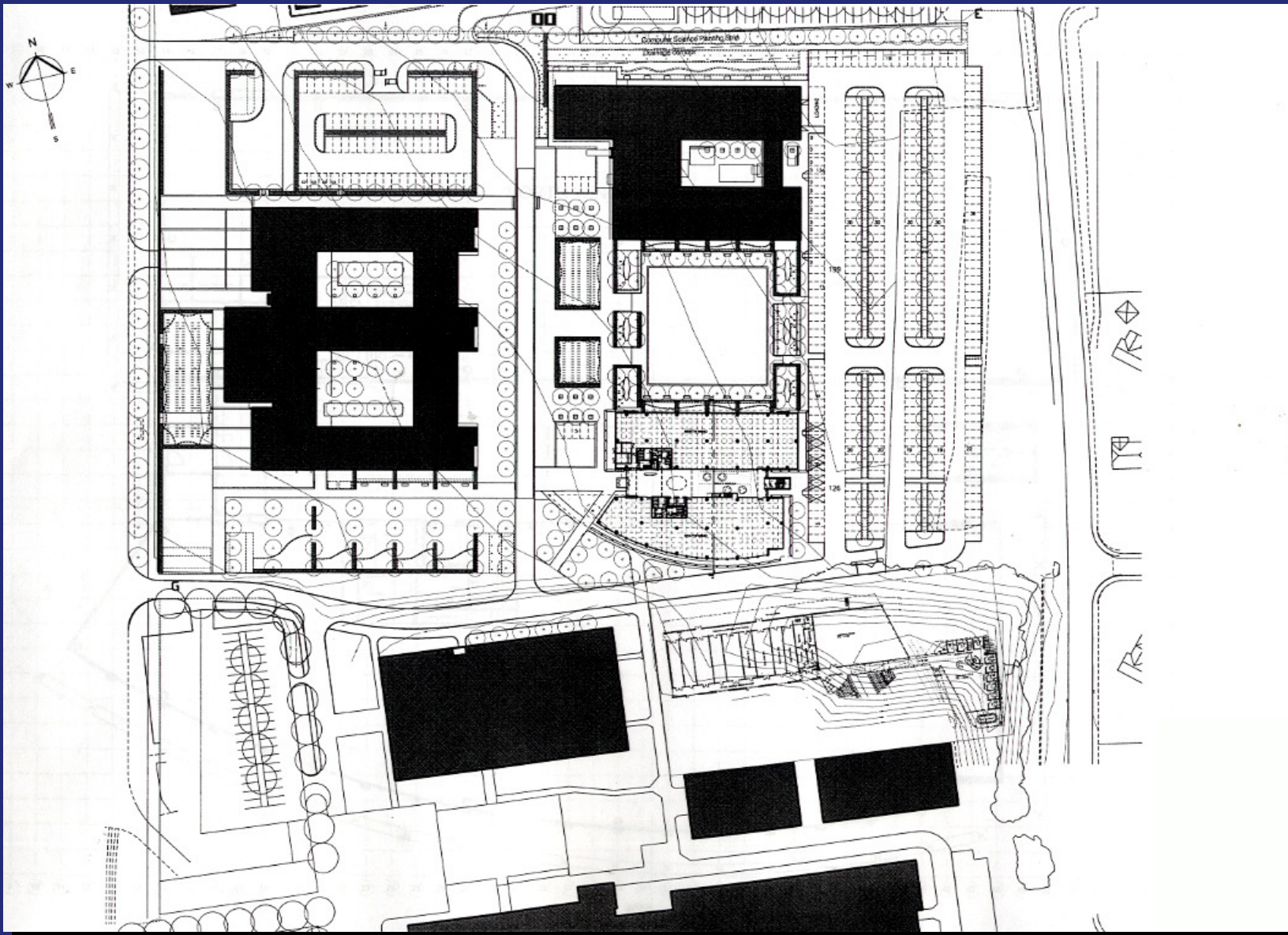
- 3 PhD students Security architecture
- Optical topology design
- BGP / ECN / Congestion pricing
- GaN properties

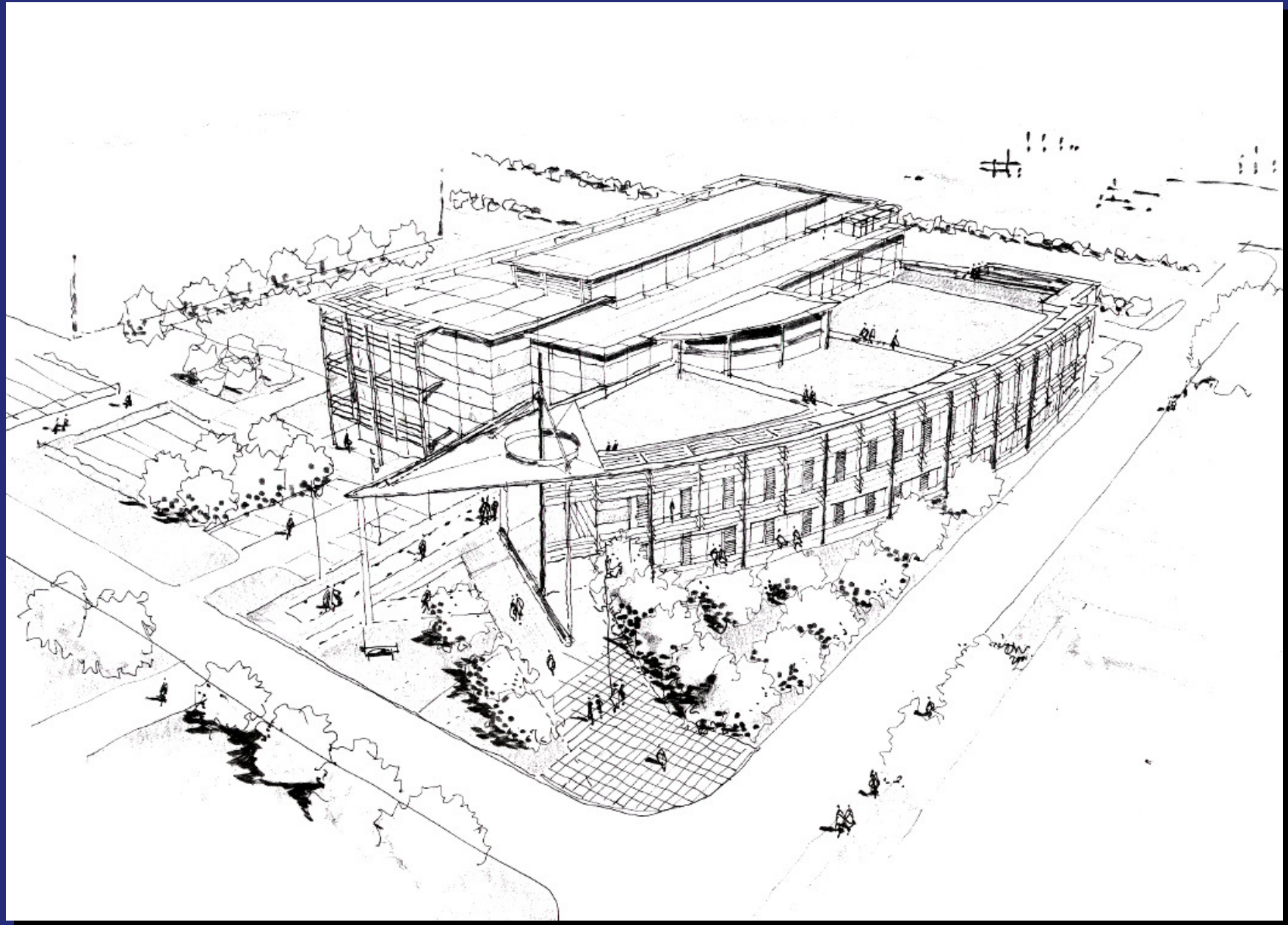
## Coming Soon

- 4 more PhDs
- Async clocking
- Optical packet node
- ...and a professor 😊 or 😊 😊

# Cambridge from the air







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