

# Motivation

Stochastic processing networks: Design simple & efficient scheduling policies

Consider simplest set-up: Jackson-like queueing network

Back-pressure is maximally stable

Delay can be really bad

Fixes within frame-work exist

*Can we approach design differently?*

## Details

- Discrete-time queueing network
- Set of  $N$  queues
- $F$  is the set of flows: source  $s(f)$  & destination  $d(f)$  for flow  $f \in F$
- $Q_n^f(t)$  be the queue-length of flow  $f$  at node  $n$  (at time  $t$ )
- Rate matrix  $R$ : number of (whole) packets that can be received in each time-unit
- Assume no interference constraints
- Max amount served from  $n$  of flow  $f$  at  $t$  to  $m$ :  $\min(Q_n^f(t), R_{nm})$
- Stochastic arrivals

## Back-pressure

- At every node  $n$  define for flow  $f$  and node  $m$

$$W_{n,m}^f(t) = R_{nm} (Q_t^f(n) - Q_t^f(m)).$$

- Use this to define a per-flow metric

$$F_n^f(t) = \max_{m \in N} W_{n,m}^f(t)$$

with the maximiser given by  $m_{f,n}^*(t)$ .

- Now define a node metric

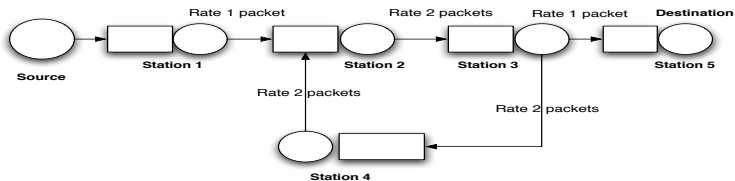
$$G_n(t) = \max_{f \in F} F_n^f(t)$$

with the maximiser given by  $f_n^*(t)$ .

- Scheduling algorithm:** At node  $n$

- If  $G_n(t) > 0$ , serve flow  $f_n^*(t)$  and route  $\min \left( Q_n^{f_n^*(t)}(t), R_{nm_{f_n^*(t),n}^*} \right)$  packets to  $m_{f_n^*(t),n}^*(t)$ .
- Else serve no flow.

# Issues



- Will transmit packets to nodes not connected to destination node
- Cannot recognize loops so delay performance can be bad

# Alternate Policy<sup>1</sup>

At node  $n$  for flow  $f$  define metric  $V_t^f(n)$  as follows:

- If  $n = d(f)$ , then  $V_t^f(d(f)) = 0$ .
- If  $n$  communicates with  $d(f)$ , then  $V_t^f(n) = \min_{m \in N} \frac{Q_n^f(t)}{R_{nm}} + V_t^f(m)$ .
- Else  $V_t^f(n) = +\infty$ .

Comments:

- $V$ s surrogate to draining time
- $V$ s measure of net downstream load
- Uses shortest-path ideas

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<sup>1</sup>S. and Leith, Draining-time based scheduling algorithm, CDC'07

## New Algorithm

Similar to Back-Pressure perform the following computations

- At every node  $n$  define for flow  $f$  and node  $m$

$$W_{n,m}^f(t) = \begin{cases} R_{nm} (V_t^f(n) - V_t^f(m)) & V_t^f(n), V_t^f(m) < +\infty, R_{nm} > 0 \\ -\infty & \text{else} \end{cases}$$

- Use this to define a flow metric  $F_n^f(t) = \max_{m \in N} W_{n,m}^f(t)$   
Maximiser given by  $m_{f,n}^*(t)$ .
- Now define a node metric

$$G_n(t) = \max_{f \in F} F_n^f(t)$$

with the maximiser given by  $f_n^*(t)$ .

- **Scheduling algorithm:**

- If  $G_n(t) > 0$ , serve flow  $f_n^*(t)$  & route  
 $\min \left( Q_n^{f_n^*(t)}(t), R_{nm_{f_n^*(t),n}^*} \right)$  packets to  $m_{f_n^*(t),n}^*(t)$ .
- Else serve no flow at node  $n$

## Alternate View

Alternate View:

- If  $n$  communicates with  $d(f)$ , then  
 $F_n^f(t) = \max_{m \in N} W_{n,m}^f(t) = Q_n^f(t)$ , and  $G_n(t) = \max_{f \in F} Q_n^f(t)$
- Scheduling Policy - serve **longest queue** at every node.

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- Scheduling Policy - serve **longest queue** at every node.
- For every node  $n$  we have  $m_{f,n}^*(t) = \arg \min_{m \in M} \frac{Q_n^f(t)}{R_{nm}} + V_t^f(m)$
- Routing Policy - route along **dynamic shortest paths** to destination with link metric  $\frac{Q_n^f(t)}{R_{nm}}$
- *This is work-conserving*

**Open problem: Is this maximally stable?**



## Comments

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**Tandem queues:** 1 flow, work-conserving FCFS

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KumarMeyn, Trans. AC, 1995

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$R \equiv \text{constant}$ , piece-wise quadratic Lyapunov works

NaghshvarZhuangJavidi, Trans. IT, 2012

DiekerShin'12 (arxiv) could be related

**Open problem: If maximally stable, Lyapunov fn?**