### Virtual Machines Recap

- OS development
- Allow multiple OS'es to run concurrently on same hardware (independent upgrade paths)
- Encapsulate execution environment for application stability
- Resource isolation in multi-tenant data centers
- Data center management: server consolidation, migration, checkpointing

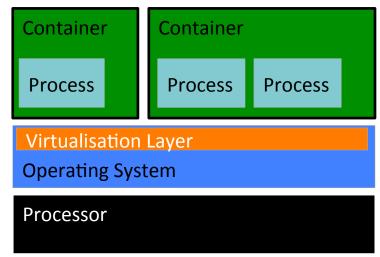
### Motivation: overhead of isolation

- VMs are great for isolation, but have significant overheads
  - resource overheads: disk (GBs) and memory (512 MB+) per VM
  - runtime overheads: CPU virtualization, I/O virtualization, etc.
  - administrative overheads: one new OS to manage per VM
  - ingress/egress overheads: moving large VHDs to/from the cloud
- ...but they offer great benefits!
  - Securely isolate guest from host
  - Support live migration
  - Only (?) isolation mechanism strong enough to enable the cloud
- Can we retain their benefits with less overhead?
  - Most apps don't need to see virtualized hardware
  - Most apps don't require their own OS + drivers

### **OS Containers**

OS kernel modified to virtualise at syscall interface

- Files
- Networking
- PIDs
- IPC
- User & group IDs
- **—** ...



- Additional controls on resource allocation
  - Not just best effort
- e.g. Docker, Solaris Zones, ...

# Container Example: UNIX stat

```
stat structure, which contains the
/* ID of device containing file */
/* inode number */
/* protection */
/* number of hard links */
/* user ID of owner */
/* group ID of owner */
/* device ID (if special file) */
/* total size, in bytes */
/* blocksize for filesystem I/O */
/* number of 512B blocks allocated */
```

### **Linux Containers History**

### Chroot

- Change the root of file system
- Originally to develop new software releases
- Jail
  - Execute process with restricted set of system calls
  - Ex: postscript viewer in web browser
- Namespaces/cgroups
  - Restrict process visibility and resource usage
  - Per-container network address translation

# Containers pros/cons

- Much lower overhead
  - Only one copy of the OS kernel
  - Single level of address translation
  - Drivers not an issue trusted in the host OS
- Tight(er) coupling between guest/host
  - Can't run different guest OS
  - Harder to encapsulate and migrate state
- ... but are they secure?
  - Full OS kernel and drivers in TCB of all containers
  - Syscall interface more complex than VM interface

### Threat models for isolation

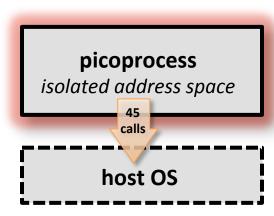
- Traditional enterprise ("friendly multi-tenant") threat model: employees run code of their choosing on your system
- Cloud (multi-tenant) threat model: anonymous hackers with unlimited access run any code of their choosing on your systems, alongside your most valued customers
  - Do you trust an OS kernel to isolate them?
  - Do you even trust a hypervisor to isolate them?

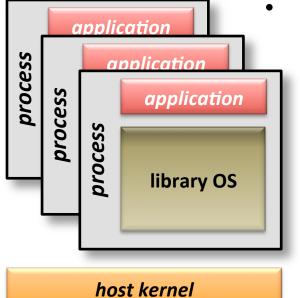
# What's the Drawbridge approach?

- Key design philosophy:
  - Start with a tight, secure isolation boundary
  - Add app compatibility *inside* isolation container
  - Not plugging holes in a leaky but compatible interface
- Key components:
  - The *picoprocess*, an isolation mechanism
  - The library OS, a compatibility mechanism

# Picoprocesses and library OSes

- *Picoprocess*: concept introduced by MSR's Xax project (Douceur et al., 2008)
  - Isolated address space with a very small, fixed interface with its host
  - Lightweight, secure isolation container

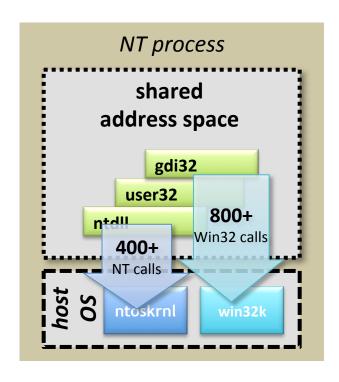


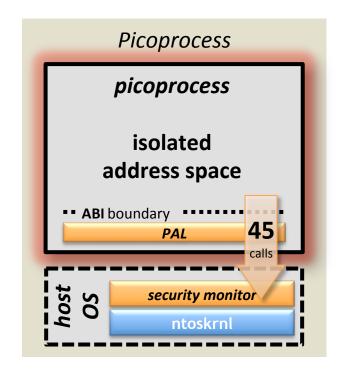


- **Library OS**: concept championed in CS community in the '90s (Engler et al., 1995)
  - Minimal, shared kernel runs in supervisor mode
    - Multiplexes and abstracts hardware resources
    - Enforces cross-application protection
  - Per-app library OS runs in user mode
    - Constitutes OS "personality"
    - Provides application services and APIs to application
    - Runs in application's address space (user mode)
    - Each app can choose its own library OS

# Drawbridge picoprocess on NT

- NT process with modified service handler
  - All 1200+ system calls blocked from user-mode (NTOS and win32k)
  - 45 new system calls added to process (Drawbridge system calls)





### The Drawbridge ABI

- Drawbridge ABI: interface between a Drawbridge picoprocess and its host
  - 45 downcalls, 3 upcalls everything else is off-limits
  - Designed from scratch, but heavily inspired by NT
  - APIs have fixed, closed semantics (no IOCTLs)
- Analogous to VM host/guest interface, but with higher-level abstractions
  - threads (not virtual CPUs)
  - virtual memory (not physical memory)
  - I/O streams (not virtual device hardware)
- Design benefits:
  - security interface is small enough to undergo manual review / inspection
  - portability Windows apps run unmodified on any system that implements 45 functions
  - flexibility interface allows app's state to live (almost) entirely in process

### Drawbridge ABI

(excerpt)

#### **Threading**

DkThreadCreate DkSemaphoreCreate DkSemaphorePeek DkSemaphoreRelease DkObjectsWaitAny

. .

#### **Memory management**

DkVirtualMemoryAllocate DkVirtualMemoryFree DkVirtualMemoryProtect

#### I/O streams

DkStreamOpen DkStreamRead DkStreamWrite DkStreamMap DkStreamFlush

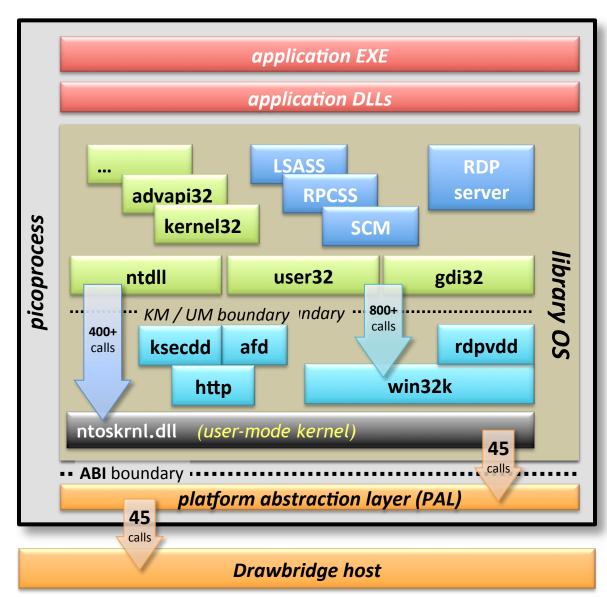
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#### **Upcalls**

LibOsThreadStart LibOsExceptionDispatch

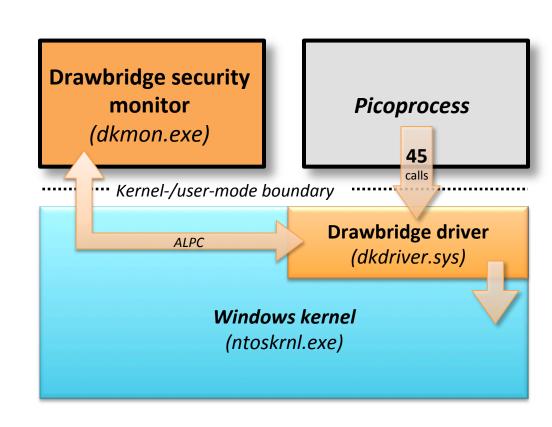
# The Windows library OS

- Based on Windows OS
  - Same binaries (where possible)
  - Same architecture
- Windows enlightened to run in a picoprocess with the app
  - lifted into user mode
  - most changes in user-mode kernel
- Example library OS: Win7 SP1
  - 100MB on disk (~150 DLLs)
  - 16MB of working set + app
  - 5.5+ MLoC for 15,000+ Win32
     APIs
- Each picoprocess runs its own library OS
  - app chooses its library OS
  - version need not match across picoprocesses or host



# The Drawbridge-on-Windows host

- Drawbridge host implements 45-function ABI atop Windows
- Analogous to Hyper-V's hypervisor + virtualization stack
- Split between kernelmode driver and usermode worker
  - Driver implements ABI
  - Driver consults security monitor for policy decisions



# The Drawbridge security monitor

- **Security monitor** user-mode half of Drawbridge host
  - launches app in picoprocess
  - makes access policy decisions
  - "normal" NT process
- Policy decisions based on manifests
  - All external resources are blocked by default
  - Resources can be white-listed back in by admin
  - Access specified via virtual to physical namespace mappings

Drawbridge security monitor

(dkmon.exe)

### Sample Policy

### Drawbridge packages

- Drawbridge package self-contained, self-describing unit of deployment
- A package contains:
  - Manifest
    - Identity (name, version, options)
    - Dependencies on other packages
    - Access control policy requirements
    - Relative paths to important contained files (e.g. app EXE)
  - Files
  - Registry data (.reg format)
  - Debug resources (e.g. symbols, etc.)
- Everything's a package: app, library, library OS, suspended app
- Security monitor resolves transitive closure of packages and dependencies
  - File content from packages is unioned into virtual FS
  - Registry content from packages is unioned into virtual registry
  - Packages are read-only, mapped copy-on-write

### Sample Manifest

#### [Package]

ManifestVersion=1
PackageRevision=4

#### [Identity]

Name=IISWorker
MajorVersion=7
MinorVersion=5
BuildNumber=7601
Architecture=x64

#### [Dependency.Win7]

Name=Windows MajorVersion=6 MinorVersion=1

#### [Dependency.CLR4]

Name=MicrosoftNET MajorVersion=4 MinorVersion=0

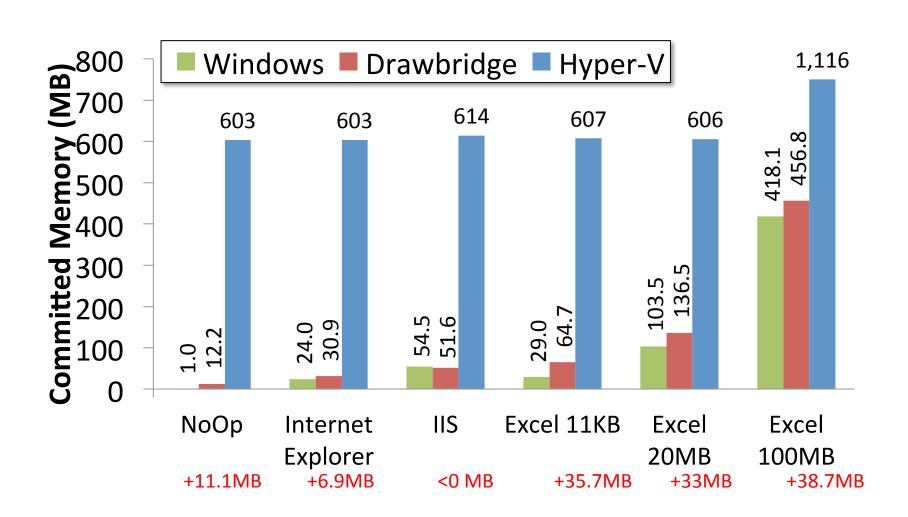
#### [Windows.Application]

Exe=package://windows/
system32/inetsrv/w3wp.exe

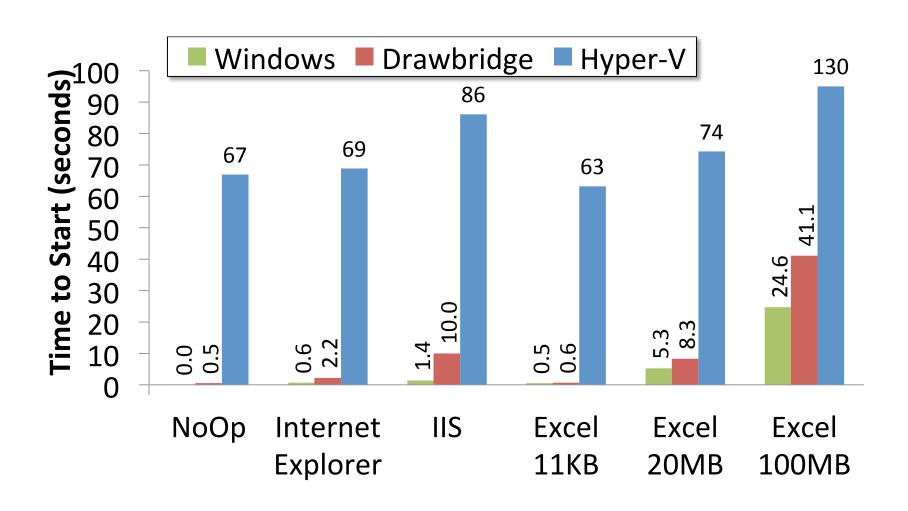
#### [Windows.Registry]

File:///w3wp.exe.dbreg

### Committed Memory by Apps



# Time to Start Application Package



# Scheduling

### Multilevel Scheduling Examples

- Virtual machine abstraction: no information about underlying resource sharing
- Spark task assignment: how should it partition mapreduce or ML tasks?
  - One per server? What if some servers are busier/ slower than others? What if some partitions take more time than others?
  - Many partitions per server? More overhead, more communication
  - How does OS scheduler know which task will be last?

### Multilevel Scheduling

- Process abstraction: no information about physical resources
- Parallel application: how should it split its work?
  - One thread per hyperthread? One thread per core? What if thread takes a page fault?
  - Many threads per hyperthread? More coherence traffic, more overhead. What if many competing tasks?
  - How does application tell kernel which thread to run first? What if task priority is dynamic?

### Multilevel Scheduling

- Virtual machine abstraction: guest OS has no information about physical memory
- Host OS chooses a page to evict; writes changes to physical disk
- Guest OS chooses same page to evict; writes changes to virtual disk, faulting in physical page
- VMWare balloon driver communicates resource usage across host/guest OS boundary

### Multilevel Scheduling

- Virtual memory: application has no information as to which pages are in physical memory
- OS evicts unused pages, writes changes to disk
- Application uses a garbage collector: some pages are in use, some unused, some garbage
- Application coalesces used data, collects garbage
- Unused garbage pages evicted to disk, brought back in for GC, empty pages re-written to disk

# Multilevel Scheduling Revisited

- Many (!) cases where a layer wants to do its own resource management
- But runs on another layer that provides abstraction of virtual resources
- Solutions?
  - Live with it
  - Change the API

### Mach External Pager

- When Mach chooses a page to evict, it upcalls to an external pager to do the eviction
  - Original motivation: allow paging over network
- External pager can choose a different page to evict
  - user-level access to page use/modify bits in VTx
  - Kernel only decides how many pages per app
  - Self-paging => better isolation

### Scheduler Activations

- Kernel allocates processors to apps
- User-level threads, scheduled at user level
  - Faster! No kernel trap for blocking locks, CVs
  - User-level control over priorities
- Kernel upcalls
  - When new processor is assigned
  - (on different CPU) when processor is taken away
  - Syscall/page fault blocks in kernel

### Scheduler Activation Mechanism

- Example: user-level thread does file read, misses in buffer cache, blocks in kernel
- Normal
  - save kernel context, switch to new thread
  - When I/O completes, switch back
- New:
  - Save kernel context, create new thread to do upcall, switch to that thread
  - When I/O completes, complete syscall, then upcall
  - Advanced version: pipeline upcall events

# Transparent Asynch I/O

- Many kernels have both synch and asynch I/O
  - Synch: syscall blocks until operation completes
  - Asynch: syscall returns immediately, kernel thread completes operation in background, upcall when done
- Implementation: Synchronous syscall with upcall
  - If blocks, do upcall; user lib schedules new thread
  - When I/O completes, complete syscall
  - When done, "return" by doing another upcall
  - User lib runs the user-level syscall return

# Scheduling

- Policy: what to do next, when there are multiple threads ready to run (or packets, or web requests, or ...)
- Uniprocessor policies
  - FIFO, round robin, optimal
  - multilevel feedback as approximation of optimal
- Multiprocessor policies
  - Affinity scheduling, gang scheduling
- Queueing theory
  - Can you predict/improve a system's response time?
- Control theory
  - How to achieve response time goals, tail latency, ...

### Example

- You manage a web site, that suddenly becomes wildly popular. Performance starts to degrade. Do you?
  - Buy more hardware?
  - Implement a different scheduling policy?
  - Turn away some users? Which ones?
- How much worse will performance get if the web site becomes even more popular?

### **Definitions**

- Task/Job
  - User request: e.g., mouse click, web request, shell command, ...
- Latency/response time
  - How long does a task take to complete?
- Tail latency
  - How consistent is task response time?
- Throughput
  - How many tasks can be done per unit of time?
- Overhead
  - How much extra work is done by the scheduler?
- Fairness
  - How equal is the performance received by different users?
- Strategy-proof
  - Can a user manipulate the system to gain more than their fair share?

### **More Definitions**

- Workload
  - Set of tasks for system to perform
- Preemptive scheduler
  - If we can take resources away from a running task
- Work-conserving
  - Resource is used whenever there is a task to run
  - For non-preemptive schedulers, work-conserving is not always better
- Scheduling algorithm
  - takes a workload as input
  - decides which tasks to do first
  - Performance metric (throughput, latency) as output
  - Only preemptive, work-conserving schedulers to be considered

### First In First Out (FIFO)

- Schedule tasks in the order they arrive
  - Continue running them until they complete or give up the processor
- Example: memcached
  - Facebook cache of friend lists, ...

On what workloads is FIFO particularly bad?

# Shortest Job First (SJF)

- Always do the task that has the shortest remaining amount of work to do
  - Often called Shortest Remaining Time First (SRTF)

- Suppose we have five tasks arrive one right after each other, but the first one is much longer than the others
  - Which completes first in FIFO? Next?
  - Which completes first in SJF? Next?

### FIFO vs. SJF

Tasks	FIFO	
(1)		
(2)		
(3)		
(4)		
(5)		
Tasks	SJF	
(1)		
(2)		
(3)		
(4)		
(5)		
		·
	Time	

### Question

Claim: SJF is optimal for average response time

- Why?

Does SJF have any downsides?

### Question

• Is FIFO ever optimal?

• Pessimal?

### Starvation and Sample Bias

- Suppose you want to compare two scheduling algorithms
  - Create some infinite sequence of arriving tasks
  - Start measuring
  - Stop at some point
  - Compute average response time as the average for completed tasks between start and stop
- Is this valid or invalid?

### Sample Bias Solutions

- Measure for long enough that # of completed tasks >> # of uncompleted tasks
  - For both systems!
- Start and stop system in idle periods
  - Idle period: no work to do
  - If algorithms are work-conserving, both will complete the same tasks

### Tail Latency

- What if we are optimizing for tail latency and not average responsiveness?
- Minimize max response time?
  - FIFO? Longest job first?
- SLA: minimize % over max response time?
  - FIFO or SJF with early discard?
- Min-max inflation factor in response time?
  - Round Robin

### Round Robin

- Each task gets resource for a fixed period of time (time quantum)
  - If task doesn't complete, it goes back in line
- Need to pick a time quantum
  - What if time quantum is too long?
    - Infinite?
  - What if time quantum is too short?
    - One instruction -> Hyperthreading!

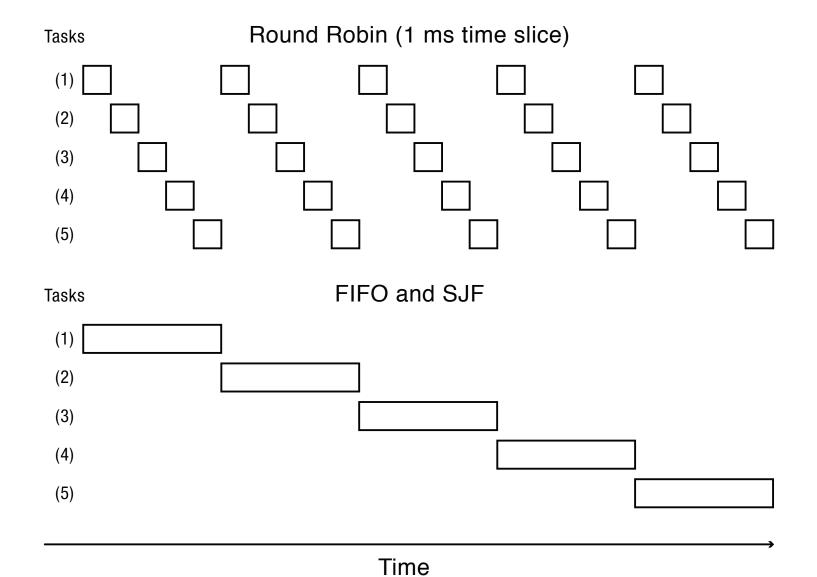
### **Round Robin**

Tasks	Round Robin (1 ms time slice)		
(1)	Rest of Task 1		
(2)			
(3)			
(4)			
(5)			
Tasks	Round Robin (100 ms time slice)		
(1)	Rest of Task 1		
(2)			
(3)			
(4)			
(5)			
	Time		

### Round Robin vs. FIFO

 Assuming zero-cost time slice, is Round Robin always better than FIFO?

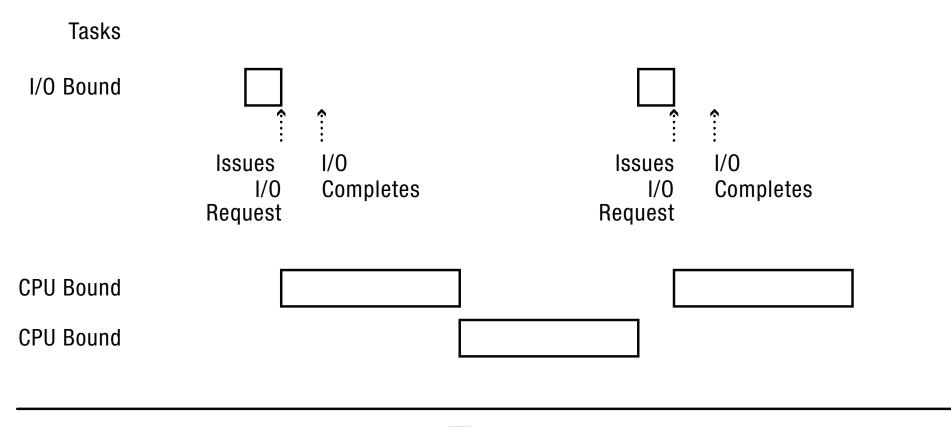
### Round Robin vs. FIFO



### Max-Min Fairness

- Applies to repeating tasks
  - Ex: network bandwidth allocation
- Maximize the min allocation given to a task
  - If any task needs less than an equal share, schedule the smallest of these first
  - Split the remaining time using max-min
  - If all remaining tasks need at least equal share, split evenly
- Implementation
  - Add credits to each task at same rate, debit on use (age)
  - Randomly choose proportional to # of credits

### Mixed Workload



Time

### Multi-level Feedback Queue (MFQ)

#### Goals:

- Responsiveness
- Low overhead
- Starvation freedom
- Some tasks are high/low priority
- Fairness (among equal priority tasks)
- Not perfect at any of them!
  - Used in Linux (and probably Windows, MacOS)

### **MFQ**

- Set of Round Robin queues
  - Each queue has a separate priority
- High priority queues have short time slices
  - Low priority queues have long time slices
- Scheduler picks first thread in highest priority queue
- Tasks start in highest priority queue
  - If time slice expires, task drops one level

# MFQ

Priority	Time Slice (ms)	Round Robin Queues
1	10	New or I/O Bound Task
2	20	Time Slice Expiration
3	40	•
4	80	<

### MFQ and Tail Latency

- How predictable is a task's performance?
  - Can it be affected by other users?

Linux boosts priority to tasks being starved...

### MFQ and Strategy

 Can a user get better performance (response time, throughput) by doing useless work?

# **Uniprocessor Summary (1)**

- FIFO is simple and minimizes overhead.
- If tasks are variable in size, then FIFO can have very poor average response time.
- If tasks are equal in size, FIFO is optimal in terms of average response time.
- Considering only the processor, SJF is optimal in terms of average response time.
- SJF is pessimal in terms of variance in response time.

# **Uniprocessor Summary (2)**

- If tasks are variable in size, Round Robin approximates SJF.
- If tasks are equal in size, Round Robin will have very poor average response time.
- Tasks that intermix processor and I/O can do poorly under Round Robin.

# **Uniprocessor Summary (3)**

- Max-Min fairness can improve response time for I/O-bound tasks.
- Round Robin and Max-Min both avoid starvation.
- MFQ approximates SJF
  - High variance for long jobs; vulnerable to strategy

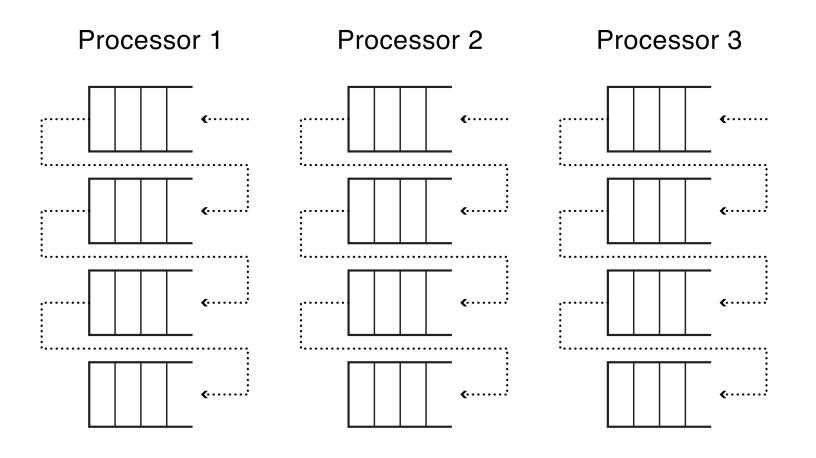
# Multiprocessor Scheduling

- What would happen if we used MFQ on a multiprocessor?
  - Contention for scheduler spinlock
  - Cache slowdown due to ready list data structure pinging from one CPU to another
  - Limited cache reuse: thread's data from last time it ran is often still in its old cache

# Per-Processor Affinity Scheduling

- Each processor has its own ready list
  - Protected by a per-processor spinlock
- Put threads back on the ready list where it had most recently run
  - Ex: when I/O completes, or on Condition->signal
- Idle processors can steal work from other processors

# Per-Processor Multi-level Feedback with Affinity Scheduling



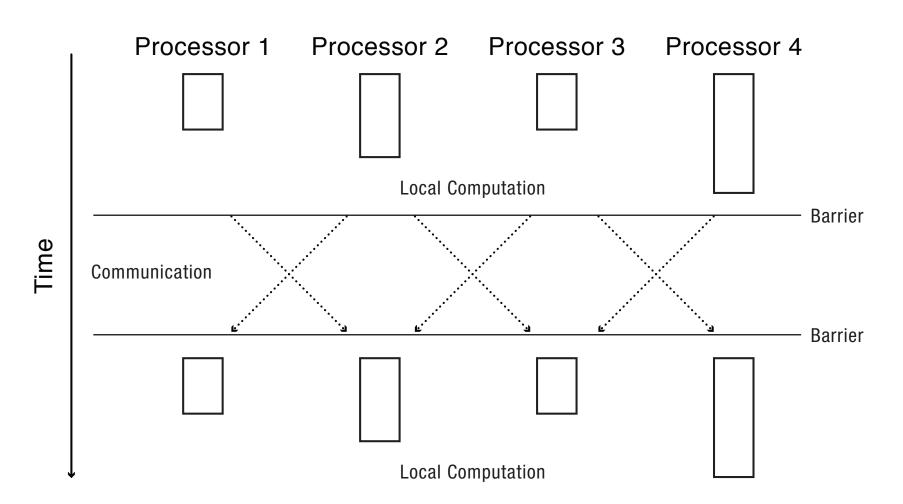
### Scheduling Parallel Programs

- What happens if one thread gets time-sliced while other threads from the same program are still running?
  - Assuming program uses locks and condition variables, it will still be correct
  - What about performance?

### Bulk Synchronous Parallelism

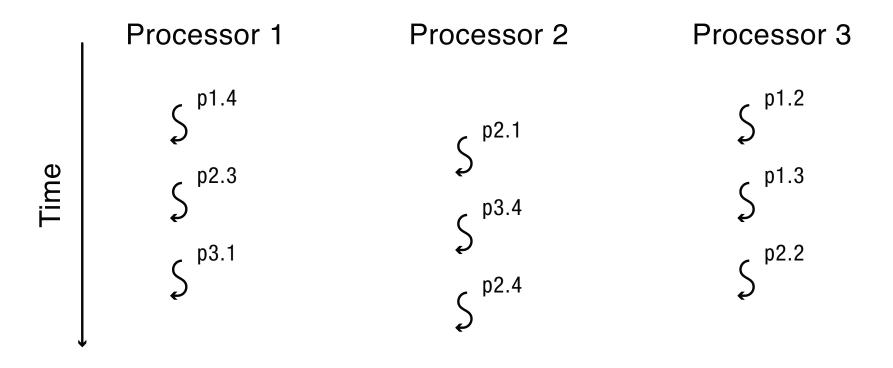
- Loop at each processor:
  - Compute on local data (in parallel)
  - Barrier
  - Send (selected) data to other processors (in parallel)
  - Barrier
- Examples:
  - MapReduce
  - Fluid flow over a wing
  - Most parallel algorithms can be recast in BSP, sacrificing at most a small constant factor in performance

# Tail Latency



# Scheduling Parallel Programs

Oblivious: each processor time-slices its ready list independently of the other processors



px.y = Thread y in process x

# **Gang Scheduling**

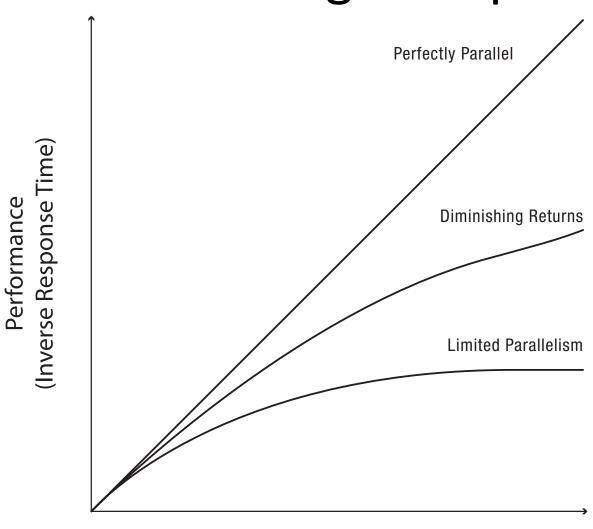
Processor 1 Processor 2 ς <sup>p1.1</sup> ς <sup>p1.2</sup> ς <sup>p1.3</sup> ς <sup>p2.1</sup> ς <sup>p2.2</sup> ς <sup>p3.1</sup> ς <sup>p3.2</sup>

**Processor 3** 

p2.3 ς <sup>p3.3</sup>

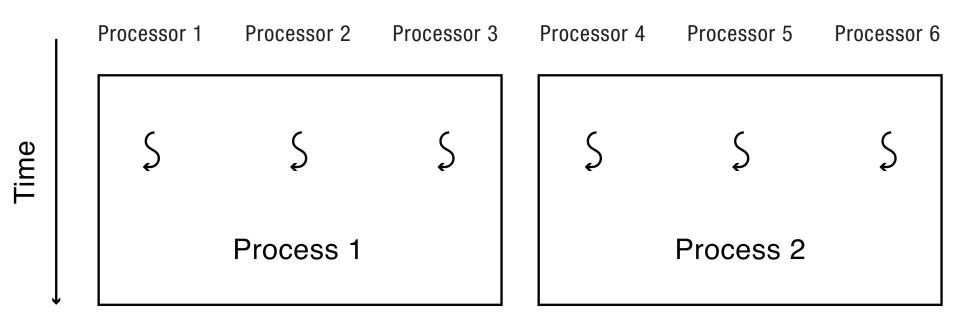
px.y = Thread y in process x

# Parallel Program Speedup



**Number of Processors** 

# **Space Sharing**

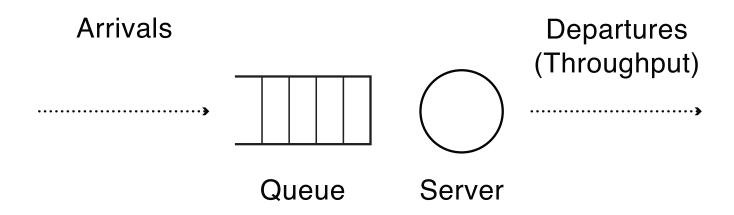


Scheduler activations: kernel tells each application its # of processors with upcalls every time the assignment changes

### **Queueing Theory**

- Can we predict what will happen to user performance:
  - If a service becomes more popular?
  - If we buy more hardware?
  - If we change the implementation to provide more features?

### Queueing Model



Assumption: average performance in a stable system, where the arrival rate ( $\lambda$ ) matches the departure rate ( $\mu$ )

### **Definitions**

- Queueing delay (W): wait time
  - Number of tasks queued (Q)
- Service time (S): time to service the request
- Response time (R) = queueing delay + service time
- Utilization (U): fraction of time the server is busy
  - Service time \* arrival rate (λ)
- Throughput (X): rate of task completions
  - If no overload, throughput = arrival rate

### Little's Law

$$N = X * R$$

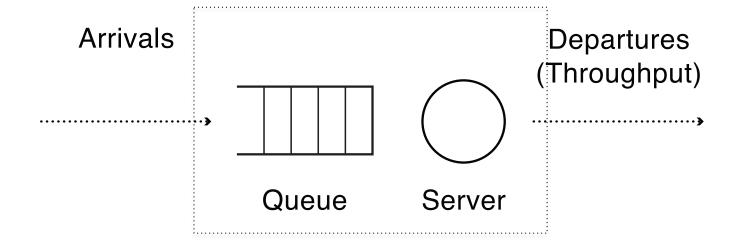
N: number of tasks in the system

Applies to *any* stable system – where arrivals match departures.

Independent of scheduling discipline and burstiness

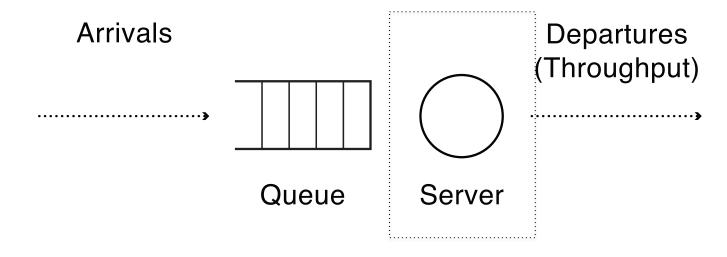
Suppose a system has throughput (X) = 100 tasks/s, average response time (R) = 50 ms/task

- How many tasks are in the system on average?
  - Hint: Little's Law N = X \* R



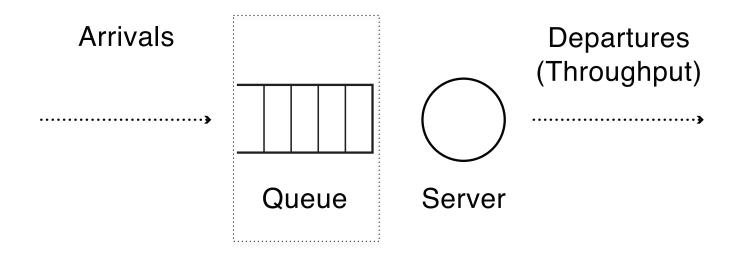
Suppose a system has throughput (X) = 100 tasks/s, average response time (R) = 50 ms/task

 If the server takes 5 ms/task, what is its utilization? (N = X \* R)



Suppose a system has throughput (X) = 100 tasks/s, average response time (R) = 50 ms/task

- What is the average wait time?
- What is the average number of queued tasks?



From example:

```
X = 100 \text{ task/sec}
```

R = 50 ms/task

S = 5 ms/task

W = 45 ms/task

Q = 4.5 tasks

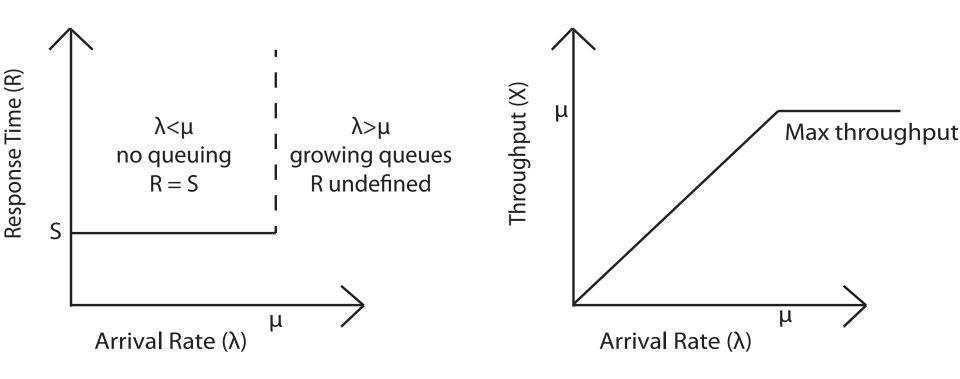
- What gives? W = 45 ms while S \* Q = 22.5 ms
  - Hint: what if S = 10ms? S = 1ms?

### Queueing

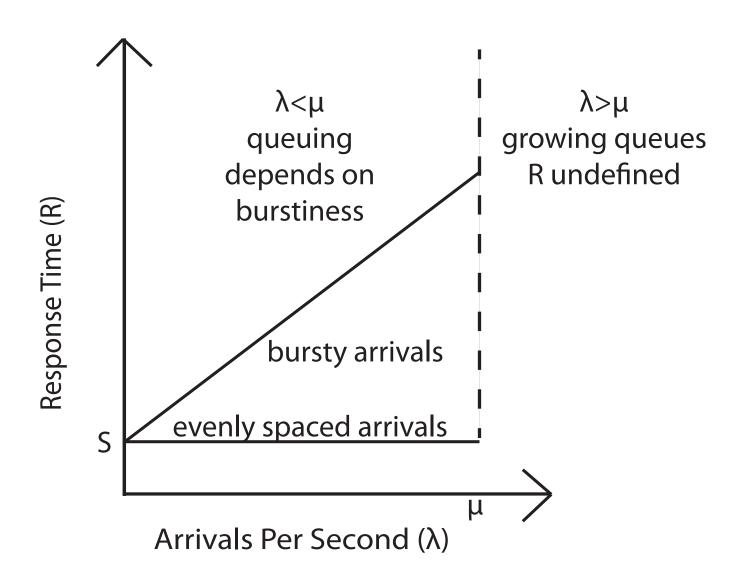
- What is the best case scenario for minimizing queueing delay?
  - Keeping arrival rate, service time constant

What is the worst case scenario?

### Queueing: Best Case



#### Response Time: Best vs. Worst Case

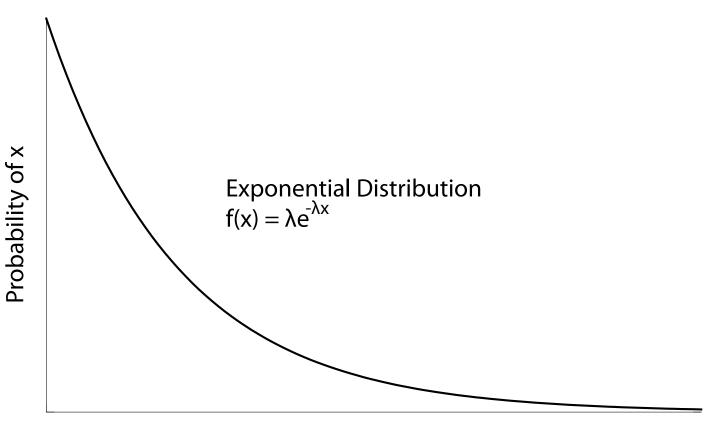


#### Queueing: Average Case?

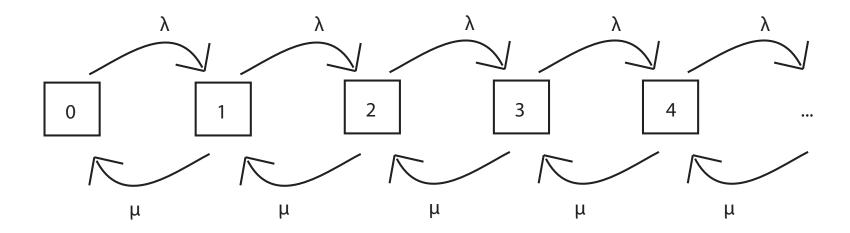
- What is average?
  - Gaussian: Arrivals are spread out, around a mean value
  - Exponential: arrivals are memoryless
  - Heavy-tailed: arrivals are bursty

 Can have randomness in both arrivals and service times

# **Exponential Distribution**

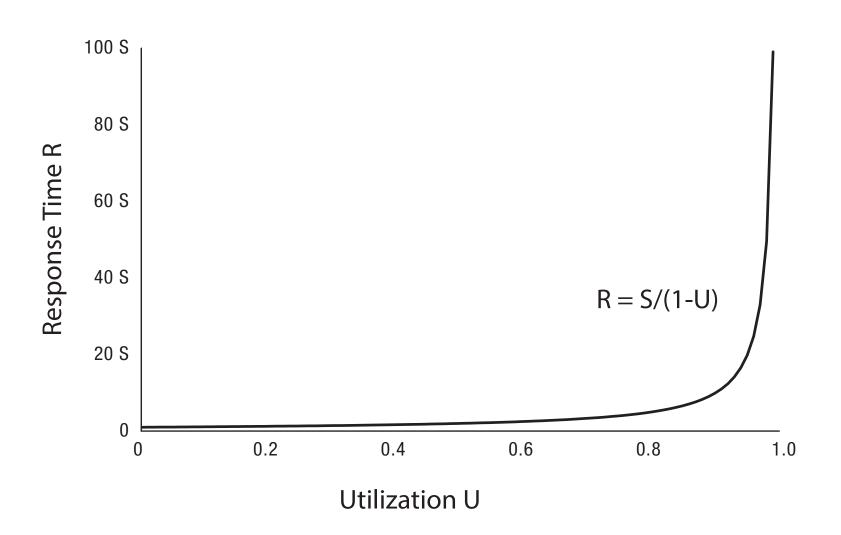


#### **Exponential Distribution**



Permits closed form solution to state probabilities, as function of arrival rate and service rate

# Response Time vs. Utilization



#### Question

- Exponential arrivals: R = S/(1-U)
- If system is 20% utilized, and load increases by 5%, how much does response time increase?

• If system is 90% utilized, and load increases by 5%, how much does response time increase?

### Variance in Response Time

- Exponential arrivals
  - Variance in  $R = S/(1-U)^2$

What if less bursty than exponential?

What if more bursty than exponential?

# What if Multiple Resources?

- Assuming exponential arrival, service times
- Response time =

```
Sum over all i
```

Service time for resource i /

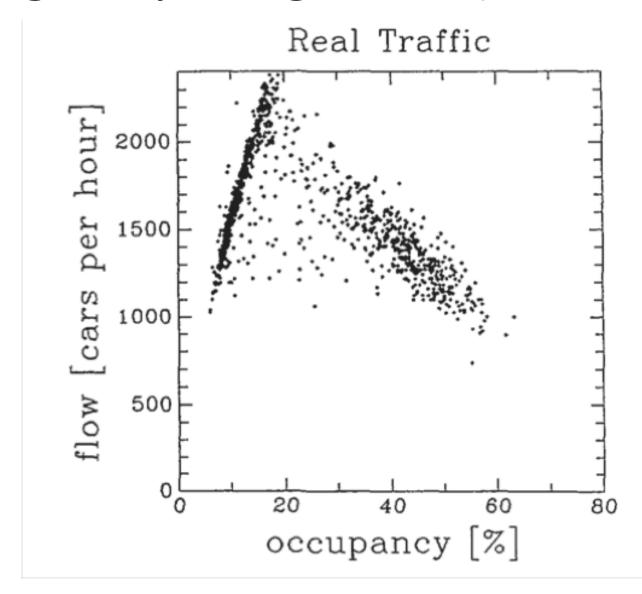
(1 – Utilization of resource i)

- Implication
  - If you fix one bottleneck, the next highest utilized resource will limit performance

### Overload Management

- What if arrivals occur faster than service can handle them
  - If do nothing, response time will become infinite
- Turn users away?
  - Which ones? Average response time is best if turn away users that have the highest service demand
  - Example: Highway congestion
- Degrade service?
  - Compute result with fewer resources
  - Example: CNN static front page on 9/11

# **Highway Congestion (measured)**



### Why Do Metro Buses Cluster?

Suppose two Metro buses start 10 minutes apart. Why might they arrive at the same time?

### **Control Theory**

- Regulate tasks entering system to meet SLA
  - Or to manage chance of queue overflow
  - Or to optimize for some system objective
- May be complex system
  - May or may not be modelled by queueing theory

# **Black Box Control Theory**

- Assume no internal visibility
  - See input arrivals and task completions
- Regulate at time scale of task response time
  - If too rapid, oscillate
  - If too slow, slow convergence
- Rate(k+1) = a\*Rate(k) b\*N(k)