

# Multi-Resource Generalized Processor Sharing for Packet Processing



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June 4, 2013

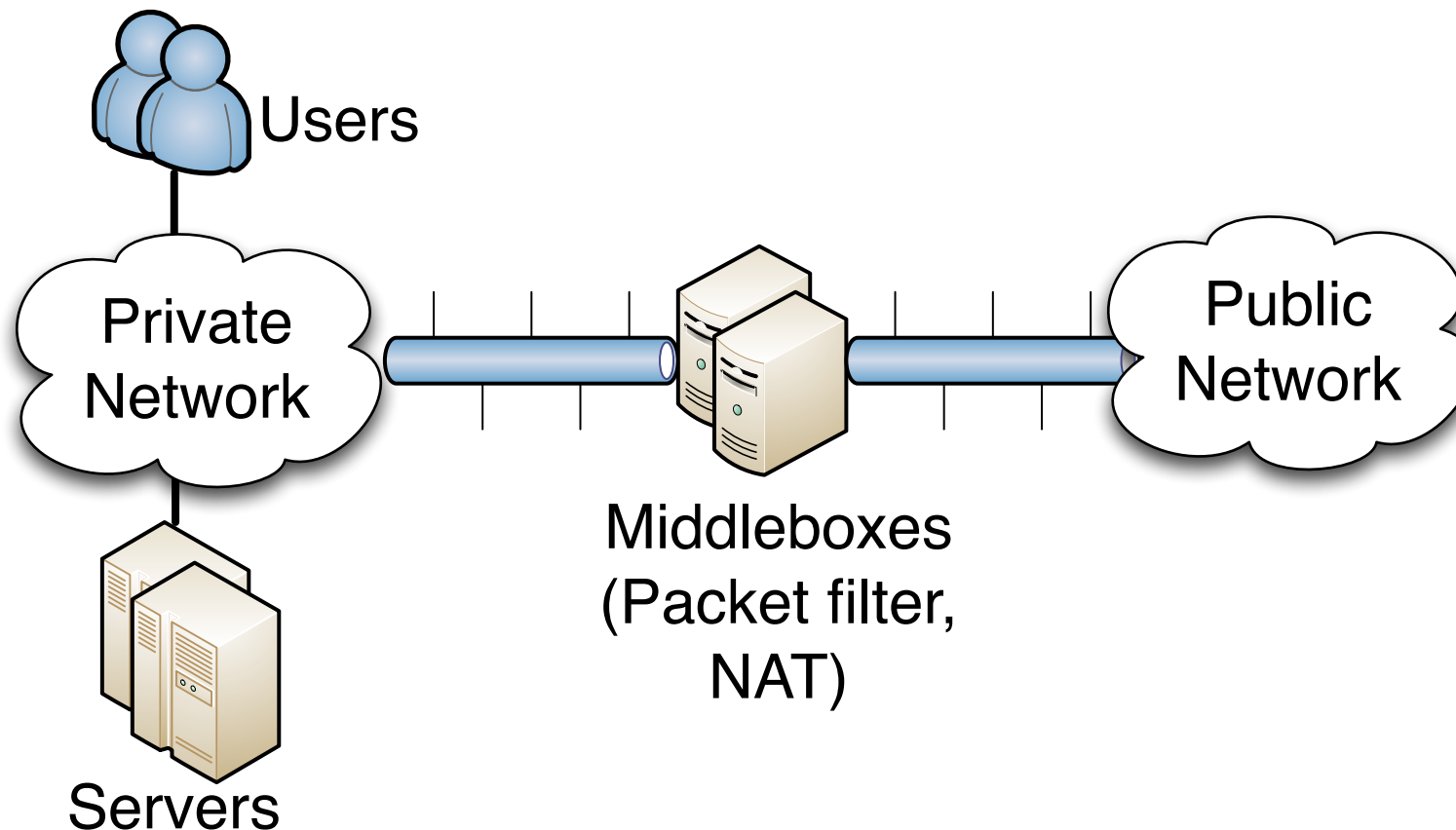
# Background

## Middleboxes (MBs) are ubiquitous in today's networks

The sheer number is on par with the L2/L3 infrastructures

## Perform a wide range of critical network functionalities

WAN optimization, intrusion detection and prevention, etc.

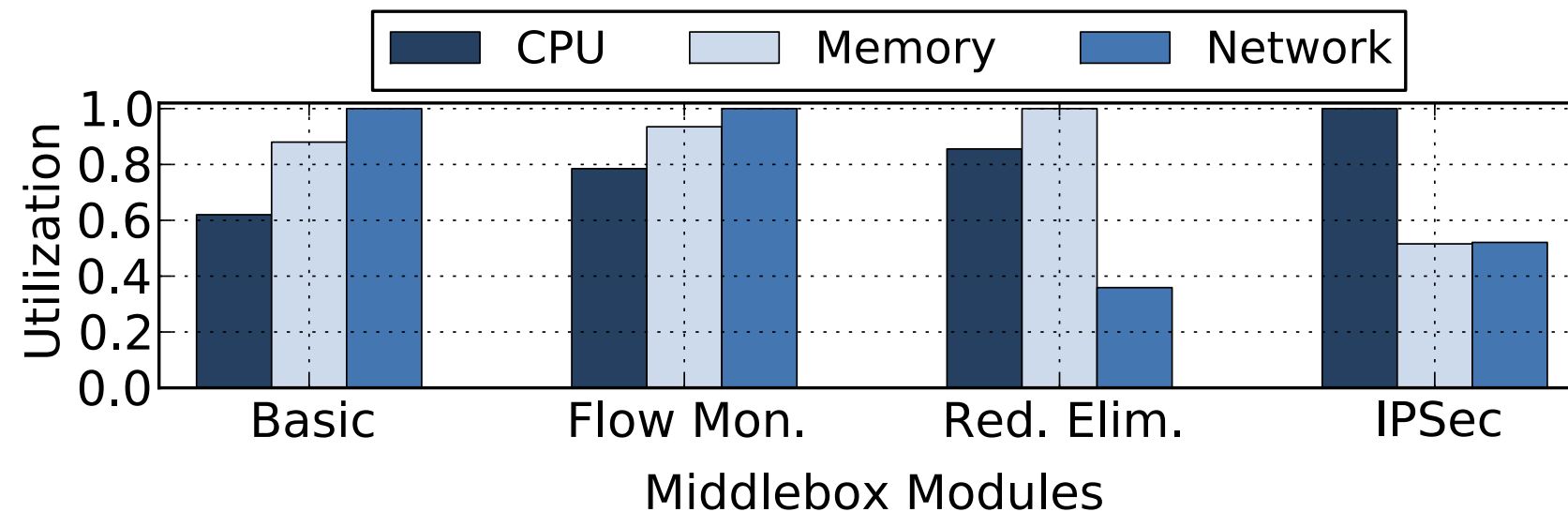


# Multi-Resource Packet Processing in MBs

Performing different network functionalities requires different amounts of MB resources

Basic Forwarding: Bandwidth intensive

IP Security Encryption: CPU intensive



Ghods et al SIGCOMM12

**How to let flows *fairly*  
share *multiple resources*  
for packet processing?**

# What do we mean by fairness?

Fair queueing can be defined via a set of highly desired scheduling properties

## Predictable service isolation

For each backlogged flow, the received service is *at least* at the level when *every resource is equally* allocated (or in proportion to the flow's weight)

# What do we mean by fairness? (Cont'd)

## Service isolation cannot be compromised by some strategic behaviours

A flow may cheat by asking for the amount of resources that are not needed

E.g., asking for more bandwidth by adding dummy payload to inflate the packet size

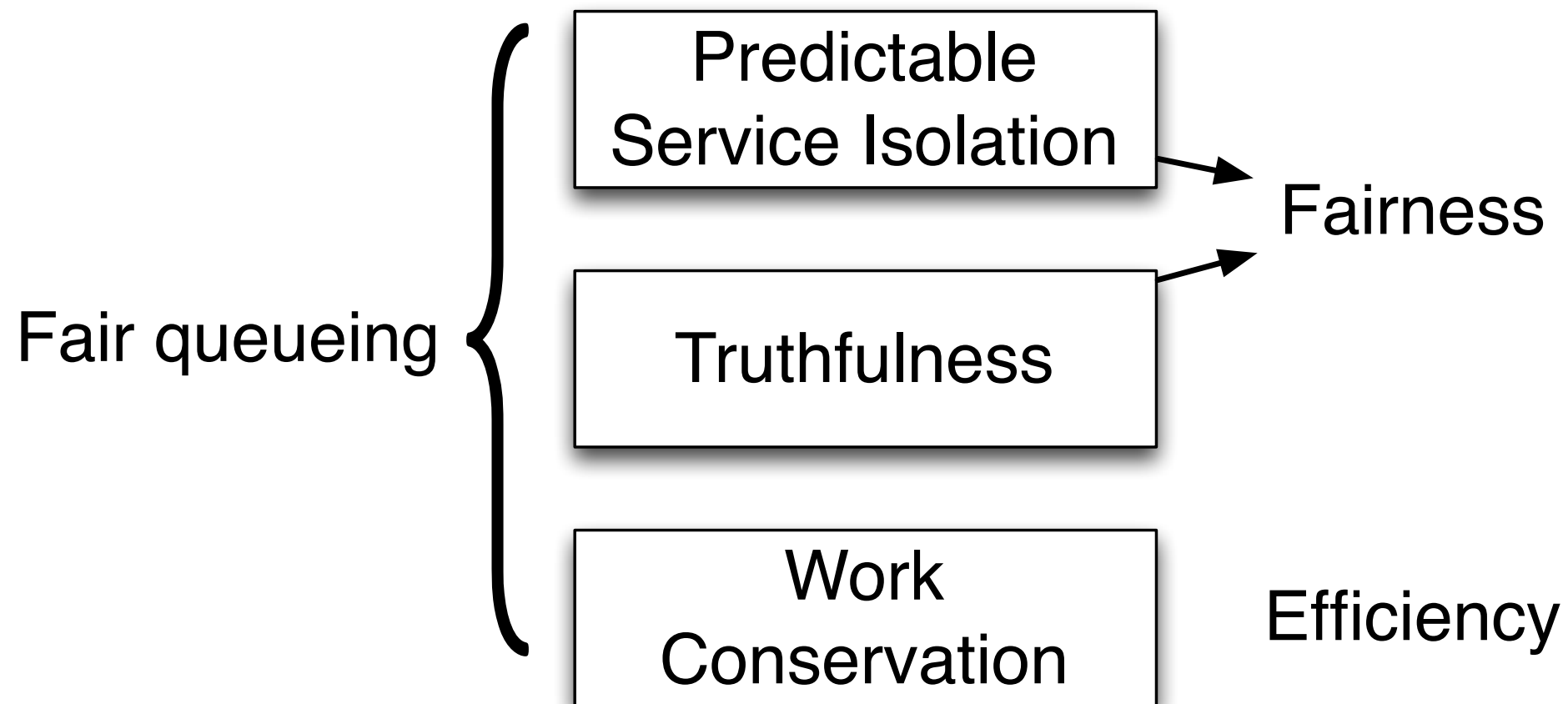
## Truthfulness (Strategy-proofness)

No flow can receive better service (*i.e.*, finish faster) by misreporting the amount of resources it requires

# What do we mean by fairness? (Cont'd)

## Work conservation

No resource that could be used to serve a busy flow is wasted in idle



# Multi-Resource Fair Queueing

**Simple fairness notion leads to unfairness in the multi-resource setting [Ghods12]**

Per-resource fairness

Bottleneck fairness

**A promising insight is suggested in [Ghods12]**

Dominant Resource Fairness (DRF)

Flows should receive roughly the same service on their most congested resources (DRFQ)



# Open Questions

**Is there a general guideline to design multi-resource fair queueing?**

**What's the benchmark for multi-resource fair queueing?**

Any GPS-like fair queueing benchmark?

**Can the techniques developed for the single-resource fair queueing be leveraged in the multi-resource setting?**

# Our Contribution

## Dominant Resource GPS (DRGPS)

An *idealized fluid fair queueing benchmark* that achieves all desired scheduling properties

**Clarify the design objective for practical queueing algorithms**

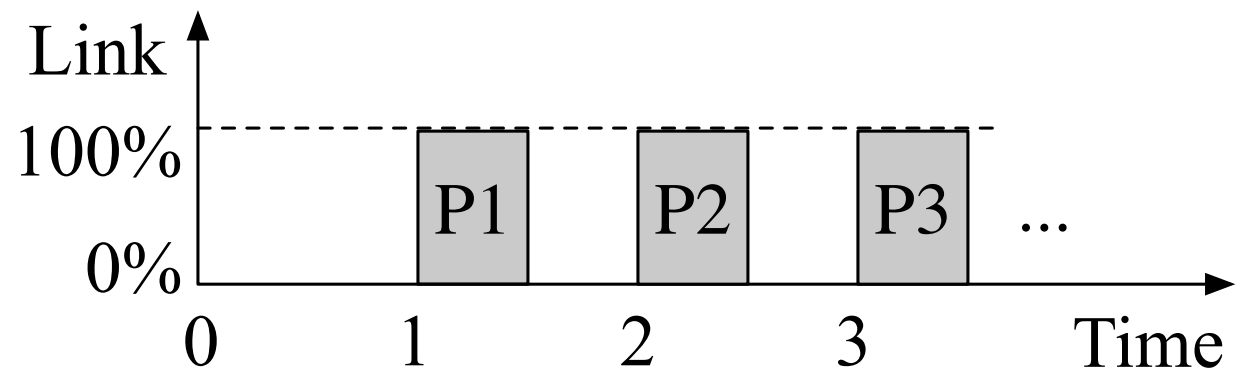
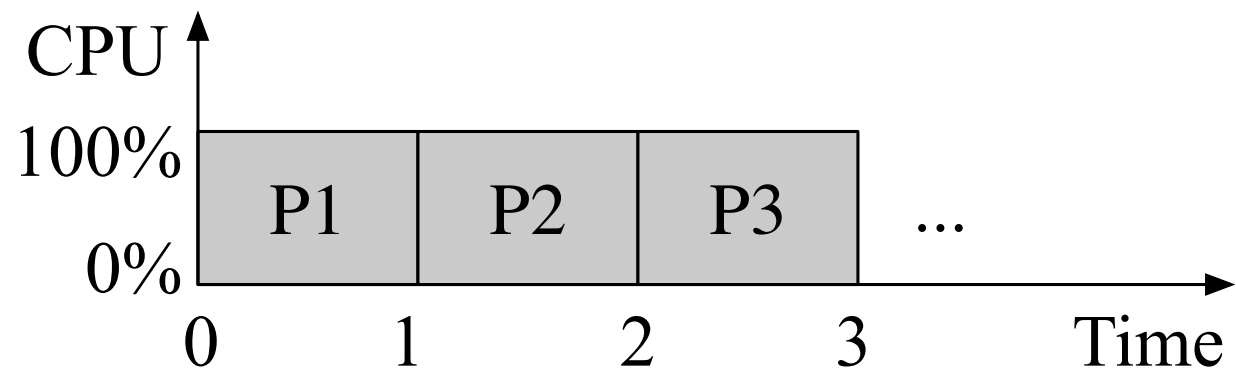
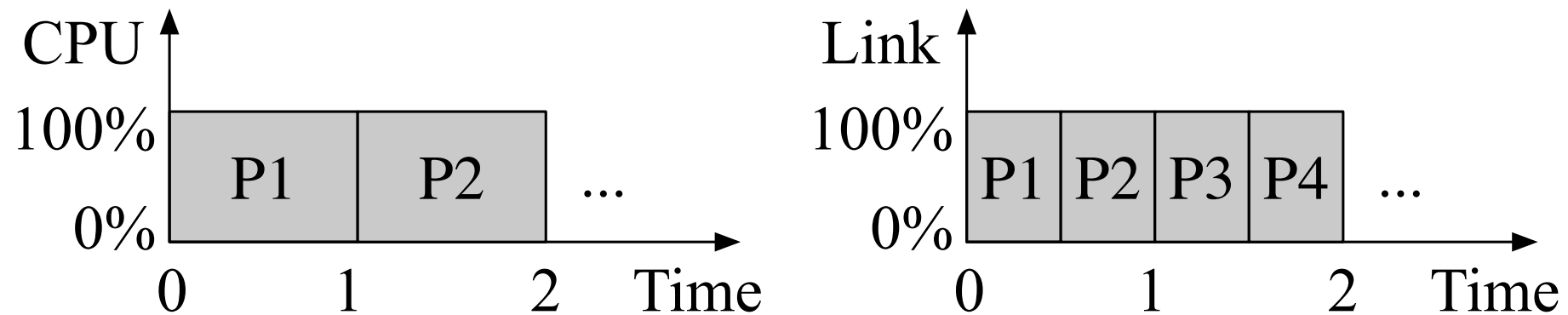
**Techniques developed for single-resource fair queueing algorithms can be leveraged in the multi-resource setting**

# DRGPS

# Resource Model

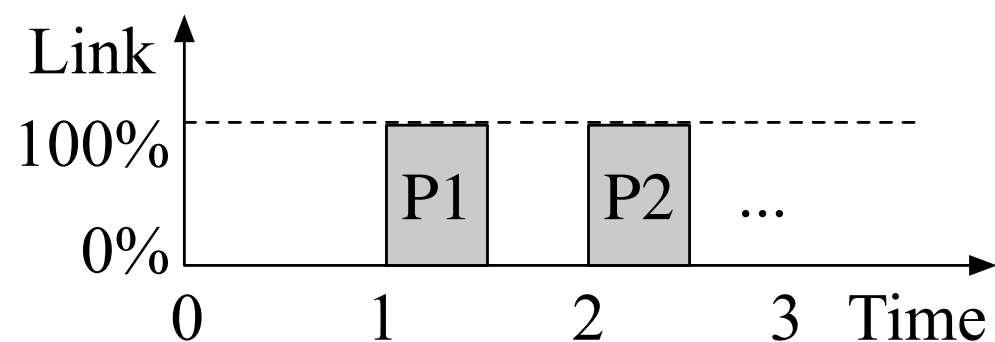
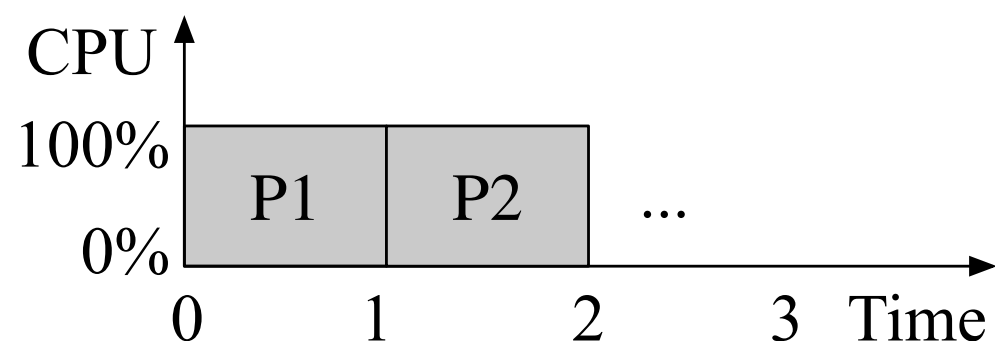
## Resources are scheduled in serial for packet processing

E.g., CPU first, followed by the link bandwidth



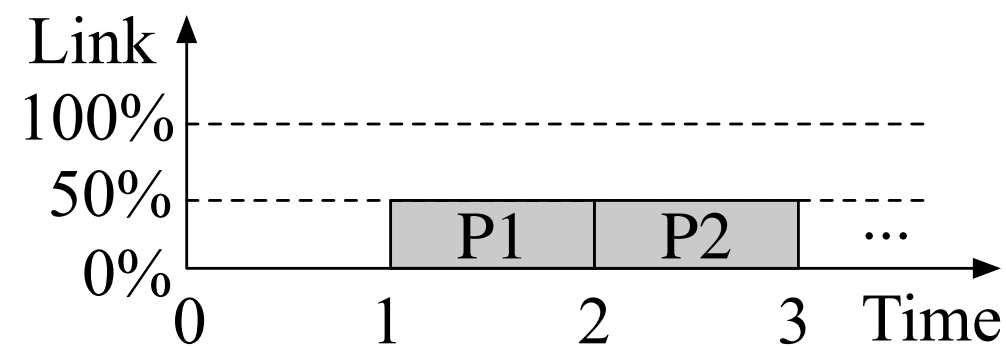
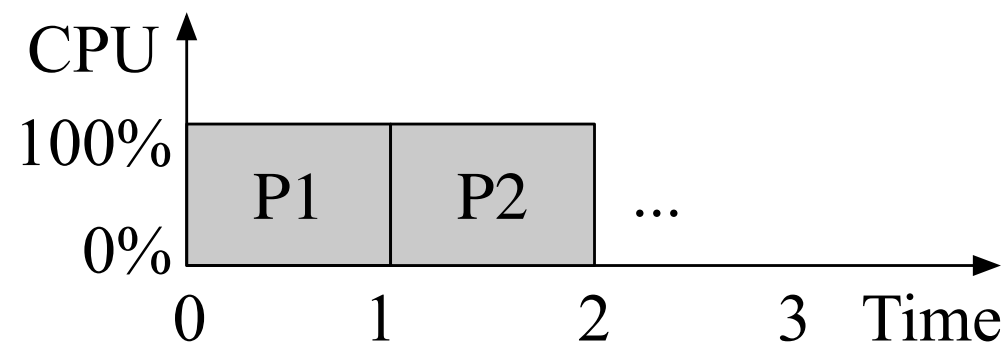
# Multi-Resource Fluid Flow Model

Assume packets can be served in arbitrarily small increments on every resource



(a)  $\langle 100\% \text{ CPU}, 100\% \text{ Link} \rangle$ .

50% link allocation is  
wasted

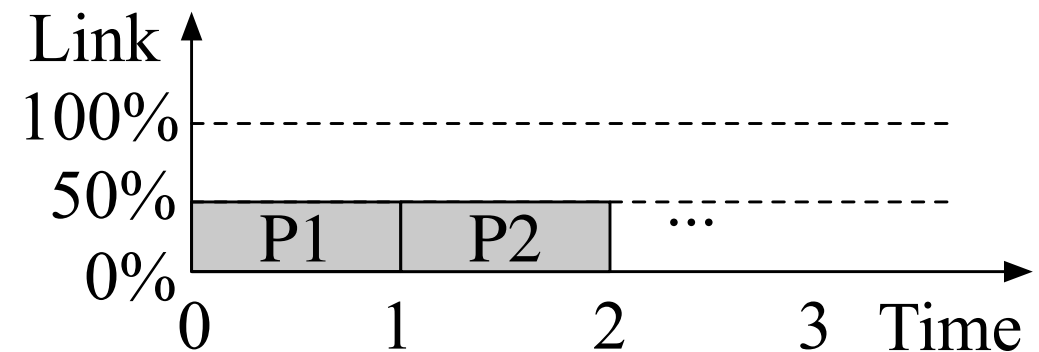
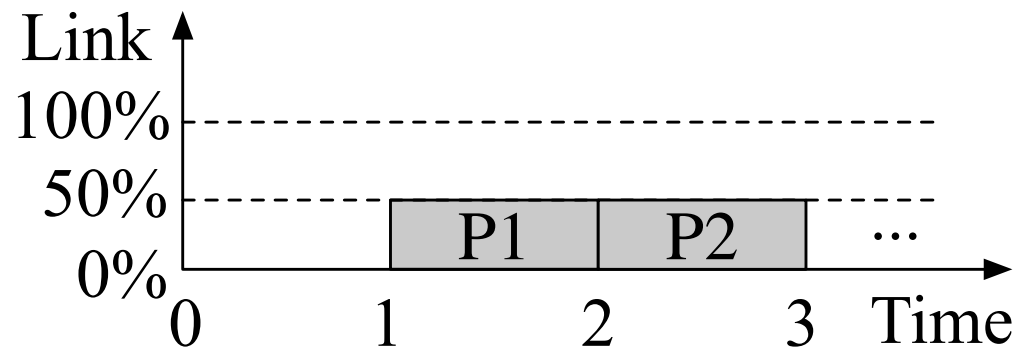
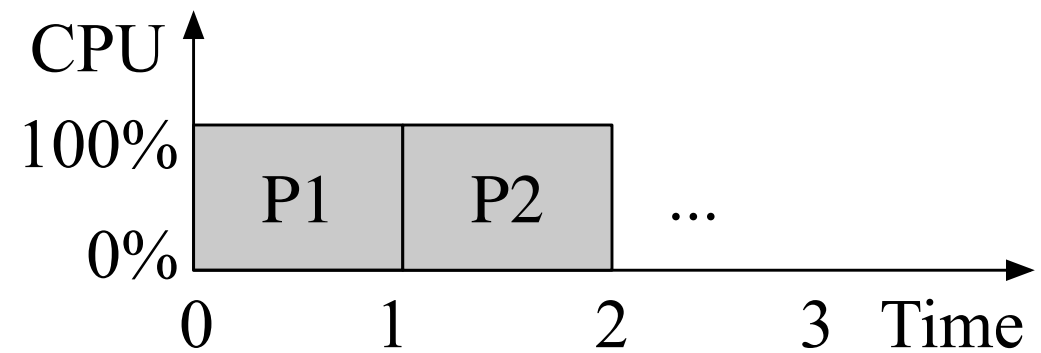
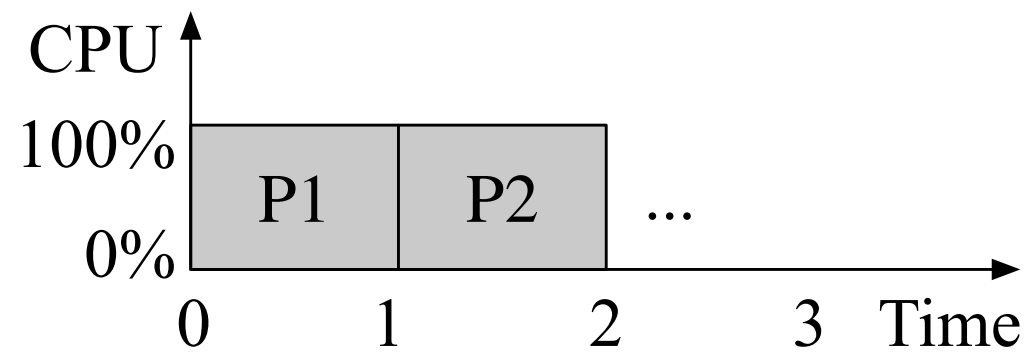


(b)  $\langle 100\% \text{ CPU}, 50\% \text{ Link} \rangle$ .

No resource allocation  
is wasted

# Non-wasteful allocation

Under non-wasteful allocation, we can view that all resources are consumed simultaneously, at the same rate



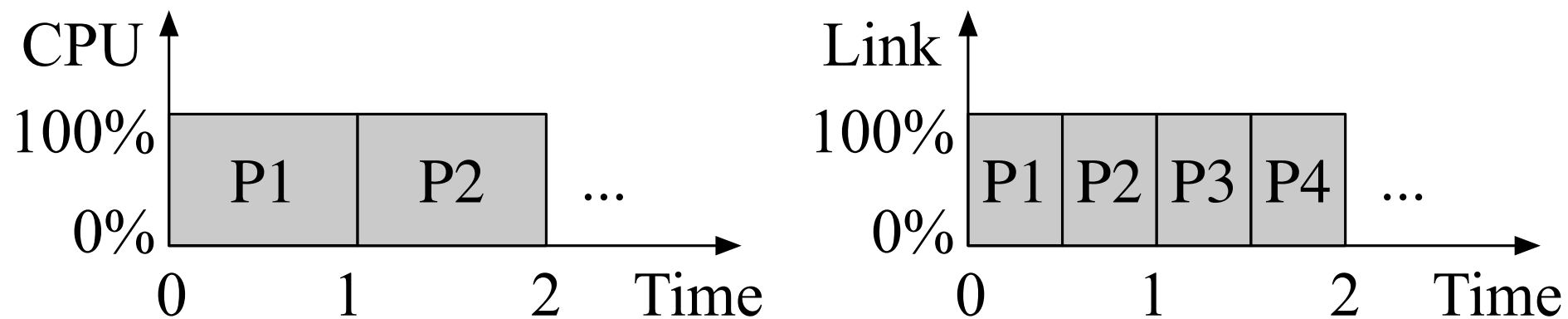
<100% CPU, 50% Link>

# Dominant Resource & Dominant Share

For a packet, its *dominant resource* is the one that requires the most packet processing time

E.g., Packet P1 has  $\langle \text{CPU time, Transmission Time} \rangle = \langle 1, 0.5 \rangle$

CPU is the dominant resource of P1



The *dominant share* is the fraction of dominant resource allocated to process the packet

E.g.,  $\langle 70\% \text{ CPU, } 60\% \text{ Link} \rangle$  is allocated to process P1

The dominant share of P1 is 70%

## Dominant Resource Fairness (DRF)

At any given time, every backlogged flow is allocated the same dominant share

Max-min fair on the dominant resource

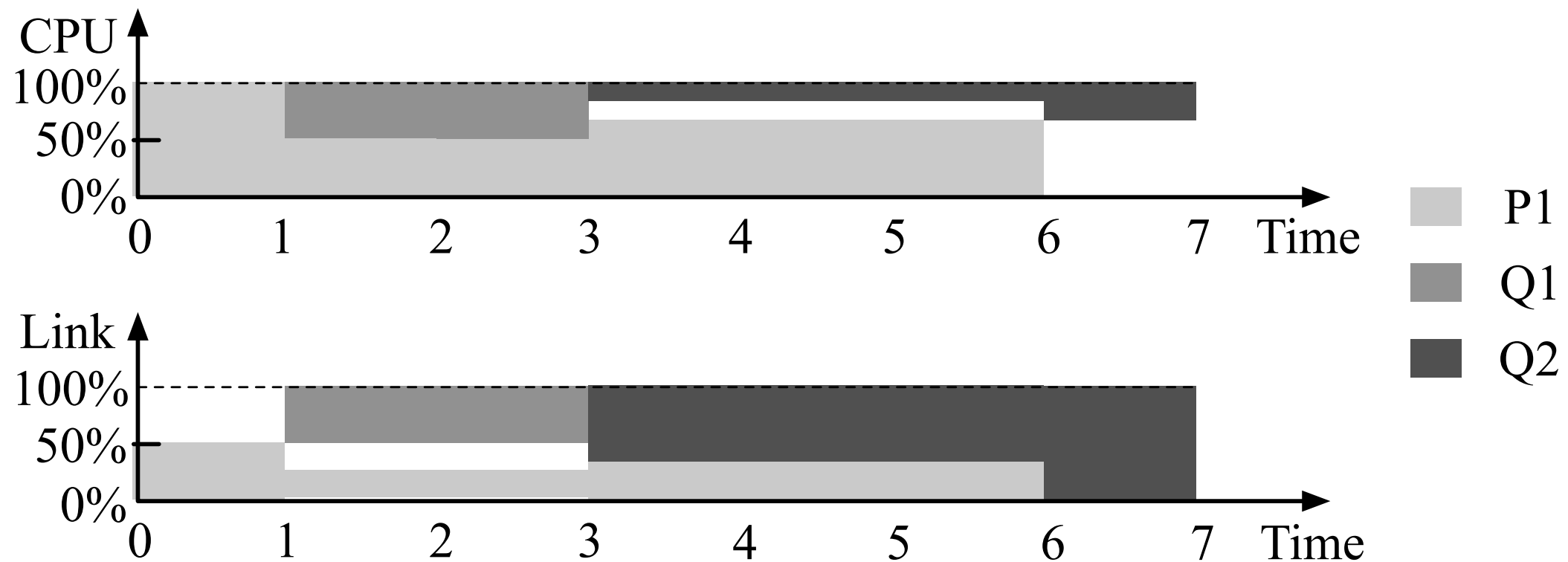
**DRGPS achieves the DRF allocation at all times!**



# DRGPS: An Example

TABLE I  
RESOURCE PROFILES OF PACKETS IN TWO FLOWS.

Packet	Flow	Arrival Time	$\langle \text{CPU, Link} \rangle$
P1	Flow 1	0	$\langle 4, 2 \rangle$
Q1	Flow 2	1	$\langle 1, 1 \rangle$
Q2	Flow 2	2	$\langle 1, 3 \rangle$



# Properties of DRGPS

## DRGPS achieves all desired scheduling properties

Predictable service isolation

Truthfulness

Work conservation

## DRGPS therefore serves as an *idealized* fluid fair queueing benchmark in the multi-resource setting

*Cannot* be implemented because packets are assumed to be infinitely divisible

# Packet-Based Multi-Resource Fair Queueing

# DRGPS offers a design guideline

## Leverage the design techniques developed for the traditional single-resource fair queueing

Schedule packets by emulating DRGPS

WFQ, WF<sup>2</sup>Q, FQS can have direct extensions to multiple resources

Approximate DRGPS without strict emulation

Estimate the work progress (virtual time) of DRGPS, e.g., SCFQ, SFQ, etc.

DRFQ [Ghodsi12] is a multi-resource SFQ extension

Serve flows in a simple round-robin fashion

Deficit Round Robin (DRR), Smoothed Round Robin (SRR), Stratified Round Robin (StRR)

# Schedule packets by emulating DRGPS

# Emulating DRGPS in Real-Time

**DRGPS can be accurately emulated by stamping two service tags upon packet arrival**

**Virtual time  $v(t)$**

Tracks the work progress of DRGPS

**Virtual starting time**

The virtual time when the packet arrives the system

**Virtual finishing time**

The virtual time when packet finishes service under the DRGPS system

# Emulating DRGPS in Real-Time (Cont'd)

**Proposition 4:** Under DRGPS, for every flow  $i$ , its virtual starting and finishing times satisfy the following relationship:

$$\begin{aligned} S_i^k &= \max\{F_i^{k-1}, v(a_i^k)\} , \\ F_i^k &= \tau_{i,r_i^{k*}}^k / w_i + S_i^k , \end{aligned} \tag{14}$$

where  $F_i^0 = 0$  for all flow  $i$ .

# Emulating DRGPS in Real-Time (Cont'd)

**Upon a packet arrival, both the starting time and the finishing time are stamped to the packet**

**With the service tags, the scheduling results of DRGPS can be fully recovered**

Just like how GPS is emulated in the single-resource setting



# Schedule Packets by Emulating DRGPS

**A referencing DRGPS system is maintained in background**

**Many scheduling choices are available**

Packet that *finishes service the earliest* in the reference DRGPS system is scheduled first, e.g., WFQ, PGPS

Packets that *starts service the earliest* in the reference DRGPS system is scheduled first, e.g., FQS

Imposing some admission control policy, e.g., WF<sup>2</sup>Q

# **A Case Study: Dominant Resource WF<sup>2</sup>Q**

# Dominant Resource WF<sup>2</sup>Q (DRWF<sup>2</sup>Q)

A referencing DRGPS system is maintained in background

Whenever there is a scheduling opportunity

Packets that already started their service under the referencing DRGPS system are *eligible* for scheduling

Among them, the one that *finishes the earliest* will be scheduled

# A Running Example

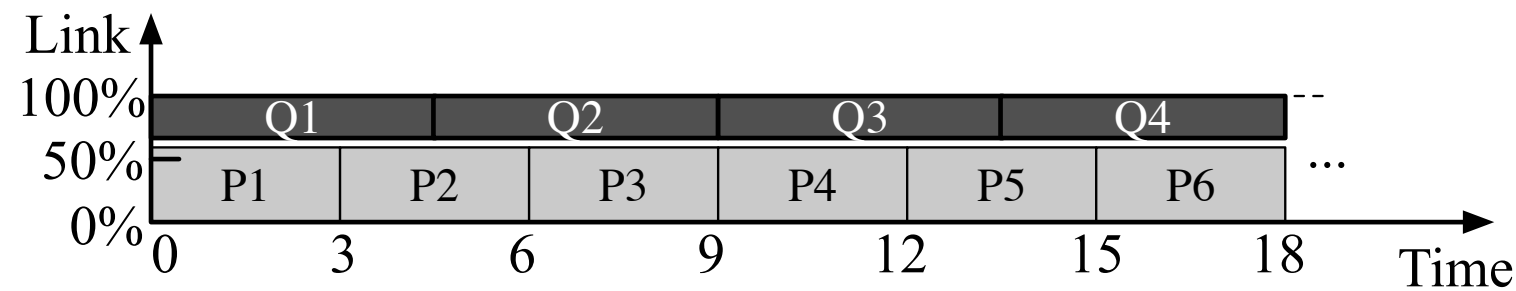
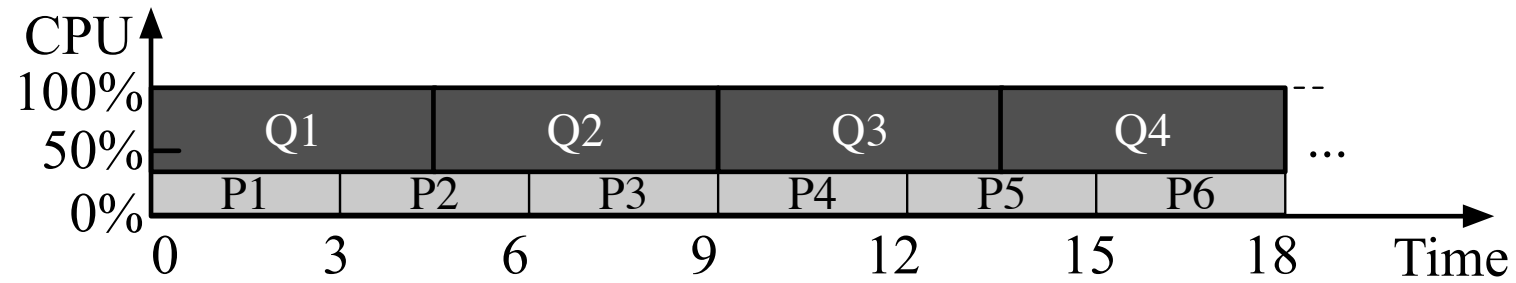
## Flow 1 sends P1, P2, ...

Each packet requires <1 CPU time, 2 Transmission Time>

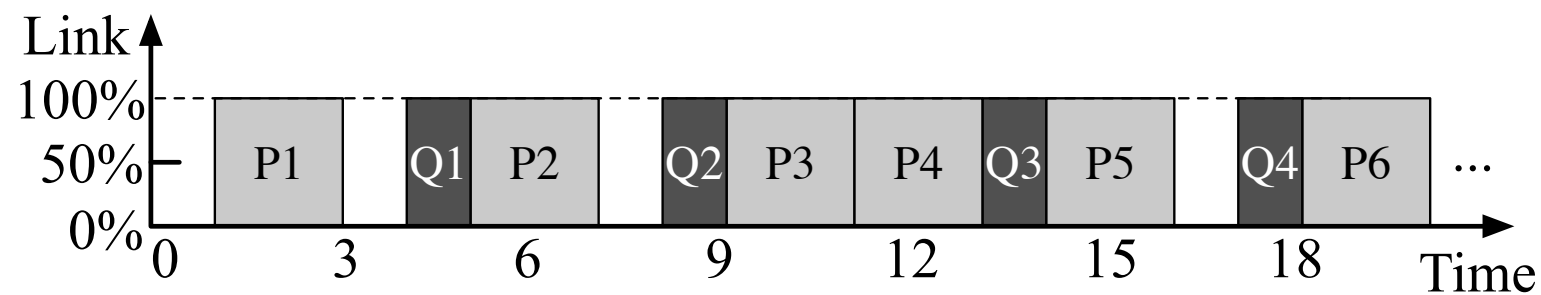
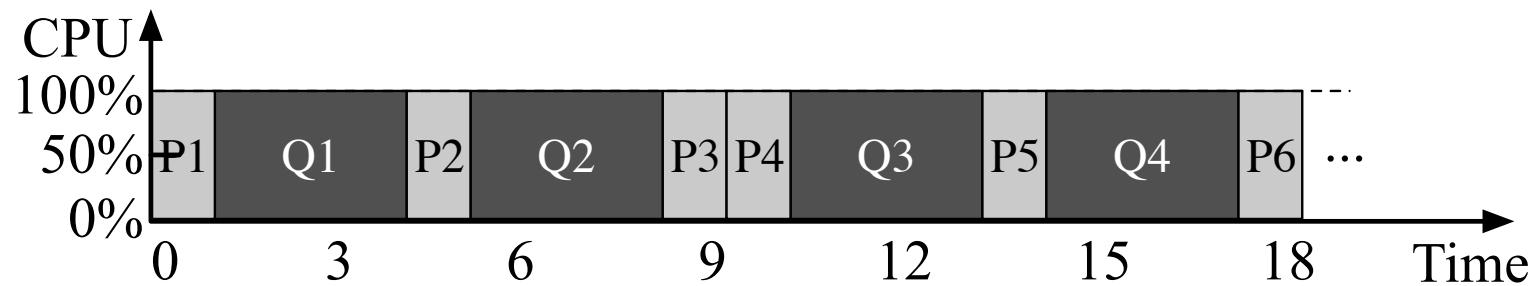
## Flow 2 sends Q1, Q2, ...

Each packet requires <3 CPU time, 1 Transmission Time>

# A Running Example



(a) Scheduling outcome under DRGPS.



(b) Scheduling outcome under DRWF<sup>2</sup>Q.

# Fairness Measure

## Relative fairness bound (RFB)

$$R = \sup_{t_1, t_2; i, j \in \mathcal{B}(t_1, t_2)} \left| \frac{T_i(t_1, t_2)}{w_i} - \frac{T_j(t_1, t_2)}{w_j} \right| .$$

**DRGPS has RFB = 0**

# Fairness of Dominant Resource WF<sup>2</sup>Q (DRWF<sup>2</sup>Q)

**Proposition 6:** Under DRWF<sup>2</sup>Q, for any two flows  $i$  and  $j$  that are backlogged in  $(t_1, t_2)$ , we have

$$\left| \frac{T_i(t_1, t_2)}{w_i} - \frac{T_j(t_1, t_2)}{w_j} \right| \leq 4 \max \left\{ \frac{\tau_i^{\max}}{w_i}, \frac{\tau_j^{\max}}{w_j} \right\}. \quad (23)$$

**Corollary 1 (RFB):** The RFB of DRWF<sup>2</sup>Q is

$$R = 4 \max_i \left\{ \frac{\tau_i^{\max}}{w_i} \right\}.$$

# Conclusion

## **DRGPS generalizes GPS to the multi-resource setting in MBs**

Offers perfect service isolation that is immune to any strategic behaviours and is work conserving as well

Serves as a perfect multi-resource fair queueing benchmark to which all practical alternatives should approximate

**With DRGPS, techniques developed for traditional fair queueing can be leveraged to the multi-resource setting**

**We design DRWF<sup>2</sup>Q as a case study and analyze its fairness performance**



# Thanks!

<http://iqua.ece.toronto.edu/~weiwang/>