

# A Domain Theoretic Foundation for ProbNetKAT

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ProbNetKAT?

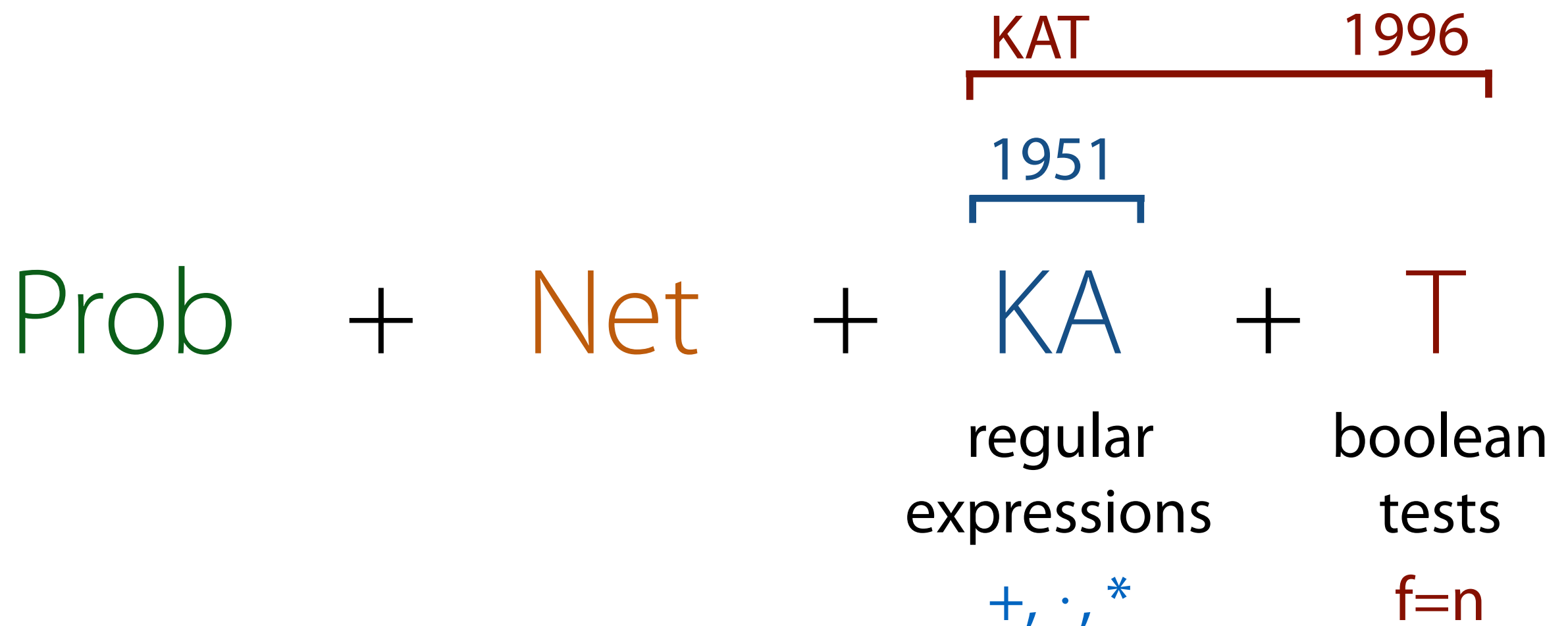
A language for **modeling & reasoning** about  
networks **probabilistically**.

Prob + Net + KA + T

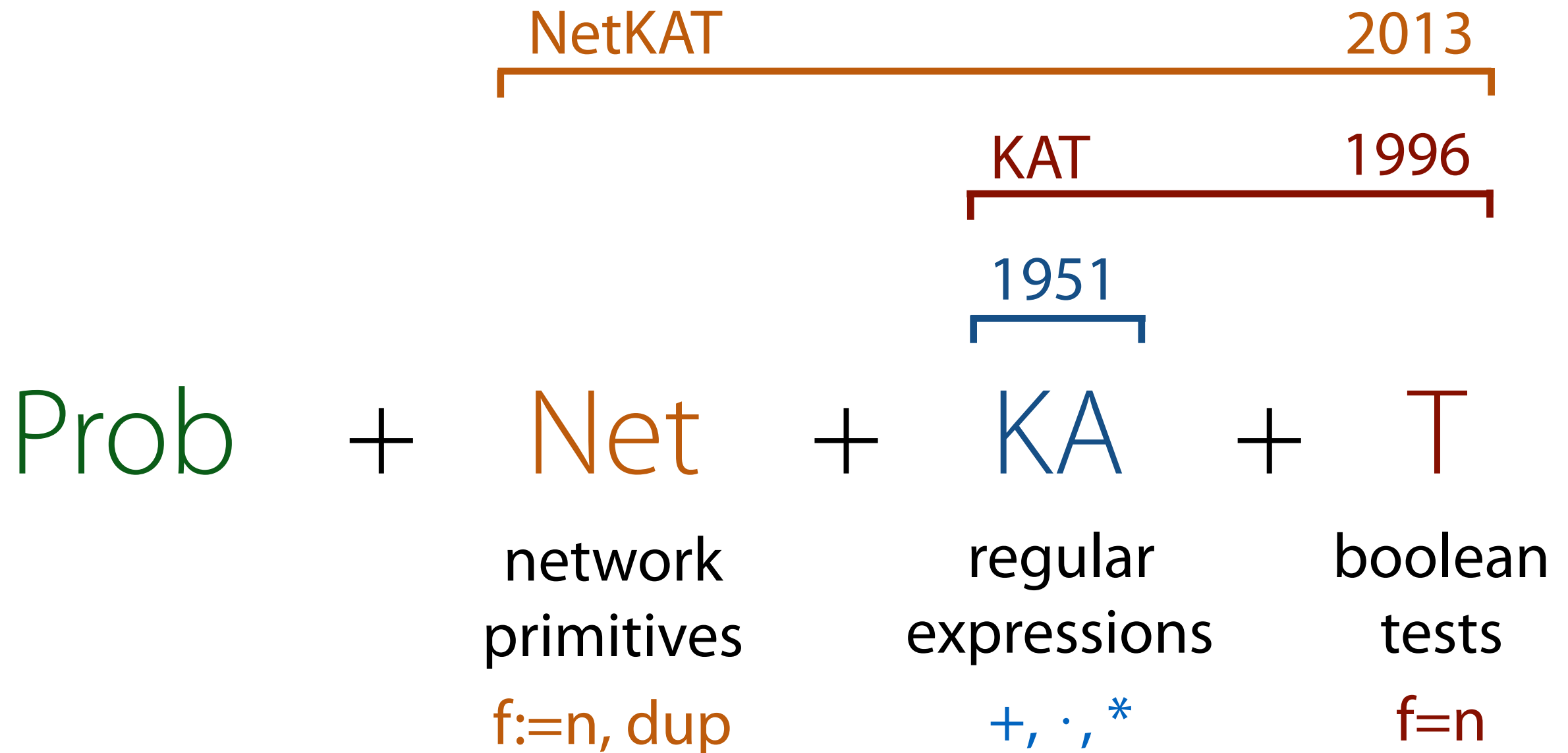
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Prob + Net + <sup>1951</sup>KA + T  
regular expressions  
+, ·, \*

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ProbNetKAT

2016

NetKAT

2013

KAT

1996

1951

Prob

+

Net

+

KA

+

T

probabilistic  
primitives

$p \oplus_r q$

network  
primitives

$f:=n, \text{dup}$

regular  
expressions

$+, \cdot, *$

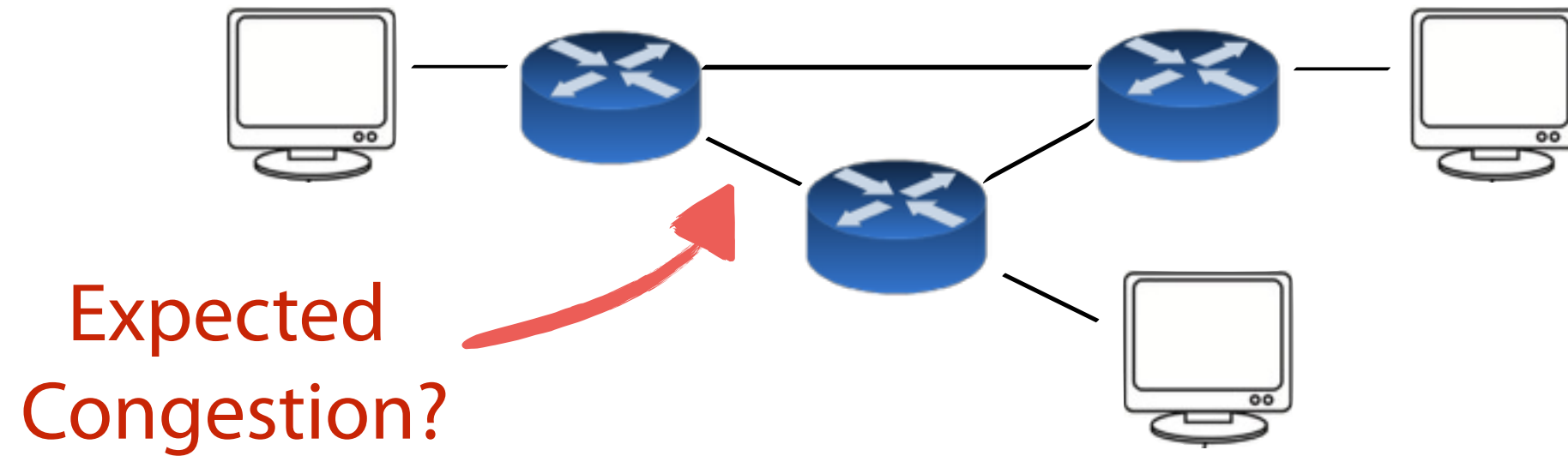
boolean  
tests

$f=n$

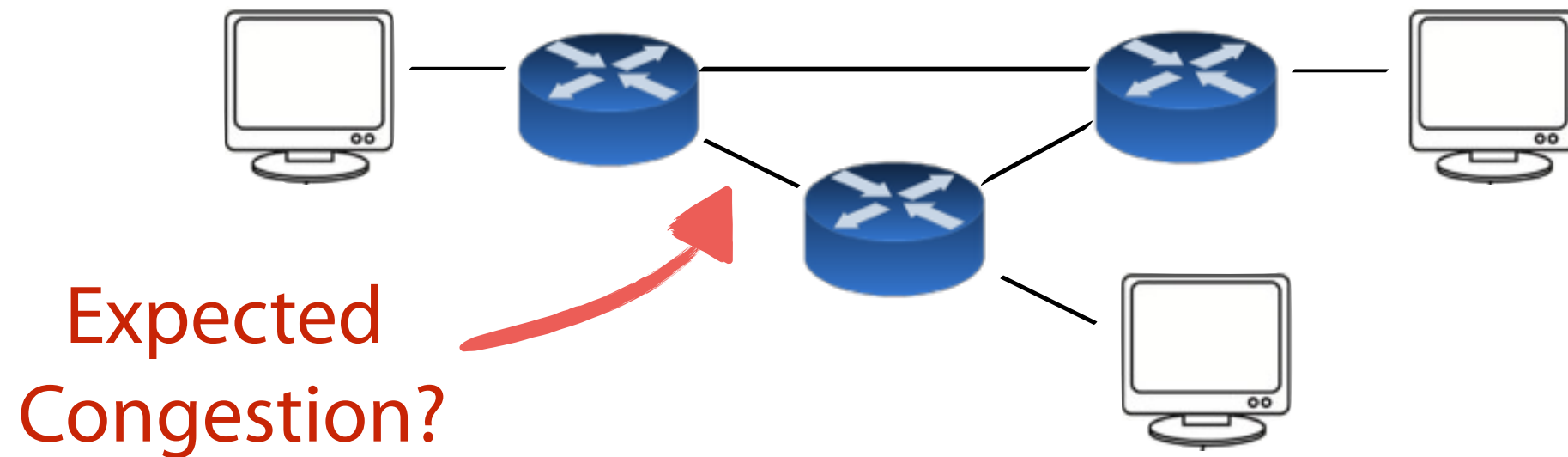
# ProbNetKAT in Action



# Randomized Routing

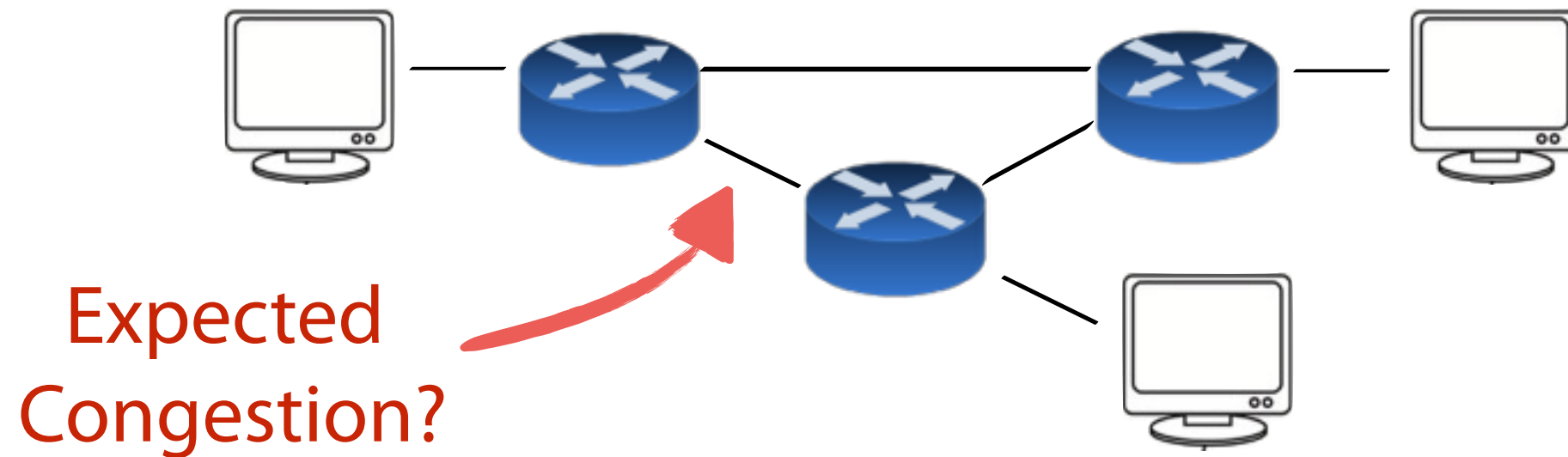


# Randomized Routing



ProbNetKAT model  $\mathbf{p}$ , input distribution  $\boldsymbol{\mu}$   
→ output distribution  $\mathbf{v} = \boldsymbol{\mu} \gg \llbracket \mathbf{p} \rrbracket \in \text{Dist}(2^H)$

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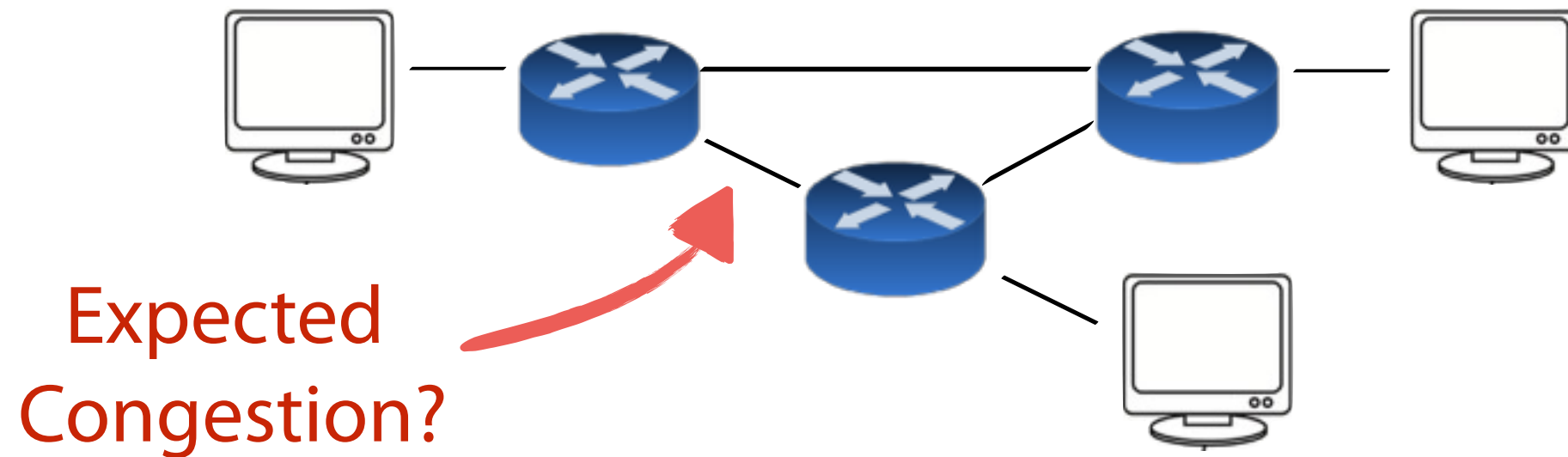


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Congestion Query: Random Variable  $\mathbf{Q} : 2^H \rightarrow [0, \infty]$

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Expected Congestion:  $E_{\mathbf{v}}[\mathbf{Q}]$

# Computation???

$$E_{\nu}[Q] = \int Q \, d\nu$$

Lebesgue  
Integral



continuous  
distribution



A solution, based on Domain Theory

We can define a partial order  $\mu \sqsubseteq \nu$  such that:

1. For any  $\mu \in \text{Dist}(2^H)$ , there exist **finite distributions**  $\mu_1 \sqsubseteq \mu_2 \sqsubseteq \mu_3 \sqsubseteq \dots$  such that  $\mu = \bigsqcup \mu_i$  [Saheb-Djahromi]

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 **just a sum!**



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→ implemented in OCaml in ~300 LOC

Thank you!

More on this soon....