

Q1 from 2008/9

All bookwork. Note: students have been instructed that, for this course, "write an essay on" simply means "assemble and copy out from memory the relevant lecture notes".

(i) Example from drift models:

Appropriate example. 4

A drift model is an equation for the expected change in a quantity per unit time. For example, in TCP, let $w(t)$ be the congestion window at time t . By considering the congestion control algorithm,

$$\mathbb{E} w(t+\delta) = w(t) + \frac{1}{w(t)} \frac{w(t)}{RTT} \delta + p \frac{w(t)}{RTT} \delta \frac{w(t)}{2}$$

$$\text{So drift} = \frac{\mathbb{E} w(t+\delta) - w(t)}{\delta} = \frac{1}{RTT} - p \frac{w(t)^2}{2RTT}.$$

What is drift? 3

A fixed point is where there is zero drift. In this case, What is zero drift? 3

$$\text{drift} = 0 \Rightarrow \frac{1}{RTT} = \frac{p w^2}{2RTT} \Rightarrow w = \sqrt{\frac{2}{p}}.$$

To find the fixed points numerically, we could choose some small δ and repeatedly update these equations, e.g. in Excel

t	$w(t)$	drift
0	initial guess	use drift formula, applied to a cell
$= t + \delta$	$= t + \delta x$ ↗	"
"	"	"

Algorithm 5

After a while this should settle down.

If it doesn't, then either

- (a) there are no stable fixed points nearby
- or (b) δ is too large - try making it smaller, or use a proper diff.-eq. solver.

Bonus
Insight into algorithm failures

(ii) Example of solving simultaneous equations:

| Appropriate
example 4

In a loss network, we might have concluded

$$B_1 = E(\text{some function of } B_1 \text{ and } B_2, C_1) := f(B_1, B_2)$$

$$B_2 = E(\text{some other func. of } B_1 \text{ and } B_2, C_2) := g(B_1, B_2).$$

where B_1 and B_2 are blocking probabilities, C_1 and C_2 are link capacities measured in no. of circuits, and E is the Erlang function

We could solve this numerically by making an initial guess e.g.

$$B_1^{(0)} = \frac{1}{2}, \quad B_2^{(0)} = \frac{1}{2}$$

and repeatedly updating

$$B_1^{(n+1)} = f(B_1^{(n)}, B_2^{(n)})$$

$$B_2^{(n+1)} = g(B_1^{(n+1)}, B_2^{(n)})$$

| Algorithm: 5

Keep iterating until the values settle down to some limit $B_1^{(\infty)}, B_2^{(\infty)}$.
These limiting values must solve the original simultaneous equations.

| limiting value idea:
3

| Bonus: insight into
alg. failure

(iii) A fixed point x_0 is stable if, when you start either of these update procedures from close to x_0 , you head towards x_0 .

It is unstable if you head away from x_0 .

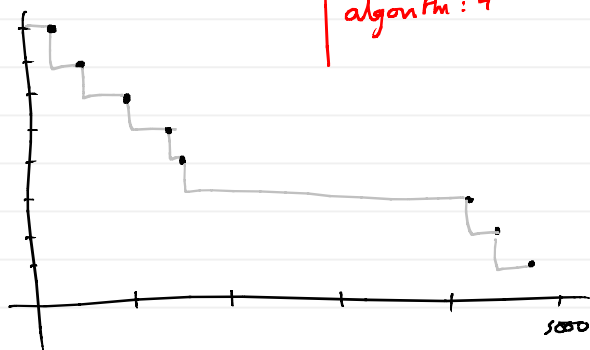
| stable + unstable: 2+2
link to both kinds: 2

Q1 from 2007/8 resit

(a) *lookwork* Sort the dataset.
let $n = \# \text{ observations}$.
Plot

x	y
smallest obs	n/n
$\vdots$	$\frac{n-1}{n}$
$\vdots$	$\vdots$
largest obs	$1/n$

algorithm: 4



x	y
186	1
431	7/8
1108	6/8
1409	5/8
1427	4/8
4215	3/8
4315	2/8
4713	1/8

execution: 2

(b) $\text{lik}(\lambda, \mu) = \prod_{i=1}^n f(x_i)$ where x_i are the observations *correct link(): 5*

$$\log \text{lik}(\lambda, \mu) = \sum_{i=1}^n \begin{cases} \log \lambda - \lambda x_i & \text{if } x_i \leq 1024 \\ \log(\lambda + \mu) - (\lambda + \mu)x_i + 1024\mu & \text{if } x_i > 1024 \end{cases}$$

$$= n_{\leq 1024} \log \lambda - \lambda S_{\leq 1024}$$

where $n_{\leq 1024} = \# x_i \leq 1024$

$$+ n_{> 1024} \log(\lambda + \mu) - (\lambda + \mu) S_{> 1024} + 1024\mu n_{> 1024}$$

$$S_{\leq 1024} = \sum_{i: x_i \leq 1024} x_i \text{ etc.}$$

$$\frac{\partial}{\partial \lambda} = 0 \Rightarrow \frac{n_{\leq 1024}}{\lambda} + \frac{n_{> 1024}}{\lambda + \mu} = S_{\leq 1024} + S_{> 1024}$$

idea of maximizing by using $\frac{\partial}{\partial \cdot} = 0$: 3

$$\frac{\partial}{\partial \mu} = 0 \Rightarrow \frac{n_{> 1024}}{\lambda + \mu} = S_{> 1024} - 1024 n_{> 1024}$$

idea of simultaneous soln: 3

execution: 4

$$\text{Hence } \frac{n_{\leq 1024}}{\lambda} = S_{\leq 1024} + S_{> 1024} - S_{> 1024} + 1024 n_{> 1024} \Rightarrow \hat{\lambda} = \frac{n_{\leq 1024}}{S_{\leq 1024} + 1024 n_{> 1024}}$$

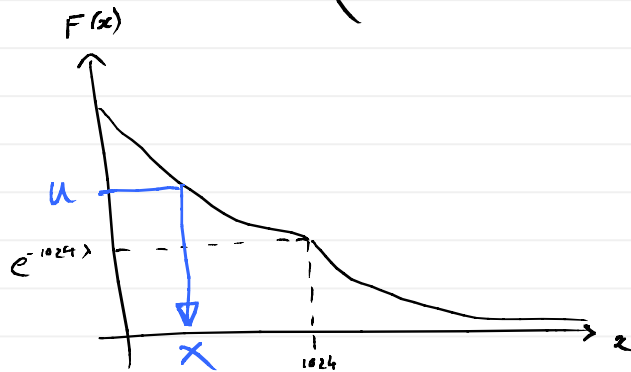
$$\text{So } \hat{\mu} = \frac{n_{> 1024}}{S_{> 1024} - 1024 n_{> 1024}} - \hat{\lambda}$$

(c) Let $U \sim \text{Uniform}[0, 1]$.

Choose
Uniform: 2

correct
link to F(.) : 5

solve $F(x) = \begin{cases} e^{-\lambda x} & \text{if } x \leq 1024 \\ e^{-(\lambda+\mu)x + 1024\mu} & \text{if } x > 1024 \end{cases} = U$



This X is the
output of the random
number generator.

In particular, if $U \geq e^{-1024\lambda}$ then solve $e^{-\lambda x} = U \Rightarrow x = -\frac{1}{\lambda} \log U$,

else solve $e^{-(\lambda+\mu)x + 1024\mu} = U \Rightarrow -(\lambda+\mu)x + 1024\mu = \log U$

$$\Rightarrow x = \frac{-1}{\lambda+\mu} (\log U - 1024\mu)$$

calculation: 5

In summary: let $U = \text{random uniform}[0, 1]$
let $x = -\frac{1}{\lambda} \log U$ if $U \geq e^{-1024\lambda}$ else $-\frac{1}{\lambda+\mu} (\log U - 1024\mu)$
Return x .

I'd rather see the
answer presented in
pseudo-code like this;
but, absent pseudo-
code, I'll be
satisfied if the
intention is clear from
the maths.

Q2 from 2008/2009

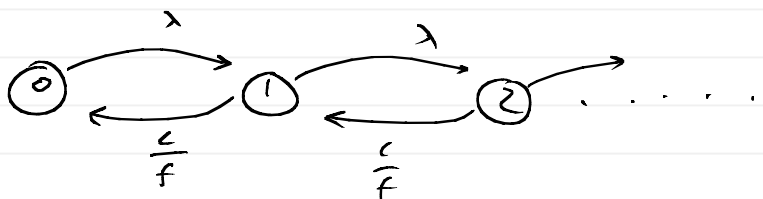
All bookwork.

- (a) A processor sharing link is a model for a system in which jobs arrive, stay in the system until all the work they brought has been served, and then depart; while there are n jobs in the system, each of them receives service at rate $\frac{c}{n}$ where c is the link capacity.

4 marks. Service rate/Job size/. Arrive/depart.

- (b) Assume arrivals are a Poisson process of rate λ , and that job sizes are Exponential with mean f . The number of jobs active at time t , N_t , is a Markov process:

proper setup: 3



correct diagram: 2

- Arrivals are a Poisson process, so interarrival times are $\sim \text{Exp}(\lambda)$. By the memoryless property, if I turn up at some time t , the time until the next arrival is $\sim \text{Exp}(\lambda)$. Hence the up-rates. 2 marks.
- If there are n jobs active, the residual job sizes $x_1, \dots, x_n$ are all $\sim \text{Exp}(\frac{1}{f})$ by the memoryless property. So the residual service times are $x_1/\frac{c}{n}, \dots, x_n/\frac{c}{n} \sim \text{Exp}(\frac{c}{nf})$. So the time until the next departure is $\min(x_1/\frac{c}{n}, \dots, x_n/\frac{c}{n}) \sim \text{Exp}(n \frac{c}{nf})$, hence the down-rates. 3 marks

- (c) Detailed balance equations: $\pi_n \lambda = \pi_{n+1} \frac{c}{f} \Rightarrow \pi_{n+1} = \frac{\lambda f}{c} \pi_n = \rho \pi_n$.

So $\pi_1 = \rho \pi_0$, $\pi_2 = \rho^2 \pi_0$, etc.

To normalize, $\pi_0 + \pi_1 + \dots = 1 \Rightarrow \pi_0 (1 + \rho + \rho^2 + \dots) = 1 \Rightarrow \pi_0 = 1 - \rho$.

Thus $\pi_n = (1 - \rho) \rho^n$.

So, eqm # jobs $\sim \text{Geom}(1 - \rho) - 1$.

$\mathbb{E} \# \text{ jobs} = \frac{1}{1 - \rho} - 1 = \frac{\rho}{1 - \rho}$.

Balance: 3

Normalize: 2

Execution of eqm dist: 2

Mean # jobs: 3

- (d) Little's Law: $N = \lambda W$ where N = mean occupancy, λ = arrival rate, W = mean occupancy time, for jobs in a system. 2: statement

2: explain terms

(e) $W = \frac{N}{\lambda} = \frac{\rho}{1 - \rho} \cdot \frac{1}{\lambda} = \frac{\lambda f / c}{1 - \lambda f / c} \cdot \frac{1}{\lambda} = \frac{f}{c - \lambda f}$.

3: bring in correct terms

2: answer

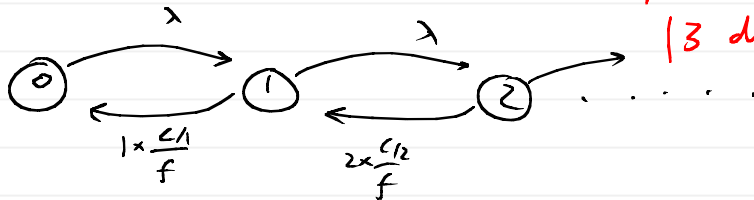
Q2 from 2007/8 resit

All bookwork apart from (e)

- (a) A processor sharing link is a model for a system in which jobs arrive, stay in the system until all the work they brought has been served, and then depart; while there are n jobs in the system, each of them receives service at rate $\frac{C}{n}$ where C is the link capacity.

| 3 marks. throughput / bring work / arrive + depart.

- (b) Assume arrivals are a Poisson process of rate λ , and that job sizes are Exponential with mean f . The number of jobs active at time t , N_t , is a Markov process:



| 2 setup

| 3 diagram.

- (c) Detailed balance equations: $\pi_n \lambda = \pi_{n+1} \frac{C}{f} \Rightarrow \pi_{n+1} = \frac{\lambda f}{C} \pi_n = \rho \pi_n$.

So $\pi_1 = \rho \pi_0$, $\pi_2 = \rho^2 \pi_0$, etc.

To normalize, $\pi_0 + \pi_1 + \dots = 1 \Rightarrow \pi_0 (1 + \rho + \rho^2 + \dots) = 1 \Rightarrow \pi_0 = 1 - \rho$.

Thus $\pi_n = (1 - \rho) \rho^n$.

So, eqm # jobs $\sim \text{Geom}(1 - \rho) - 1$.

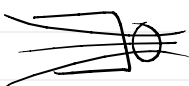
$E[\# \text{ jobs}] = \frac{1}{1 - \rho} - 1 = \frac{\rho}{1 - \rho}$.

Balance: 3

Normalize: 2

Execution of eqm dist: 2

Mean # jobs: 3

- (d)  let there be N flows, each sending at rate x , sharing a link of capacity C with buffer B .

| setup: 3

$$x = \frac{\sqrt{2}}{RTT \sqrt{\phi}}$$

$$\phi = \frac{\rho^B (1 - \rho)}{1 - \rho^{B+1}} \quad (\text{drop formula for M/M/1/B queue})$$

$$\text{where } \rho = \frac{Nx}{C}$$

| appropriate eqns: 3

$$\text{Alternatively, } \rho = \frac{\sqrt{2}}{RTT \frac{C}{N \sqrt{\phi}}} \quad \text{and} \quad \phi = \frac{\rho^B (1 - \rho)}{1 - \rho^{B+1}}$$

| solution concept: 3

Plot these two on a graph of ϕ against ρ and find the intersection; this lets you find $x = \frac{\rho C}{N}$ and actual throughput $x(1 - \phi) = \frac{\rho C}{N} (1 - \phi)$.

| actual throughput: 1

- (e) Down rates are now



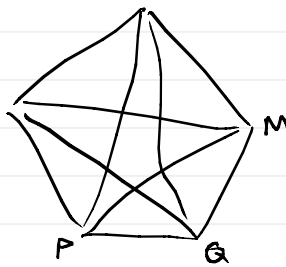
where Θ_N is throughput with N flows.

| correct term: 3. correct place: 2.

Q3

3 marks

(a)
backwork



A call from e.g. P to Q would first of all try the direct link. If that link has a circuit free, route the call P-Q.

Otherwise, pick a node M at random from the others. If P-M and M-Q both have a circuit free, route it P-M-Q. otherwise, the call is blocked.

(b) λ = arrival rate of calls between any pair of nodes. μ^{-1} = mean call duration terms: 4 marks

c = # links on each circuit

$E(\frac{\lambda}{\mu}, c)$ = Erlang formula for blocking probability on an isolated link with c circuits, arrival rate λ , mean call duration μ^{-1} .

Consider the link P-M. The offered traffic is

idea of offered load: 2
putting it together: 4

$$\lambda + \underbrace{2(n-2)}_{\substack{\text{\# of other nodes } Q \\ \text{that could use P-M,} \\ \text{either P-M-Q or} \\ \text{M-P-Q}}} \underbrace{\lambda B \frac{1}{n-2} (1-B)}_{\substack{\text{chance that} \\ \text{P-Q or M-Q call} \\ \text{chooses to route over} \\ \text{M-P}}}$$

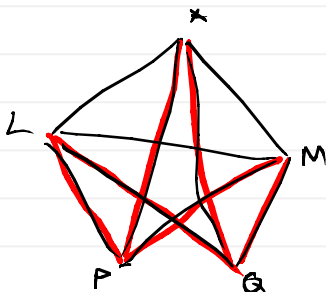
direct traffic

B : The P-Q or M-Q call must be blocked on the direct route

$1-B$: The other leg of the two-hop route must not block.

Hence $B = E\left(\frac{\lambda + 2(n-2)\lambda B \frac{1}{n-2} (1-B)}{c}, c\right)$ as per the equation.

(c)



offered traffic on PM:

$$\begin{aligned} & \lambda \quad (\text{direct traffic}) \\ & + \lambda \frac{1}{n-2} (1-B_{red}) \quad (\text{traffic P-Q that chooses waypoint M}) \\ & + (n-3)\lambda B_{red} \frac{1}{n-3} (1-B_{black}) \quad (\text{traffic P-L that chooses 2-hop route via M}) \\ & + (n-3)\lambda B_{black} \frac{1}{n-2} (1-B_{red}) \quad (\text{traffic M-L that chooses 2-hop route via P}) \end{aligned}$$

$$\text{so } B_{red} = E\left[\frac{\lambda}{c} \left(1 + \frac{1}{n-2} (1-B_{red}) + B_{red} (1-B_{black}) + \frac{n-3}{n-2} B_{black} (1-B_{red})\right), c\right]$$

4: types of traffic. s : induced rates. l : answer.

Offered traffic on LM:

λ (direct traffic)

$+ \lambda \cdot 4 B_{red} \frac{1}{n-3} (1 - B_{red})$ (traffic P-L or P-M or Q-L or Q-M that chooses 2-hop over L-M)

$+ 2(n-4) \lambda B_{black} \frac{1}{n-2} (1 - B_{black})$ (traffic L-X or Q-X that chooses 2-hop over L-M)

$$\text{So } B_{black} = E \left[\frac{\lambda}{\mu} \left(1 + \frac{4}{n-3} B_{red} (1 - B_{red}) + \frac{2(n-4)}{n-2} B_{black} (1 - B_{black}) \right), C \right]$$

| 4: types of traffic.

S: induced rates.

1: answer.

Q4

- (a) On receipt of ACK, increase $w(t)$ by $\frac{1}{w(t)}$.
On detection of a drop, cut $w(t)$ by $\frac{w(t)}{2}$. | 2 marks

Packets are being sent at rate $x(t) = \frac{w(t)}{RTT}$, so ACK rate = $x(t)$ & drop rate = $p x(t)$. | 1 mark

$$E w(t+\delta) = w(t) + \underbrace{\delta x(t) \cdot \frac{1}{w(t)}}_{\text{change of getting an ACK in interval of length } \delta} - \underbrace{\delta p x(t) \cdot \frac{w(t)}{2}}_{\text{change of detecting a drop in an interval of length } \delta}$$

$$\Rightarrow \text{drift} = \text{Rate of change of } w(t) = \frac{E w(t+\delta) - w(t)}{\delta} = x(t) \frac{1}{w(t)} - p x(t) \frac{w(t)}{2}$$

$$= \frac{1}{RTT} - p \frac{w(t)^2}{2RTT}$$
| 3 marks

The fixed point is when drift = 0

$$\Rightarrow \frac{1}{RTT} = p \frac{w^2}{2RTT} \Rightarrow w = \sqrt{\frac{2}{p}} \Rightarrow x = \frac{\sqrt{2}}{RTT \sqrt{p}}$$
| 2 marks

(b) $\frac{dw_A(t)}{dt} = x_A(t) \frac{1}{w_A(t) + w_B(t)} - p_A x_A(t) \frac{w_A(t)}{2} = \frac{1}{RTT} \frac{w_A}{w_A + w_B} - p_A \frac{w_A^2}{2RTT}$

$\frac{dw_B(t)}{dt} = x_B(t) \frac{1}{w_A(t) + w_B(t)} - p_B x_B(t) \frac{w_B(t)}{2} = \frac{1}{RTT} \frac{w_B}{w_A + w_B} - p_B \frac{w_B^2}{2RTT}$

Fixed point: $\frac{w_A}{w_A + w_B} = \frac{p_A w_A^2}{2} \Rightarrow w_A = \frac{2/p_A}{w_A + w_B}$

& $w_B = \frac{2/p_B}{w_A + w_B}$

From the first eqn, $w_A + w_B = \frac{2/p_A}{w_A} \Rightarrow w_B = \frac{2/p_A}{w_A} - w_A$

Substituting into 2nd eqn, $\frac{2/p_A}{w_A} - w_A = \frac{2/p_B}{\frac{2/p_A}{w_A} - w_A} = \frac{w_A p_A}{p_B}$

$$\Rightarrow \frac{2/p_A}{w_A} = w_A \left(1 + \frac{p_A}{p_B}\right) \Rightarrow w_A = \sqrt{\frac{2/p_A}{1 + p_A/p_B}} = \sqrt{\frac{2}{p_A + p_A^2/p_B}} = \sqrt{\frac{2}{p_B (p_B + p_A)}}$$

3 marks: right place & trend
3 marks: right & weak

likewise, $w_B = \frac{\sqrt{Z}}{\sqrt{\frac{P_B}{P_A} (P_B + P_A)}}$

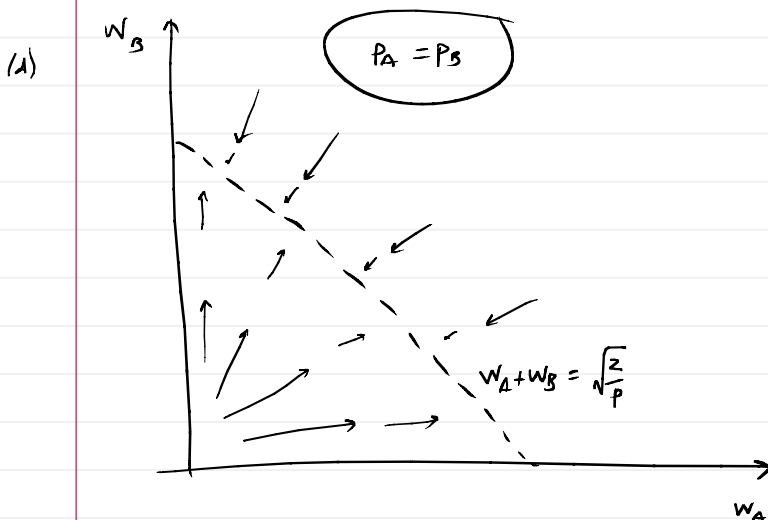
Total throughput is $\frac{w_A + w_B}{RTT} = \frac{\sqrt{Z}}{RTT} \frac{1}{\sqrt{(P_A + P_B) \left(\frac{P_A}{P_B} + \frac{P_B}{P_A} \right)}}$

3 marks: right place to tweak

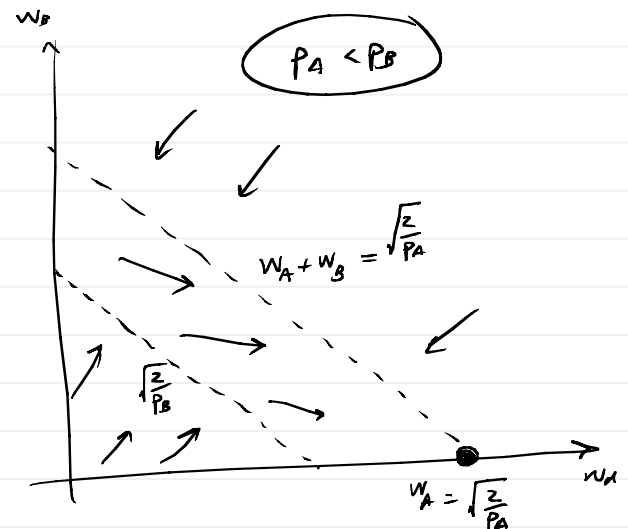
3 marks: right tweak

(c) $\frac{dw_A(t)}{dt} = x_A(t) \frac{1}{w_A(t) + w_B(t)} - P_A x_A(t) \frac{w_A(t) + w_B(t)}{Z} = \frac{x_A(t)}{w(t)} \left(1 - P_A \frac{w(t)^2}{Z} \right)$

$\frac{dw_B(t)}{dt} = x_B(t) \frac{1}{w_A(t) + w_B(t)} - P_B x_B(t) \frac{w_A(t) + w_B(t)}{Z} = \frac{x_B(t)}{w(t)} \left(1 - P_B \frac{w(t)^2}{Z} \right)$



Drifts to the dotted line and stays there, anywhere on the line.



Drifts to $w_A = \sqrt{\frac{Z}{P_A}}$, $w_B = 0$

3 marks: right axes, idea

4: identify special lines/zones

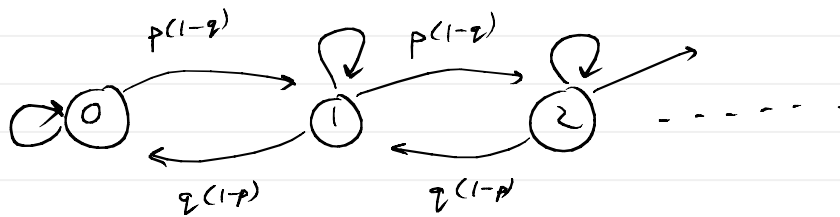
3: arrows in right direction

3: execution

Bonus: interesting comparison to the first proposal

Q5

(a)



4: right ideas about how transitions occur

2: execution

(The unlabelled transitions are such as to make jump-out probs. sum to 1 at each node.)

(b) The detailed balance equations are

4: balance + normalization

$$\pi_n p(1-q) = \pi_{n+1} q(1-p)$$

$$\Rightarrow \pi_n = \rho^n \pi_0 \quad \text{where } \rho = \frac{p(1-q)}{q(1-p)}$$

To make $\pi_0 + \pi_1 + \dots = \pi_0 (1 + \rho + \dots) = 1$, we need $\pi_0 = 1 - \rho$.

Thus

$$\pi_n = (1 - \rho) \rho^n, \quad \text{ie queue size} \sim \text{Geom}(1 - \rho) - 1.$$

4: correct eqn + mean

$$P(\text{queue is empty}) = \pi_0 = 1 - \rho.$$

$$\text{Mean queueing size} = \frac{1}{1 - \rho} - 1 = \frac{\rho}{1 - \rho}.$$

$$\text{Mean queueing delay} = \frac{N}{\lambda} \text{ by Little, } = \frac{\rho}{1 - \rho} / \mu \text{ timeslots}$$

2: appeal to Little

2: correct delay

$$(c) P(\text{node 1 successfully transmits}) = q_1 = r_1 \left(1 - p_2 + p_2(1 - r_2) \right)$$

$$P(\text{node 2 successfully transmits}) = q_2 = r_2 \left(1 - p_1 + p_1(1 - r_1) \right) \left(1 - p_3 + p_3(1 - r_3) \right)$$

$$P(\text{node 3 successfully transmits}) = q_3 = r_3 \left(1 - p_2 + p_2(1 - r_2) \right)$$

where

$$p_i = \frac{p_i(1 - q_i)}{q_i(1 - p_i)}$$

3: use p in the prob. term
3: notice special form for queue 2
3: correct Q2 eqn
3: correct Q1 and Q3

3: identify p from first part of question.

These 6 equations may be solved for $q_1, q_2, q_3, p_1, p_2, p_3$, using the fixed pt method