

Host - contains info
Router - forwards info
Link - carries info

packet switching - flexible routing, grouped into packets (datagrams) | DIVIT KALWA 122

circuit switching - inflexible routing, selects set of links only once

virtual circuit - set of links selected once, required data rate not reserved

IPv4 - 32 bits - a.b.c.d
 0.a, b, c, d < 255

IPv6 - 128 bits
IP addresses assigned by location
↳ CIDR (classless interdomain routing)
↳ longest prefix matching

Metrics

Link Rate (Mbps)(R)

Link Bandwidth (Hz)(W)

↳ width of range of frequencies link can transfer over

Link Capacity (Mbps)(C)

↳ C = maximum reliable link rate
↳ Shannon Capacity

↳ C = W log₂(1 + SNR)

↳ SNR = $\frac{p_{sig}(signal)}{p_{noise}(noise)}$ @ receiver

Delay

↳ time for packet to travel b/w two points end-to-end delay

↳ transmission and propagation times (link)
↳ queuing & processing times (node)

Throughput

↳ size/time

↳ not same as link rate

↳ included gaps/delays

↳ limited by window size/RTT

↳ determined by slowest link

Delay Jitter

↳ longest delivery time

↳ if jitter is J, destination should store each packet for at least J seconds

↳ practically, start w/ J = T, then adjust t as packets come in Bytes

M/M/I Queue

↳ 2 packets arrive per second (avg)

↳ μ packets sent per second (avg)

↳ assuming 2 exp. average time each packet waits = $T = \frac{1}{\mu - 2}$

↳ if 2 exp., $T = \frac{1}{\mu - 2}$

↳ average queuing time a packet waits = $T = \frac{1}{\mu}$

↳ avg # of packets in queue = $L = \frac{2}{\mu - 2}$

↳ T, L grow w/o bound as $2 > \mu$

↳ μ = link rate

↳ avg packet length

↳ utilization = $P = \frac{2}{\mu}$

↳ $2 < \mu < \infty$

↳ μ is non-reentrant

↳ μ is multi-reentrant

↳ μ is transient

Hub - bulletin board $P(n, n+1) = 1 - 2e^{-\mu t}$

Switch - USPS $P(n, n+1) = (1 - P)^n$

↳ μ is constant

↳ μ is variable

↳ μ is bursty

↳ μ is periodic

↳ μ is random

↳ μ is adaptive

↳ μ is bursty

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Aloha

- ↳ Time-Slotted
- ↳ n devices
- ↳ probability of transmitting in a time slot given \rightarrow chances of exactly one transmission in slot = $P(p) = np(1-p)^{n-1}$
- ↳ optimal $p = \frac{1}{n}$
- $\rightarrow R(\frac{1}{n}) = (1 - \frac{1}{n})^{n-1} = \frac{1}{e} = .37$
- $\rightarrow 37\% \text{ efficiency @ most}$
- ↳ Non Slotted
 - $\rightarrow 18\% \text{ efficiency @ most}$

Hub Ethernet

↳ max time to detect collisions = $2PRTD$
 ↳ fraction of time where stations transmit successfully = $\frac{1}{1+24A}$
 $A = PRTD / TRANS$
 simulations show $\frac{1}{1+SA}$

WiFi

↳ uses Distributed Coordination Function (DCF)
 ↳ com. through Access Point (AP)
 ↳ set of devices that communicate w/ given AP is Basic Service Set (BSS)
 ↳ MAC sublayer & Physical Layer

MAC sublayer

↳ binary exponential backoff
 ↳ wait short time before sending ACK
 ↳ wait longer backoff
 ↳ avoids interfering w/ ACK
 ↳ some variations
 ↳ sender sends RTS
 ↳ recipient replies w/ CTS
 ↳ other stations wait for P&ACK to send

Medium Access Control (MAC)

Constant	802.11b	802.11a
Slot time	20μs	9μs
SIFS	10μs	16μs
DIFS	50μs	34μs
EIFS	364μs	94μs
CW _{min}	31	94
CW _{max}	1023	1023

Carrier Sense Multiple Access w/ Collision Avoidance (CSMA/CA)

↳ hidden terminal problem
 ↳ doesn't realize another station is transmitting
 ↳ solved w/ RTS/CTS
 ↳ hears at least CTS
 ↳ exposed terminal problem
 ↳ thinks another station is transmitting
 ↳ not an issue if using same AP
 ↳ Network Allocation Vector (NAV)
 ↳ indicates how long channel will be busy w/ current exchange
 ↳ virtual carrier sensing

→ 58% of bit rate is used for data pause during EIFS

$$PIFS = SIFS + \text{slot time}$$

$$DIFS = SIFS + 2 \cdot \text{slot time}$$

$$EIFS = SIFS + DIFS + \text{ACKTime} @ 1 \text{Mbps}$$

Transit - ISP sells access to destination

Peering - Transit but free

Border Gateway Protocol (BGP)

uses path-vector algo

↳ each router advertises its preferred path to nodes

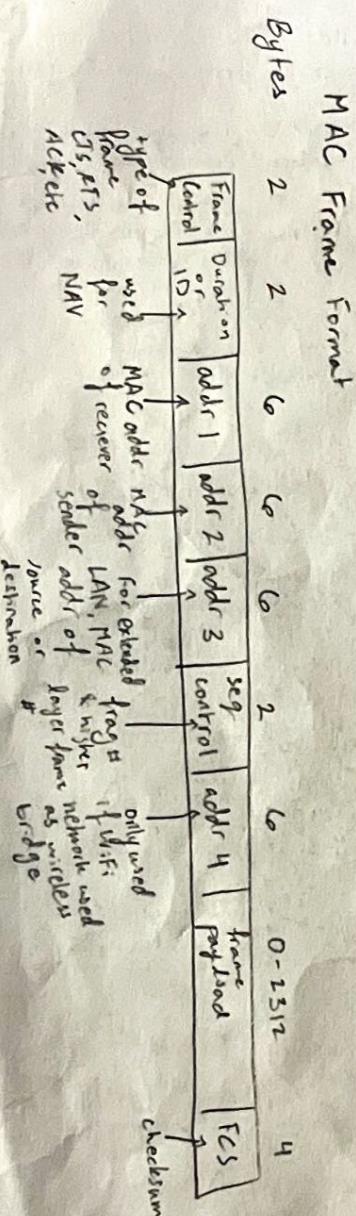
Dijkstra's Algorithm

↳ link state, each router provides list [neighbor dist to neighbor]
 ↳ computes recursively set of $P(k)$ nodes closest to root
 ↳ $P(n) = P(n-1) + \text{closest node to } P(n-1)$
 ↳ one pass, steps = #nodes
 ↳ only positive weights

Bellman-Ford → share routing tables periodically
 ↳ nodes regularly send neighbors current estimate of shortest dist.

→ Bad News Travels Slowly
 ↳ takes time to update

↳ takes time to update when link fails



Steiner Tree is NP hard

Improving Reliability in multicast

$$P_1, P_2 \rightarrow S P_1, P_2, C_1$$

relaxation
 ↳ bit by bit
 addition ≥ 2 bits from header specifies which edge packets

$$C_1, C_2, \dots, C_m ;$$

$$\text{max} S_m = P_1, P_2, \dots, P_n$$

Network needs

↳ connectivity - all nodes can talk to each other
 ↳ broadcast capability - router can send msg to reach all devices

↳ subnet addr specifies leading bits common to all IP

ARP gets MAC addr. given IP addr. Not forwarded by routers uses broadcast

Ad Hoc Networks

↳ all nodes talk directly to each other

AODV

↳ on demand tasks neighbors

↳ Ant Routing
 ↳ Geographic
 ↳ shortest next hop
 ↳ proactive WRP

↳ OLSR

Bianchi Markov Chain Model

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$$S(s_k), b(k)$$

s - prev attempts @ sending
this packet @ epoch k

b - backoff counter @ epoch k

for cases where n devices have data to transmit (or $n-1$ devices + AP)
 $W_n = 2^i (CW_{\min} + 1)$
 $CW_{\max+1} = 2^m (CW_{\min} + 1)$

when station transmits, it is successful w/ probability $(1-p)$
collides w/ probability p

probability that MC is in state of form $(i, 0) \rightarrow \alpha$

assume all n stations have prob α of transmitting

$$1-p = (1-\alpha)^{n-1}$$

$$\alpha(p) = \frac{2(1-2p)}{(1-2p)(W+1) + pW(1-(2p))}$$

$$W = CW_{\min} + 1$$

successful transmission probability

$$\beta = n\alpha(1-\alpha)^{n-1}$$

↳ length T
↳ bits B

$$\text{Throughput} = \frac{BB}{T}$$

$$\text{Sys Throughput} = \frac{\text{data bits b/w consecutive epochs}}{\text{time b/w consecutive epochs}}$$

for each node, visit unvisited neighbors
↳ pick next node based on smallest dist/weight

~~Dijkstra's Algo~~ Dijkstra's Algorithm

Multiplexing

TDM
↳ time slots

FDM
CDM

$$[\pi_n] \begin{bmatrix} \alpha \\ 1-\alpha \end{bmatrix} = [\pi_{n+1}]$$

$$\inf \sum_{i=1}^r \text{first term}$$

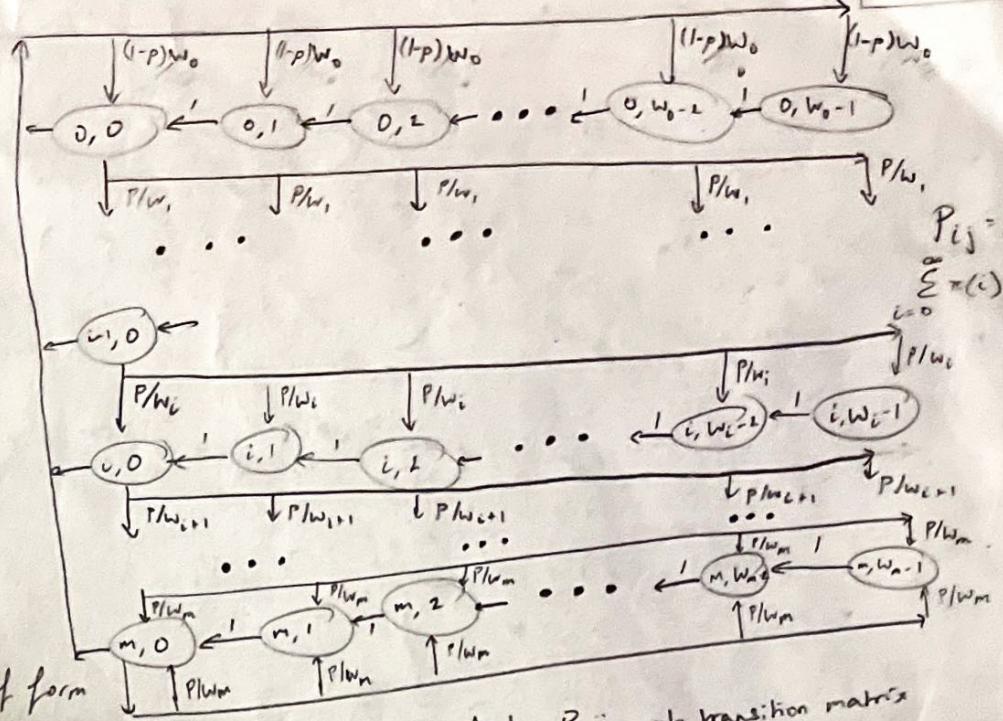
$1-r$ multiplier

$$L = \sum_{n=0}^{\infty} n(1-p)p^n = \frac{p}{1-p} = \frac{2}{\mu-\lambda}$$

$$w(\text{delay}) = \frac{1}{\mu-\lambda}$$

conservation principle
for inv. dist

flow in = flow out for appropriate boxes



Let π denote invariant dist, P prob. transition matrix

$$\Rightarrow \pi P = \pi$$

$\pi(i, 0) P = \pi(i, 0) \Rightarrow \pi(i, 0) = p^i \pi(0, 0)$ for $0 < i < m$
reducible - one node is unreachable from another
any

irreducible - not reducible

↳ has unique invariant dist
 $\lim_{N \rightarrow \infty} \frac{1}{N} \sum_{n=0}^{N-1} \pi(X_n = i) = \pi(i), i \in S$ state space

recurrent iff $P(T_{ii} < \infty) = 1$, transient iff $P(T_{ii} < \infty) < 1$

positive recurrent iff $E(T_{ii}) < \infty$, null recurrent iff $E(T_{ii}) = \infty$

irreducible finite DTMC is always + recurrent
if one state of irreducible DTMC is positive/null/transient recurrent
the whole DTMC is

$$d(i) = G(D \{ n \geq 1 | P^n(i, i) > 0 \})$$

↳ periodic if $d > 1$, else if $d = 1$ aperiodic

Internetworking

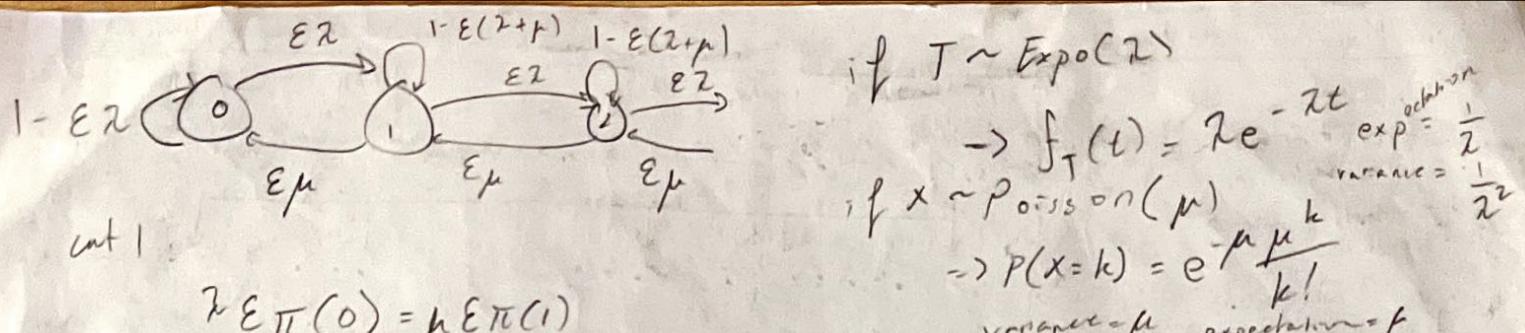
each device must

- ↳ share IP
- ↳ know subnet addr
- ↳ know gateway router IP
- ↳ IP addr of DNS server
- ↳ implement ARP

DHCP loans IP addr.

NAT enables routing of private IPs

bind ports of transport protocol



$$\lambda E\pi(0) = \mu E\pi(1)$$

$$\text{cut } n+1: \lambda E\pi(n) = \mu E\pi(n+1)$$

$$\Rightarrow \pi(n+1) = \frac{\lambda}{\mu} \pi(n) = \left(\frac{\lambda}{\mu}\right)^{n+1} \pi(0)$$

$$\sum_{i=0}^{\infty} \left(\frac{\lambda}{\mu}\right)^{n+1} \pi(0) = 1 \quad \begin{matrix} \text{law of} \\ \text{total prob.} \end{matrix}$$

Markov
Prop

μT is # packets sys can serve

$\mu \bar{T}$ is # packets sys actually served

$$= 2T$$

Sum of inf. geo. series $\left[\frac{\pi(0)}{1 - \frac{\lambda}{\mu}} \right] = 1 \Rightarrow \pi(0) = 1 - \frac{\lambda}{\mu} \Rightarrow \pi(n) = \left(\frac{\lambda}{\mu}\right)^n \left(1 - \frac{\lambda}{\mu}\right)$

$$\text{avg. val. if } X/X \geq 0 = \sum_{n=0}^{\infty} n P(X=n)$$

$$P = \frac{\lambda}{\mu} \Rightarrow \pi(n) = (1-P)P^n$$

$$L = \sum_{i=0}^{\infty} i (1-P) P^i = (1-P) \sum_{i=0}^{\infty} i P^i = \frac{P}{1-P}$$

$$\Rightarrow \frac{\lambda}{\mu - \lambda}$$

$$\text{avg. Delay} = \frac{L}{2}$$

$$= \frac{1}{\mu - \lambda}$$

for $0 < r < 1$

$$\sum_{n=0}^{\infty} n r^n = \frac{r}{(1-r)^2}$$

RIP is least # of hops

DHCP returns

IP of device, IP of gateway, router, IP of DNS, subnet mask

Transport

Software ports

$\rightarrow 1-65535$

$\rightarrow 1-1023$

well-known
correspond to
fixed processes

$\rightarrow 1024-49951$

registered
specific
applications by
companies

UDP

- delivers individual
packets

- unreliable delivery

TCP

- delivers a byte
stream

- reliable

Go Back N - TCP Tahoe

- @ any time, source may have sent up to N packets not ACKed yet
- dest responds to each packet w/ packet # it expects next in order
- if ACK fails to arrive after some time, retransmit that packet
- + next $N+1$ packets
- if no err. - N packets/RTT
- \rightarrow No stop-and-wait throughput

Selective ACKs

- indicate positive ACK for packets received

↳ avoids retransmission
unnecessary

AIMD



x_1, y_1 increment until
 $x_1 + y_1 > C$ (packets drop),
then each divides by
2 & repeats

Rate Adj

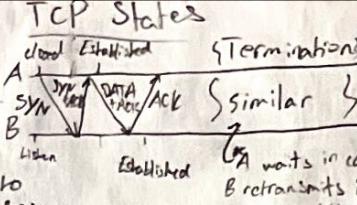
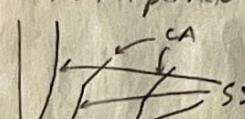
window size N ,

$N = N + 1$ per ACK

$N = N/2$ for missed ACKs

slow start - start by
doubling size every RTT,
until missed ACK or
threshold

$\rightarrow N = N + 1$ per ACK



Stop & Wait

wait for T sec for
ACK, if not received,
retransmit
rate = $\frac{\text{packet size}}{T}$

0	16	32
src port	dest port	
UDP len	checksum	
payload		

Header Info

SYN, FIN - establish/
terminate TCP conn

ACK - set when
Acknowledgment field is
valid

URG - urgent data

↳ Urgent Ptr shows
where non-urgent
data starts

PUSH - don't wait to

fill segment

RESET - abort connection

Timers

timeout = $A_n + 4D_n$

A_n = avg. ACK time
for packets w/o
outstanding
ACKs

D_n = deviation around
 A_n

$A_{n+1} = (1-\alpha)A_n + \beta T_{n+1}$

$D_{n+1} = (1-\alpha)D_n + \beta |T_{n+1} - A_{n+1}|$

$n \geq 1, \beta \leq 1$

fast retransmit - retransmits
after 3 duplicate ACKs,
avoiding wait for timeout

fast recovery - when packets
lost, lowers window size,
continues transmitting, relying
on fast retransmit to fill gap &
increase window size
once sender's window size
reaches $w/2 - 1$, can send
all packets, then $w = w/2$

Flow Control

respond w/ RWIN (Receiver
Advertised
OUT = outstanding bytes
sends min(RWIN - OUT, W - OUT)

TCP Vegas

diff = $\frac{W}{\text{minRTT}}$ - actual rate

$\alpha < \beta$
if $\alpha > \text{diff}$ || $\text{diff} > \beta$, change window
linearly
cluttered in presence of Reno

Models

arc is a pair of
vertices

each arc (i, j) has
capacity $C(i, j)$

cut - subset of nodes

capacity of cut is
sum of arc capacities
from S to G

$$R(i, j) = R(i, k) + R(k, j)$$

$$R(i, j) \leq C(i, j) \text{ for } \text{arc}(i, j)$$

Graphs

max-flow min-cut

↳ max flow from

$v \rightarrow w = \min$ capacity

of cut where $v, w \in$

graph is complete if

any two nodes are connected by a little

max deg of graph = max degree

of vertices

coloring - st no neighbors

have same color

\Rightarrow colors - chromatic #

clique - set of vertices that

is pairwise connected

\Rightarrow all must have different

\Rightarrow chromatic # \geq size largest clique

Brooke's Thm

chromatic # if connected
graph w/ max degree Δ

it at most Δ , except for
odd cycles & complete graphs

$\Rightarrow \Delta + 1$

conflict graph - link

represents two nodes
cannot transmit same

time each other can

transmit 0 once

\Rightarrow independent set is

all 1 color

\Rightarrow maximal indep. set

if every other node
is attached to one of

the nodes in the

set

\Rightarrow maximal indep. set

if time each node
transmits

PASTA

↳ Poisson arr.
see time arr.

for packets arriving at nodes 1-3 at rate $2, 2, 2, 2, 2, 2, 2, 2, 2, 2$

fraction of time =

$$\sum_k p_k \delta t$$

\Rightarrow 2 feasible iff $p_k \geq 0 \forall k$ &

$$\sum_k p_k = 1$$

\Rightarrow $k_1 \leq \sum_{k=1}^K p_k \delta t \leq k_2$

$\Rightarrow P(n, n+1) \approx 2e, P(n, n-1) \approx e, P(n, n) \approx 1 - 2e - e$

$$\pi(n) = (1-p)^n, P(n, n) = p^n, P(n, n) = 1 - 2e - e$$

Jackson Networks

Queues Classes

class c goes through $S(c) \subset S_1 \dots S_n \Rightarrow Z = \sum c_i$

rate of customers through queue $j = \lambda_j = \sum_{i \in S(c)} \lambda_i$

assume $\lambda_j \leq \mu_j$

$$W_c = \sum_{i \in S(c)} \frac{1}{\mu_i}$$

assuming two queues $j \in S(c) \lambda_j - \lambda_i, L_j = \frac{\lambda_j}{\mu_j - \lambda_j}$ avg. delay

$$\Rightarrow \min T = \frac{P}{\mu_1 - \lambda_1} + \frac{1 - P}{\mu_2 - (\mu_1 - \lambda_1)}$$

$$\Rightarrow P = \frac{1}{2} \frac{\mu_1}{\mu_1 - \lambda_1} + \frac{1}{2} \frac{\mu_2}{\mu_2 - (\mu_1 - \lambda_1)}$$

$$U(x) = \frac{x^{1-\alpha}}{1-\alpha} \text{ for } x \geq 0$$

$$\log(x) \text{ if } x = 0$$

throughput if j was M/M/1

if j was M/M/1

throughput if j

Input Queuing: Head-Of-Line Blocking

- fixed size packets
- no speed up (max 1 pack in 1 pack time)
- at most 1 pack to each output port in 1 pack time

HOL blocking reduces sys throughput to max val. 586 under symmetric traffic conditions

Overcoming HOL Blocking

- higher depth of look-ahead
- 1 pack / pack time

- VOQ (Virtual Output Queuing)

- separate input queues by class / output queue

→ for $N \times N$ switch, 2^N MxN matrix
 $\rightarrow 2_{ij} = \text{arr. rate at } i \text{ destined for } j$

→ $2 \in C$ if scheduling algo. s.t.
 $\lim_{t \rightarrow \infty} P(|q(t)| \geq L) = 0$

→ let $C = \{2 : 2 \geq 0, \sum_{i=1}^N 2_{ij} \leq 1 \forall j, \sum_{j=1}^N 2_{ij} \leq 1 \forall i\}$

Thm. if $2 \notin C$, no switch scheduling algo can support it

Max Weight Scheduling

$M^h = h^{\text{th}}$ matching & $M^h = 1$ if matched to j
 0 otherwise

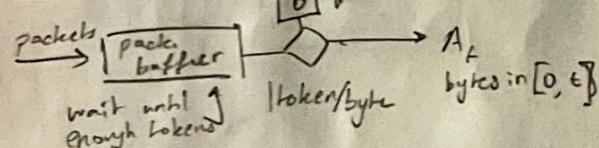
Switch finds matching $M(t)$ @ t s.t. of pack in queue

$M(t) = \arg \max_{M^h} \sum_{i,j} q_{ij}(t) \cdot M^h(i,j)$
 & transfers pack from $VOQ(i,j)$
 $\rightarrow j$ if there is a pack in this queue

Thm. MaxWeight Scheduling can support any arr. rate matrix Z s.t. $(1+\epsilon) + Z \in C$ for some $\epsilon > 0$

QoS

Leaky Bucket

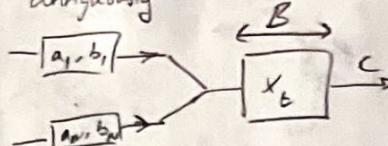


- Traffic shaping by limiting rate & burst size

$$A_{\text{rate}} - A_s \leq B + A_t \text{ bytes for } s, t \geq 0$$

Delay Bounds

- N input streams for a buffer, each leaky bucket shaped
- Each stream carries at most P bytes, and packets enter contiguously



Thm assume $a_1, \dots, a_n \in C$,

$$(a) X_t \leq b_1 + \dots + b_n + NP, t \geq 0$$

(b) delay of every packet n bounded by $(b_1 + \dots + b_n + NP + P)/C$

Generalized Processor Sharing (GPS)

- packets classified into K classes & wait in corresponding FIFO queues until transmission
- each class has weight w_k
- scheduler serves HOL packets @ rate prop. to weight
- service rate of k is $w_k C$ line rate out of queues currently backlogged

Thm assume traffic of k is regulated w/ (λ_k, B_k) s.t.

$$\lambda_k = \frac{w_k C}{w_k} \geq \alpha_k$$

⇒ backlog of k never exceeds B_k , queuing delay never exceeds β_k , Min Potential Delay Fairness!

$$\beta_k = \frac{B_k}{\lambda_k} \quad \mu_j = \frac{1}{\lambda_j}$$

Weighted Fair Queueing (WFQ)

- approximates GPS
- classified & queued as in GPS
- 1 pack at a time @ rate C
- when completes a transmission, starts transmitting GPS selected next pack

Thm let F_k & G_k be completion times of pack P_k under WFQ & GPS respectively, assume trans. time of pack $\leq T$

$$\Rightarrow F_k \leq G_k + T \quad k \geq 1$$

Optimization

sup - least upper bnd
 inf - greatest lower bnd

Utility Fns & Fairness

max-sum

↳ w/ $\alpha = 0$ maximize sum of indiv. rate

max-min

↳ maximize min of allocations $\alpha \rightarrow \infty$

Jackson Network

avg delay = avg arrival rate / avg arrival rate

$$\bar{x}_i = \bar{x}_i + \sum_{j=1}^J r(j,i) \text{ for } i=1, \dots, J$$

External arrival rate into i

when customer leaves i , he joins j w/ prob $r(i,j)$ & leaves

$$\text{new w/ prob } 1 - \sum_{j=1}^J r(i,j)$$

$$\text{for } t \geq 0, \bar{x}_i = (\bar{x}_{i1}, \dots, \bar{x}_{iJ})$$

$$\bar{x}_{it} = \# \text{ cust. @ node } i$$

multidim. CTMC

$$\text{Thm } \bar{x}_i^{\text{sol}} (2, \dots, 2_J) \text{ s.t. } 2_i \leq p_i$$

for $i=1, \dots, J$; then CTMC x_t admits

$$\pi(x_1, \dots, x_J) = \pi(x_1) \dots \pi(x_J)$$

$$\forall j, \pi_j(x) = (1-p_j)p_j^n \text{ for } n \geq 0$$

$$p_j = \frac{1}{2} \quad \mu_j = \frac{1}{\lambda_j}$$

$$U_r(x_i) = -\gamma x_i$$

w/ $\alpha = 2$, minimize $\sum_{j=1}^J \frac{1}{x_j}$

Graphs

any 2 imply 3rd

- G is connected

- G is acyclic/does not contain cycle

- G has $n-1$ edges

CTMC

X is a countable set

rate matrix

$$\text{blocking prob } \pi(S) = \frac{P^S / S!}{\sum_{n=0}^{\infty} P^n / n!}, \quad P = \frac{\lambda}{\mu}$$

$$Q = \{q(i,j); i, j \in X\} \subset \mathbb{R}$$

is s.t.

$$0 \leq q(i,j) < \infty \text{ for } i \neq j \in X$$

$$q(i) = -q(i,i) = \sum_{j \neq i} q(i,j) < \infty \quad \forall i \in X$$

let π_0 be init dist.

if $X_0 = i$, select random time τ from
exp dist w/ rate $q(i)$

let $X_\tau = i$ for $0 \leq t \leq \tau$

if $t = \tau$, X_t jumps to j indep. s.t.

$$P(X_\tau = j | X_0 = i \text{ and } \tau) = \frac{q(i,j)}{q(i)}$$

construction resumes @ $X_\tau = j$ same way

as $X_0 = i$ indep. of past

Q on X is irreducible iff $q(i) > 0 \forall i \in X$

& transition prob matrix $\Gamma(i,j) = \frac{q(i,j)}{q(i)}$ iff $i \neq j$,
is irreducible 0 if $i=j$

Thm

X_t is irreducible CTMC over X w/ rate matrix Q

iff π_0 inv (ie $P(X_t = i) = \pi(i)$)

$$\sum_{j \in X} \pi(j) q(i,j) = 0 \quad \forall j \in X \text{ (or } \pi Q = 0)$$

Thm

an irreducible CTMC has either no or exactly one inv. dist π_0 .
↳ if finite, then exact must be positive reals

Thm if CTMC has exactly one inv. dist π_0 ,
then for any init dist

$$\lim_{t \rightarrow \infty} P(X_t = i) = \pi(i) \quad \forall i \in X$$

$$\lim_{T \rightarrow \infty} \frac{1}{T} \int_0^T \mathbb{1}_{\{X_s = i\}} ds = \pi(i) \quad \forall i \in X$$

Poisson

arr rate λ , let $X_0 = 0$, let $X_t = \# \text{ arr. in } [0, t]$

$\Rightarrow X$ is a CTMC w/ $q(i,j) = -\lambda$ & $q(i,i+1) = \lambda$

$$P(\# \text{arr} = k) = \frac{e^{-\lambda t} (\lambda t)^k}{k!}, \quad k = 0, 1, \dots$$