

# Distributed Systems

## CS6421

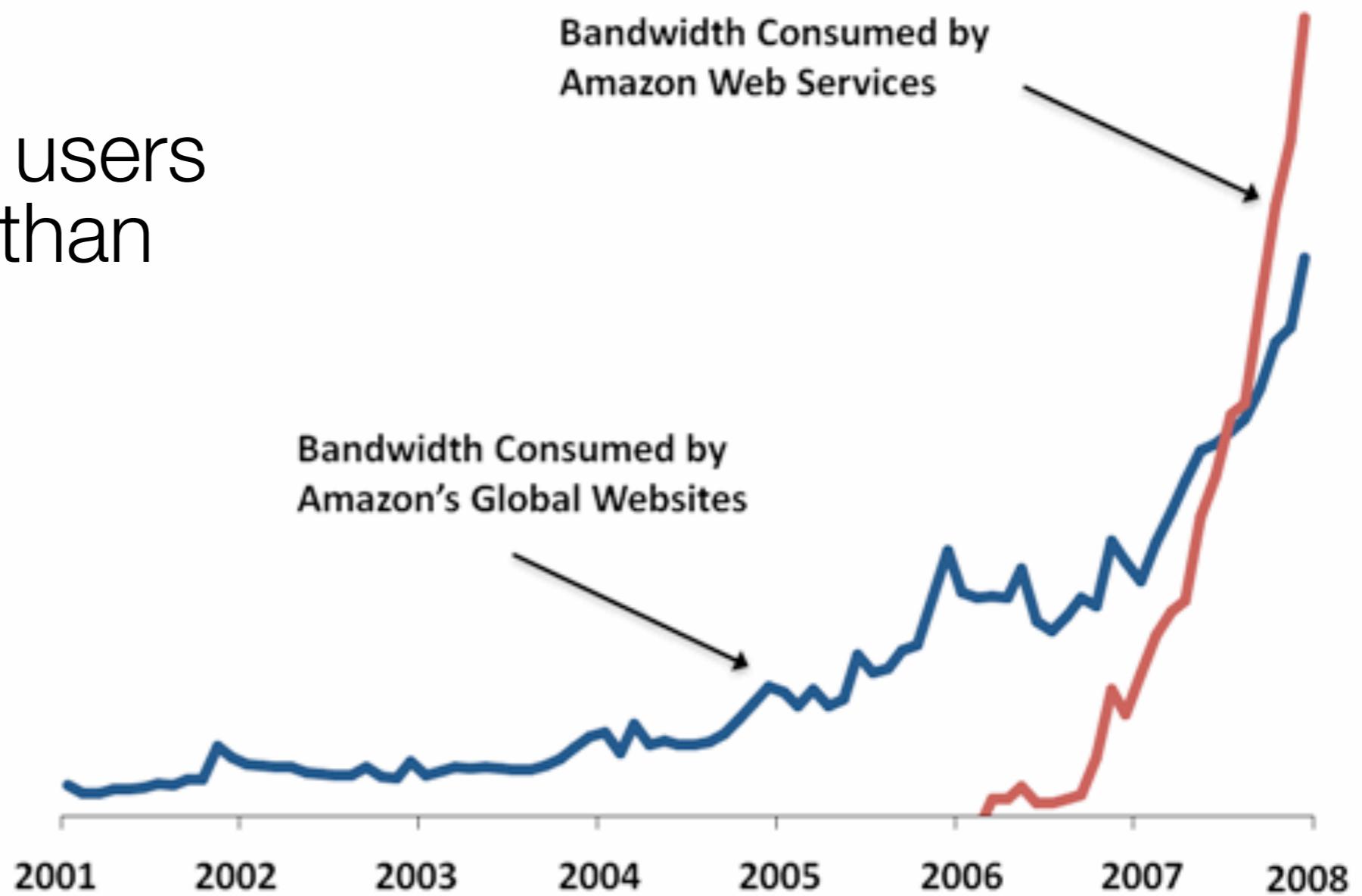
**Cloud Computing: Servers and Virtualization**

Prof. Tim Wood

# Amazon's Cloud

Amazon built its cloud platform so that other people could pay for its infrastructure during the rest of the year...

Now its cloud users are far bigger than its own sites



# Cloud Data Centers



Microsoft's Dublin  
data center

# Interconnections

## Amazon's Internet

- Multiple private 100Gbps links between each data center site



# Servers in AWS

Custom server designs

1U compute servers

- Intel CPUs
- High efficiency power supplies

Storage Racks

- 42U size
- 1100 disks
- 11 petabytes of storage space



# Scale Estimates

- 1.5-2 million servers - Bloomberg 2014
- 50-80K per data center, 68 total data centers = 3.4-5.4 million
  - re:Invent 2016

*Every day Amazon adds as many servers as it had in **2000** (when it was a **\$2 billion** company)*  
— talk at UW **2011**

*Every day Amazon adds as many servers as it had in **2005** (when it was a **\$8.5 billion** company)*  
— AWS re:Invent **2016**

# Inside a Data Center



<https://www.google.com/about/datacenters/inside/streetview/>

# *Why* use the cloud?

- Pay-as-you go
- Expand quickly on demand
- Don't need to worry about (many) IT issues
- Cheap!

**... but is the cloud perfect?**

[spoiler alert] no.

# Infrastructure as a Service (IaaS)

Infrastructure clouds rent **raw servers**

- Connect to server remotely
- Configure OS and install whatever applications you want

Great flexibility for cloud user

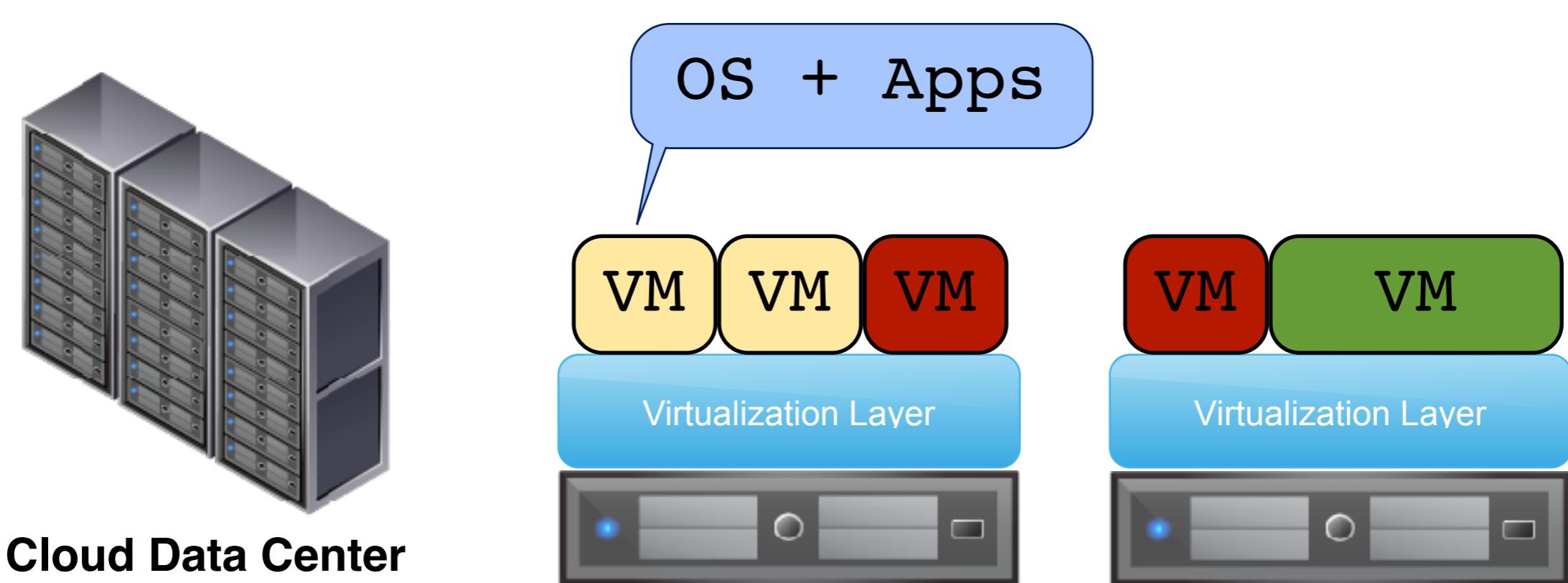
Less management handled by cloud operator

**Your own computer or disk  
on demand !**

# Virtual Machines

Virtualization is used to **split up** a physical server

- Allows multiple customers to share one machine
- Simplifies management since VMs are not strictly tied to HW
- Provides isolation between cloud users



# Amazon EC2

- Infrastructure as a Service Cloud (IaaS)
- Can rent server and storage resources

	Description	Cost
<b>t3.Micro</b>	1GB RAM, up to 1 core, no storage	\$0.01 / hour
<b>t3.Large</b>	8GB RAM, ~2 cores, no storage	\$0.08 / hour
<b>c5.18xlarge</b>	144GB RAM, 72 cores, no storage	\$3.06 / hour

<b>EBS</b>	Network attached storage	\$0.10 / GB per month
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# Platform as a Service (PaaS)

The cloud provides a **programming platform**

Typically used to run highly scalable web apps

Cloud users write applications to run on the cloud

- Must write code to meet cloud API
- Cloud automatically scales the application based on demand
- Provides much greater scalability, but program must be specially written

**Let the cloud handle your  
application's scalability!**

# Software as a Service (SaaS)

The cloud provides a **piece of software**

- Examples: email, office, project management, customer relations, supply chain, etc

Provides even greater scalability

- Entire cloud infrastructure is devoted just to one particular type of application

Benefits for customer: cheaper and simpler

Benefits for provider: economy of scale

**Why bother writing or running  
your own application if they can  
do it better?**

# Examples

## PaaS

- Google App Engine
  - Python, Java
- Heroku
  - Ruby on Rails
- Amazon EMR
  - Java, Python, etc Hadoop

## SaaS

- GMail
- Flickr
- Salesforce
- Dropbox
- iCloud

# Cloud Grade Sheet

	<b>Pay as you go</b>	<b>Scalability</b>	<b>Automation / ease of use</b>	<b>Flexibility</b>	<b>Security / Isolation</b>
IaaS	++	+	-	++	++
PaaS	+++	++	++	- +	-
SaaS	+++	+++	+++	- - -	- +
Private Data Center	- - -	-	- -	++ +	+++++ +++ +

# Types of Clouds

## Software as a Service



Salesforce

Office apps, CRM

for anybody

## Platform as a Service



Google  
App Engine

heroku

Software platforms

for programmers

## Infrastructure as a Service



amazon  
webservices™



Azure

Servers & storage

for programmers  
and sys admins

Increased  
Cloud  
Automation

Increased  
Customer  
Control



# Cloud Computing Goals

Offer fast services to customers worldwide

- Need geographic diversity and high scalability
- Low latency requests: fast responses
- High throughput: simultaneous processing

Ads ⓘ

[Google Cloud Computing](#)  
[www.google.com/apps/business](http://www.google.com/apps/business)  
Save time & money with Google Apps for Business. 30 days free!

...that are highly reliable and secure

- Servers crash
- Data centers lose power
- Malicious users (or governments?) can attack

[IBM Cloud Computing](#)  
[www.ibm.com/cloud](http://www.ibm.com/cloud)  
Reinvent Business Processes & Drive Innovation. Explore IBM Solutions.  
175 people +1'd this page

... as cheaply as possible

- Users expect services for free\*
- Cloud needs to pay for servers, cooling infrastructure, energy, system administrators, etc

[Top 5 Truths of the Cloud](#)  
[www.citrix.com/](http://www.citrix.com/)  
Learn the Essentials with Citrix.  
Download the Free Whitepaper Now.

# Let's try out the cloud



# AWS in 2012...

## Welcome

The AWS Management Console provides a graphical interface to Amazon Web Services. Learn more about how to use our services to meet your needs, or get started by selecting a service.

[Getting started guides](#)

[Reference architectures](#)

[Free Usage Tier](#)

**Set Start Page**

[Console Home](#)

## Amazon Web Services

**Compute & Networking**

-  **EC2**  
Virtual Servers in the Cloud
-  **Elastic MapReduce**  
Managed Hadoop Framework
-  **Route 53**  
Scalable Domain Name System
-  **VPC**  
Isolated Cloud Resources

**Storage & Content Delivery**

-  **CloudFront**  
Global Content Delivery Network
-  **S3**  
Scalable Storage in the Cloud
-  **Storage Gateway**  
Integrates on-premises IT environments with Cloud storage

**Database**

-  **DynamoDB**  
Predictable and Scalable NoSQL Data Store
-  **ElastiCache**  
In-Memory Cache
-  **RDS**  
Managed Relational Database Service

**Deployment & Management**

-  **CloudFormation**  
Templated AWS Resource Creation
-  **CloudWatch**  
Resource & Application Monitoring
-  **Elastic Beanstalk**  
AWS Application Container
-  **IAM**  
Secure AWS Access Control

**App Services**

-  **CloudSearch**  
Managed Search Service
-  **SES**  
Email Sending Service
-  **SNS**  
Push Notification Service
-  **SQS**  
Message Queue Service
-  **SWF**  
Workflow Service for Coordinating Application Components

## Announcements

[Announcing VM Export for Amazon EC2](#)

[AWS Console Enhancements for Elastic Load Balancing: Listener, Certificate, and...](#)

[Amazon RDS announces support for MySQL Read Replica in Amazon VPC](#)

[More...](#)

## Service Health

[Edit](#)

*Click Edit to add at least one service and at least one region to monitor.*

[Service Health Dashboard](#)

# AWS in 2015...

## Amazon Web Services

### Compute

-  **EC2**  
Virtual Servers in the Cloud
-  **EC2 Container Service**  
Run and Manage Docker Containers
-  **Elastic Beanstalk**  
Run and Manage Web Apps
-  **Lambda**  
Run Code In Response to Events

### Storage & Content Delivery

-  **S3**  
Scalable Storage in the Cloud
-  **CloudFront**  
Global Content Delivery Network
-  **Elastic File System** PREVIEW  
Fully Managed File System for EC2
-  **Glacier**  
Archive Storage in the Cloud
-  **Import/Export Snowball**  
Large Scale Data Transport
-  **Storage Gateway**  
Integrates On-Premises IT Environments with Cloud Storage

### Database

-  **RDS**  
Managed Relational Database Service
-  **DynamoDB**  
Predictable and Scalable NoSQL Data Store
-  **ElastiCache**  
In-Memory Cache
-  **Redshift**  
Managed Petabyte-Scale Data Warehouse Service

### Networking

-  **VPC**  
Isolated Cloud Resources
-  **Direct Connect**  
Dedicated Network Connection to AWS
-  **Route 53**  
Scalable DNS and Domain Name Registration

### Developer Tools

-  **CodeCommit**  
Store Code in Private Git Repositories
-  **CodeDeploy**  
Automate Code Deployments
-  **CodePipeline**  
Release Software using Continuous Delivery

### Management Tools

-  **CloudWatch**  
Monitor Resources and Applications
-  **CloudFormation**  
Create and Manage Resources with Templates
-  **CloudTrail**  
Track User Activity and API Usage
-  **Config**  
Track Resource Inventory and Changes
-  **OpsWorks**  
Automate Operations with Chef
-  **Service Catalog**  
Create and Use Standardized Products
-  **Trusted Advisor**  
Optimize Performance and Security

### Security & Identity

-  **Identity & Access Management**  
Manage User Access and Encryption Keys
-  **Directory Service**  
Host and Manage Active Directory
-  **Inspector** PREVIEW  
Analyze Application Security
-  **WAF**  
Filter Malicious Web Traffic

### Analytics

-  **EMR**  
Managed Hadoop Framework
-  **Data Pipeline**  
Orchestration for Data-Driven Workflows
-  **Elasticsearch Service**  
Run and Scale Elasticsearch Clusters
-  **Kinesis**  
Work with Real-time Streaming data
-  **Machine Learning**  
Build Smart Applications Quickly and Easily

### Internet of Things

-  **AWS IoT** BETA  
Connect Devices to the cloud

### Mobile Services

-  **Mobile Hub** BETA  
Build, Test, and Monitor Mobile apps
-  **Cognito**  
User Identity and App Data Synchronization
-  **Device Farm**  
Test Android, iOS, and iOS apps on real devices in the Cloud
-  **Mobile Analytics**  
Collect, View and Export App Analytics
-  **SNS**  
Push Notification Service

### Application Services

-  **API Gateway**  
Build, Deploy and Manage APIs
-  **AppStream**  
Low Latency Application Streaming
-  **CloudSearch**  
Managed Search Service
-  **Elastic Transcoder**  
Easy-to-use Scalable Media Transcoding
-  **SES**  
Email Sending Service
-  **SQS**  
Message Queue Service
-  **SWF**  
Workflow Service for Coordinating Application Components

### Enterprise Applications

-  **WorkSpaces**  
Desktops in the Cloud
-  **WorkDocs**  
Secure Enterprise Storage and Sharing Service
-  **WorkMail** PREVIEW  
Secure Email and Calendaring Service

# AWS in 2018!

## AWS services

Find a service by name or feature (for example, EC2, S3 or VM, storage).

> Recently visited services

▽ All services

<input type="checkbox"/> Compute	<input type="checkbox"/> Management Tools	<input type="checkbox"/> Mobile Services
EC2	CloudWatch	Mobile Hub
Lightsail	AWS Auto Scaling	AWS AppSync
Elastic Container Service	CloudFormation	Device Farm
EKS	CloudTrail	Mobile Analytics
Lambda	Config	
Batch	OpsWorks	
Elastic Beanstalk	Service Catalog	AR & VR
	Systems Manager	Amazon Sumerian
	Trusted Advisor	
	Managed Services	
<input type="checkbox"/> Storage	<input type="checkbox"/> Media Services	<input type="checkbox"/> Application Integration
S3	Elastic Transcoder	Step Functions
EFS	Kinesis Video Streams	Amazon MQ
Glacier	MediaConvert	Simple Notification Service
	MediaLive	Simple Queue Service
Storage Gateway	MediaPackage	SWF
	MediaStore	
	MediaTailor	
<input type="checkbox"/> Database	<input type="checkbox"/> Machine Learning	<input type="checkbox"/> Customer Engagement
RDS	Amazon SageMaker	Amazon Connect
DynamoDB	Amazon Comprehend	Pinpoint
ElastiCache	AWS DeepLens	Simple Email Service
Neptune	Amazon Lex	
Amazon Redshift	Machine Learning	
	Amazon Polly	Business Productivity
	Rekognition	Alexa for Business
	Amazon Transcribe	Amazon Chime
	Amazon Translate	WorkDocs
		WorkMail
<input type="checkbox"/> Migration	<input type="checkbox"/> Analytics	<input type="checkbox"/> Desktop & App Streaming
AWS Migration Hub	Amazon Athena	WorkSpaces
Application Discovery Service	EMR	AppStream 2.0
Database Migration Service	CloudSearch	
Server Migration Service	Elasticsearch Service	
Snowball	Kinesis	Internet of Things
	QuickSight	IoT Core
	Data Pipeline	IoT 1-Click
	AWS Glue	IoT Device Management
<input type="checkbox"/> Networking & Content Delivery	<input type="checkbox"/> Security, Identity & Compliance	IoT Analytics
VPC	IAM	Greengrass
CloudFront	Cognito	Amazon FreeRTOS
Route 53	Secrets Manager	IoT Device Defender
API Gateway	GuardDuty	
Direct Connect	Inspector	
	Amazon Macie	Game Development
	AWS Single Sign-On	Amazon GameLift
	Certificate Manager	
	CloudHSM	
	Directory Service	
	WAF & Shield	
	Artifact	
<input type="checkbox"/> Developer Tools		
CodeStar		
CodeCommit		
CodeBuild		
CodeDeploy		
CodePipeline		
Cloud9		
X-Ray		

# Let's try it out!

<https://console.aws.amazon.com>

Instance details:

- Auto-assign Public IP -> Enable

```
sudo apt-get update
```

```
sudo apt-get install -y sysbench
```

```
sysbench --test=cpu --num-threads=100 --max-requests=50000 run
```

# Why is it so cheap?

c5.18xlarge - **\$3.06 per hour**

- 144GB RAM, 72x ~3Ghz CPU cores, 25Gbps

If busy 24x365 = \$26,805.60 per year!

Could just buy from Dell...

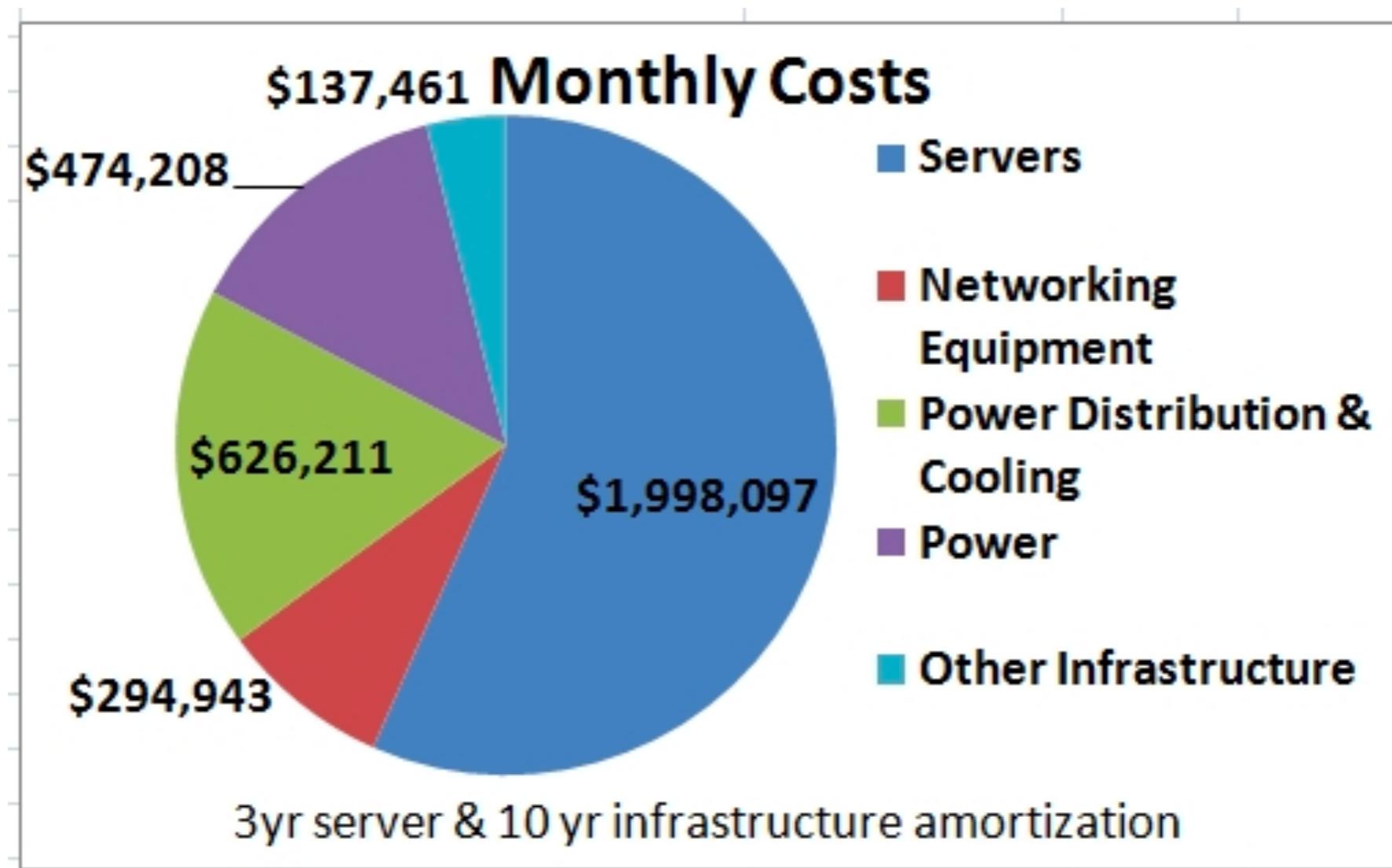
## PowerEdge R930 Rack Server Summary

Dell Price	<b>\$37,245.40</b>
Starting at Price	<del>\$59,210.00</del>
Total Savings	<b>\$21,964.60</b>
Standard Delivery	Free



# It's not cheap

The cost to run a 50,000 server data center (2010):



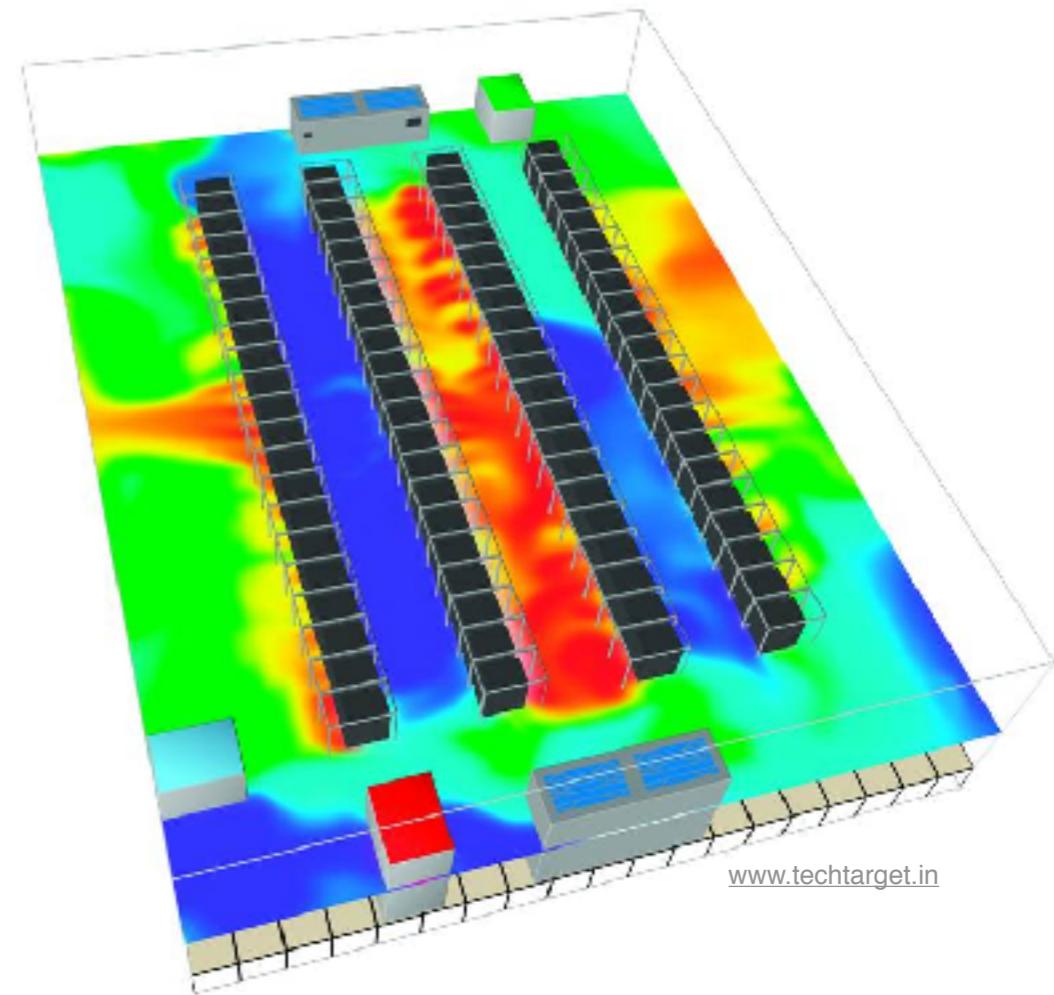
# Heat and Power

## Computers are hot!

- Thermostat set to 55-72 degrees
- Hot and cold air aisles
- Infrared mapping to find hotspots
- Complex thermodynamic models
- A Finnish data center pipes the heat to warm 1,000 nearby homes

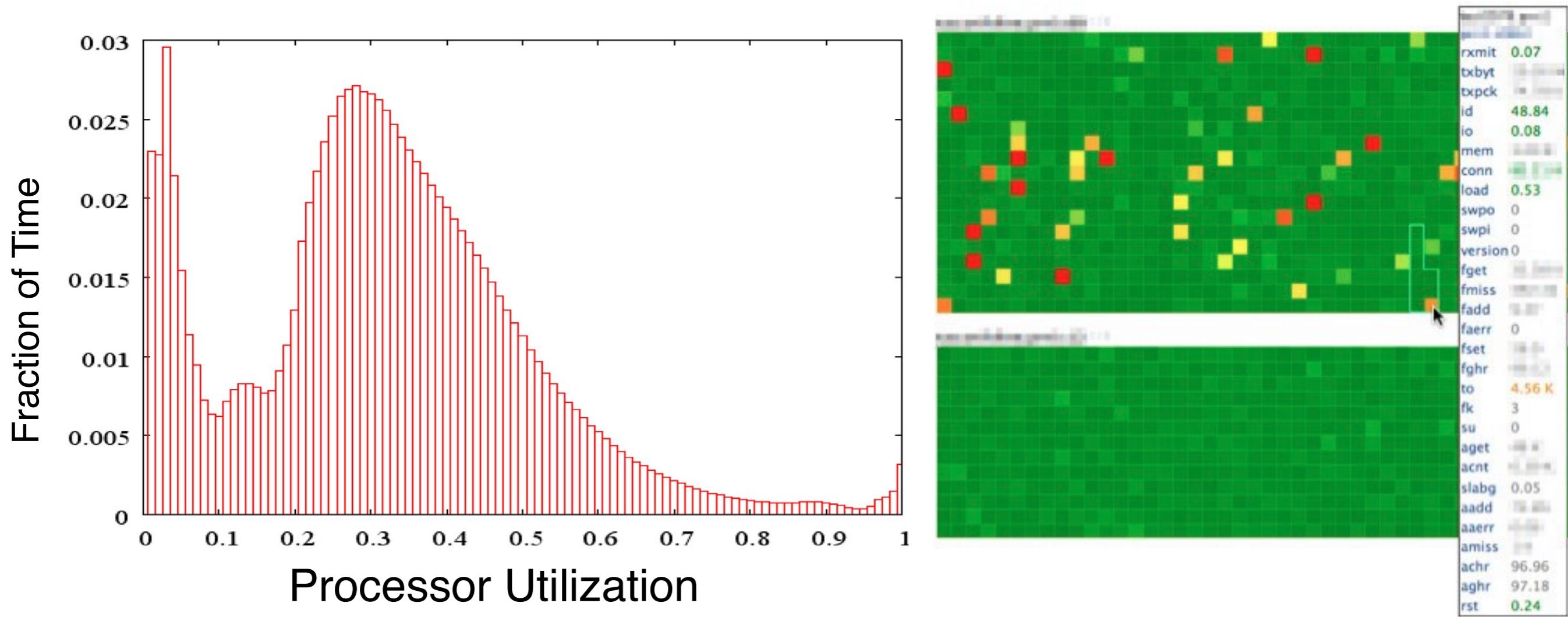
## Computers use power!

- Several megawatts per data center
- 1.3% of world electricity usage
- Often, only 50% of a data center's energy goes to actual IT equipment



# Server (In)Efficiency

Many servers are poorly utilized



How can we improve this?

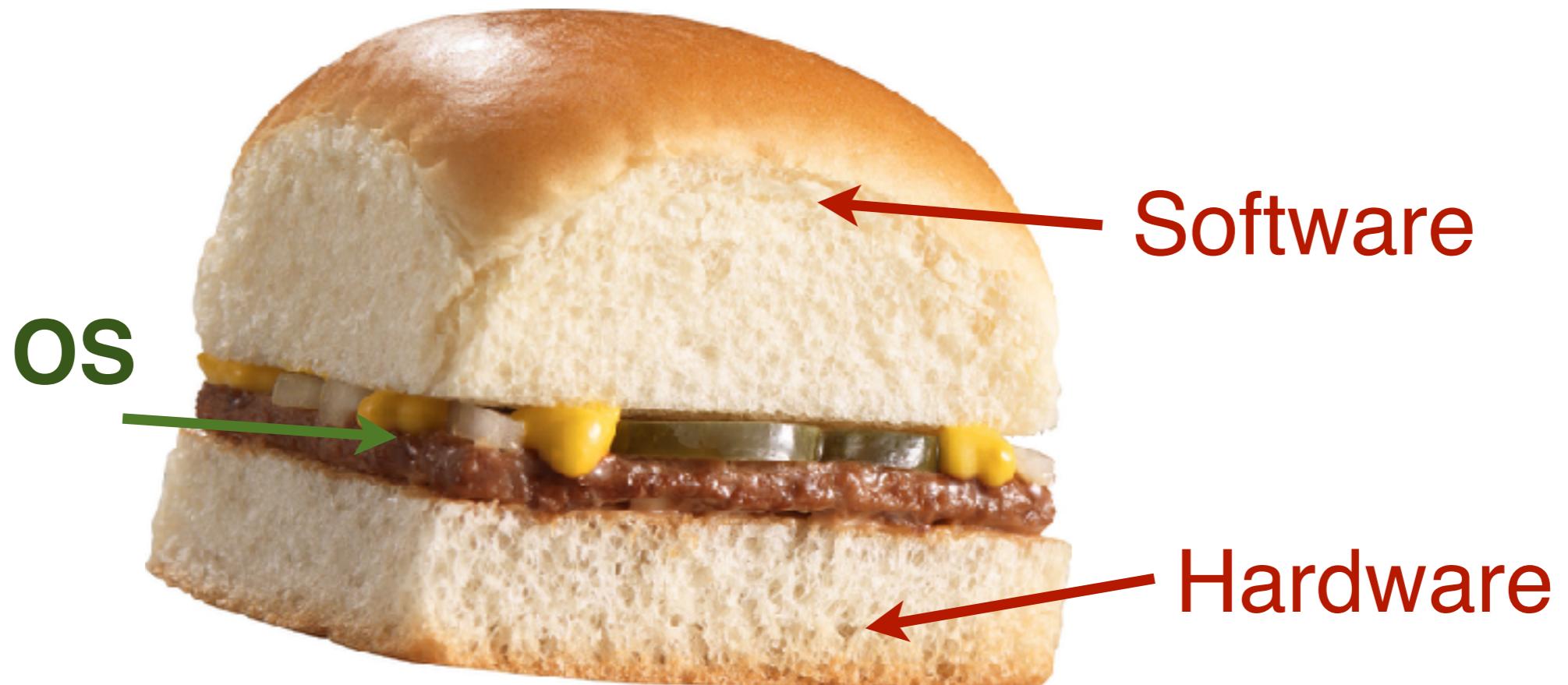
Figure from: The Data Center as a Computer by Luiz André Barroso and Urs Hözle

# Break?

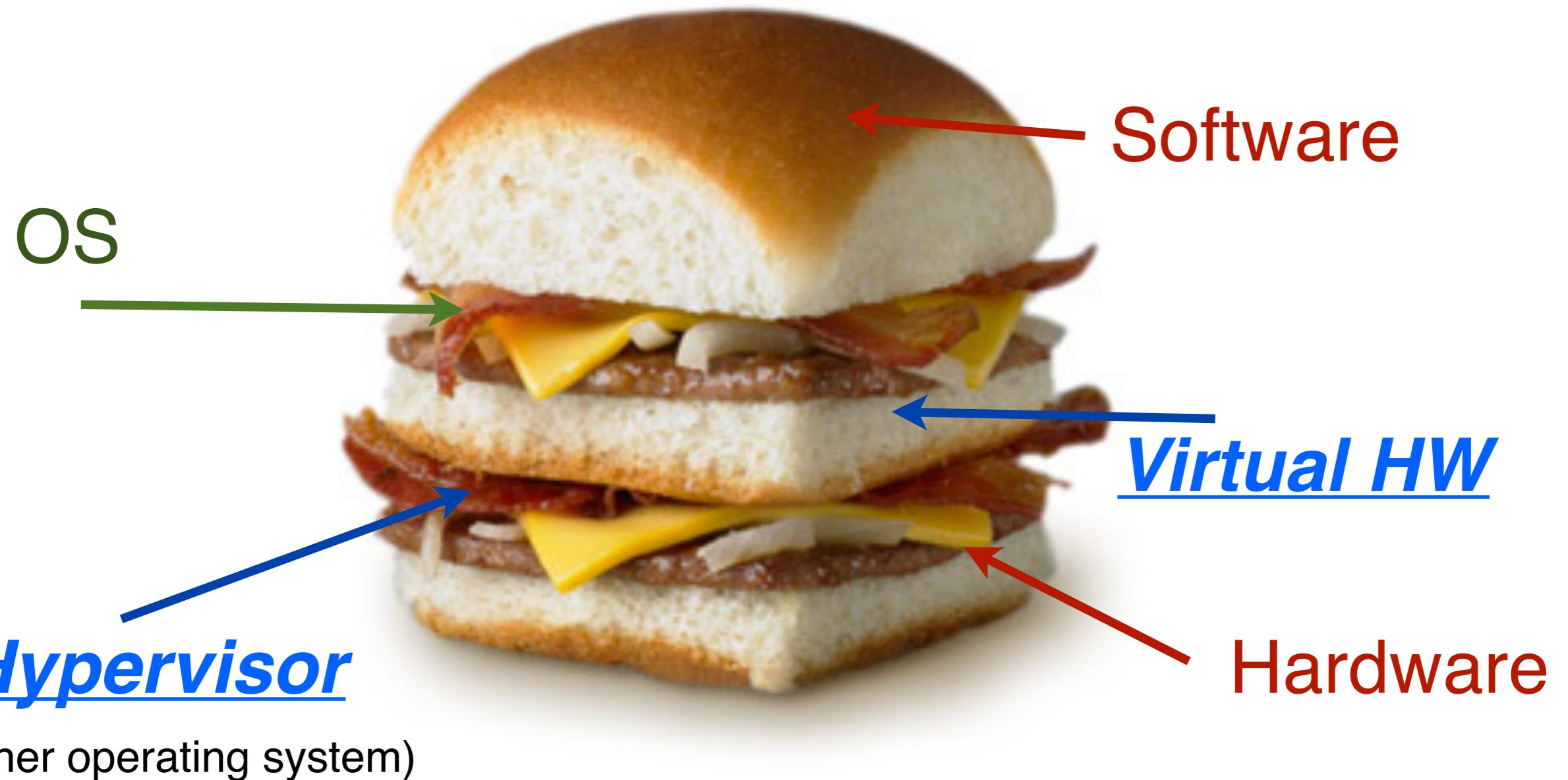
# Virtualizing Resources

# Question...

What's better than an operating system?



# Virtualization



# Multiple VMs

Hypervisor can manage many virtual machines

- Just like OS manages many processes

Windows  
desktop VM

Linux web  
server VM

Obscure-OS  
running ??? VM



Hypervisor

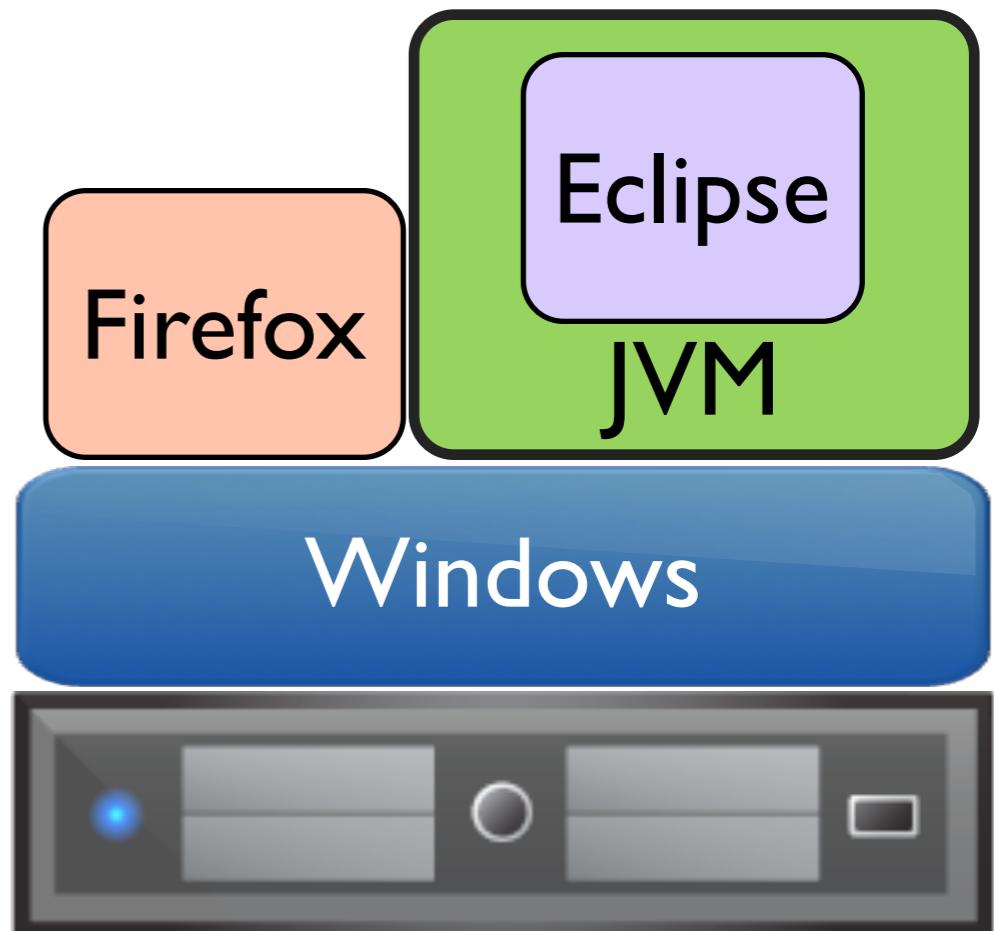
# The Most Common VM

## Java Virtual Machine

- Execution environment for running Java code
- Interprets/compiles programs and translates them to the host environment

## Abstraction layer to OS

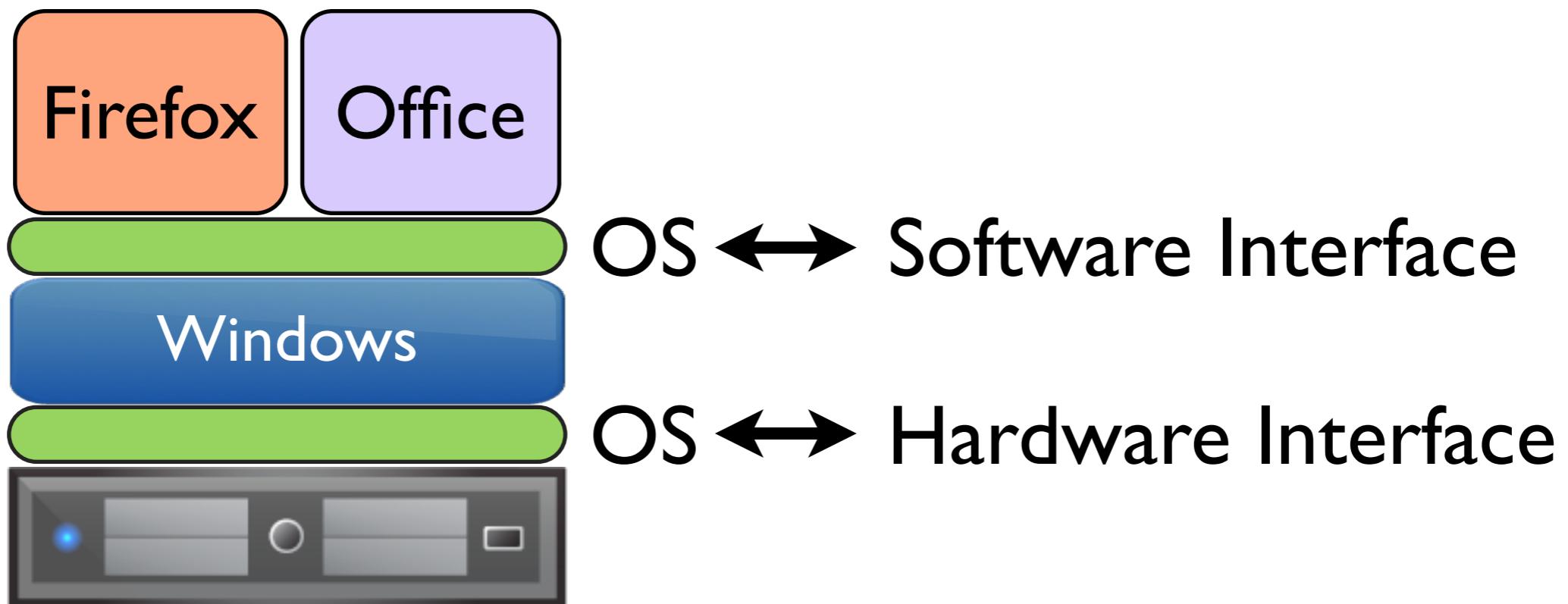
- Java code is platform independent
- Can add overhead



# What is virtualization?

An extra **interface** that mimics the behavior of a lower layer

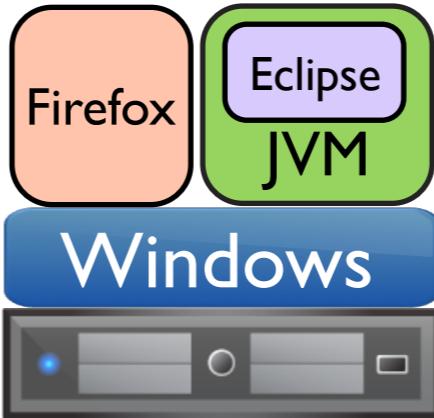
Used since 1970s so new mainframes could support legacy applications



# Types of Virtualization

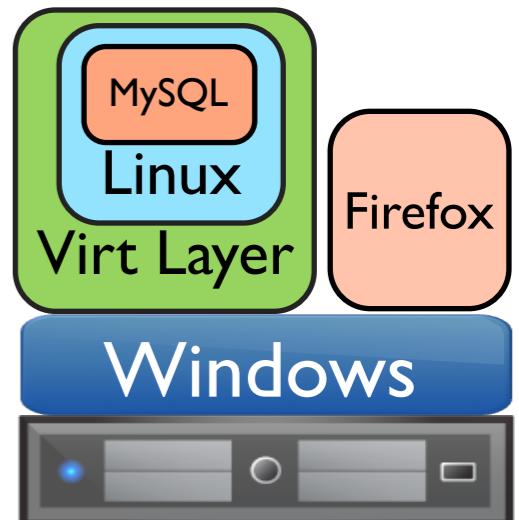
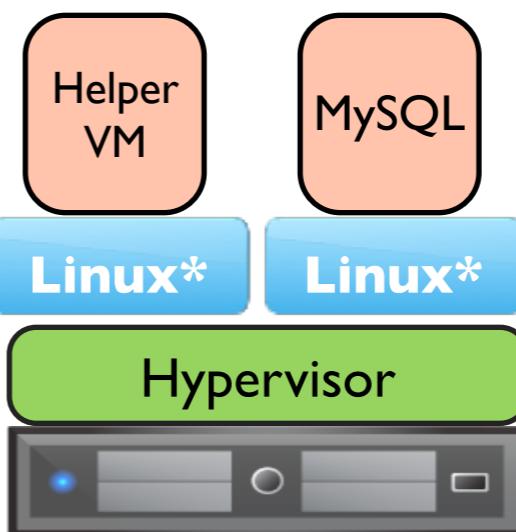
## Application Virtualization

- Runs application code
- Java *JVM*, *WINE*



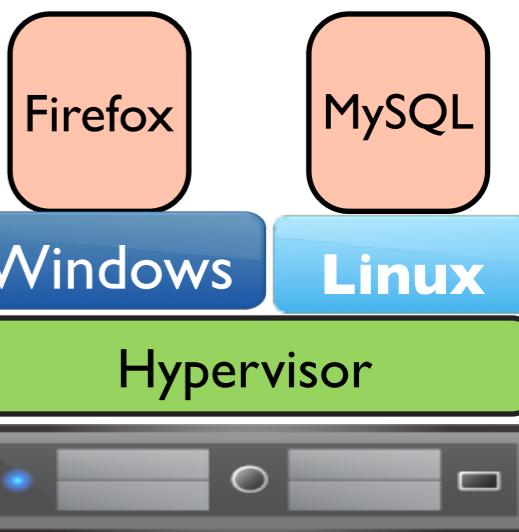
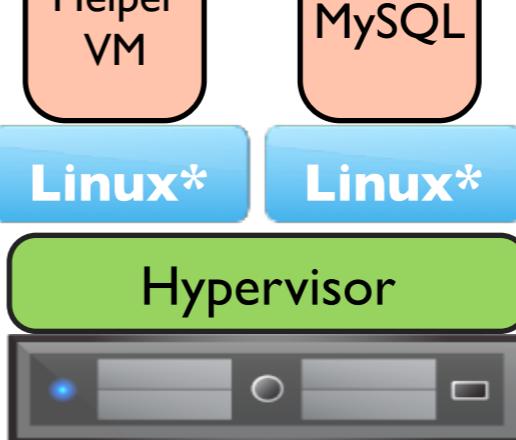
## Hosted Virtualization

- Virtualizes a full OS and apps
- *VMware Player*, *VirtualBox*



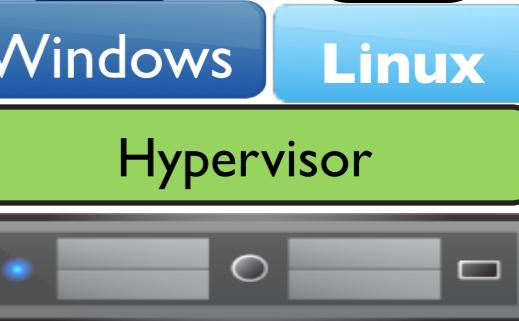
## Paravirtualization

- Modify OS to simplify hypervisor
- *Xen*



## Full Virtualization

- Runs directly on HW
- *VMware ESXi*



# Why Virtualize?

## Consolidation

- Can split a physical server into many smaller servers

## Security

- VMs are isolated from one another

## Resource management

- Can dynamically adjust a VM's CPU and memory share

## Convenience

- VM is abstracted away from physical hardware
- Great for development

# How to Virtualize?

Virtualization layer replaces an interface

Must intercept calls and translate them

- Java - interpret/compile code to match host
- Hosted VM - translate system calls for host OS
- Full Virtualization - trap on sensitive instructions

How to allocate resources?

- VMs must share memory and CPU time

How to handle I/O?

- Abstraction layer separates VM from physical hardware

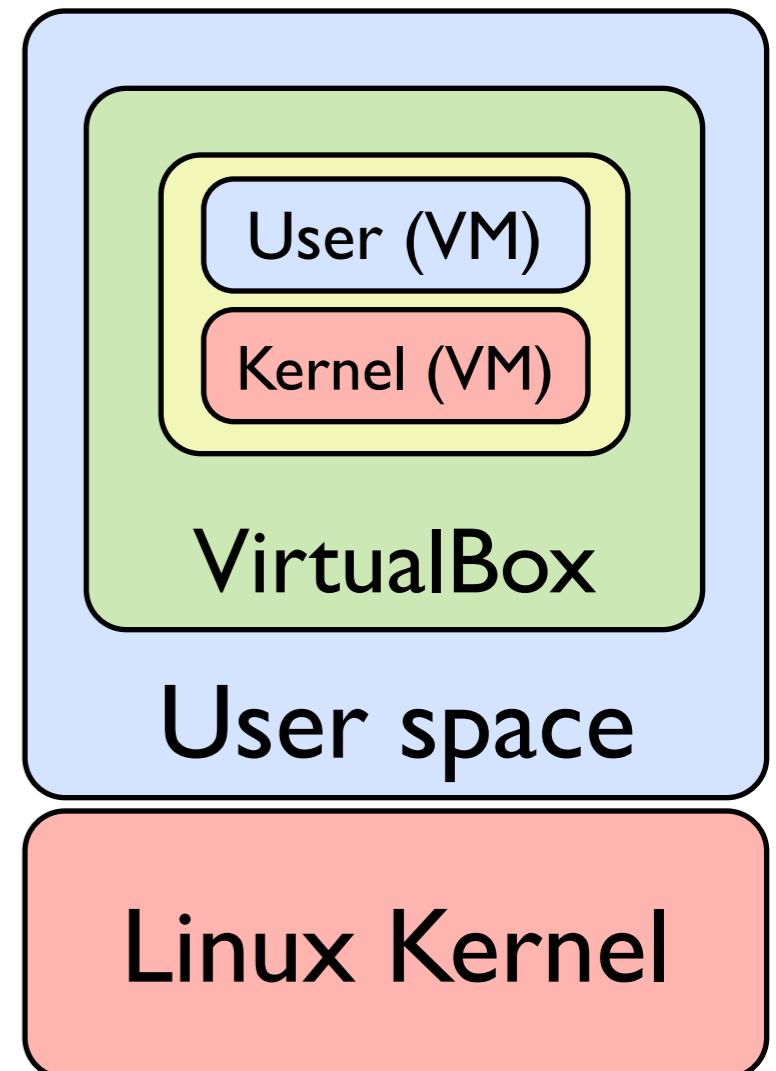
# Hosted Virtualization

Normal OS divided into Kernel and User modes

Protected instructions only work in kernel mode

- I/O, memory allocation, etc
- Traps to kernel if run in user mode

How to run a VM in user mode?

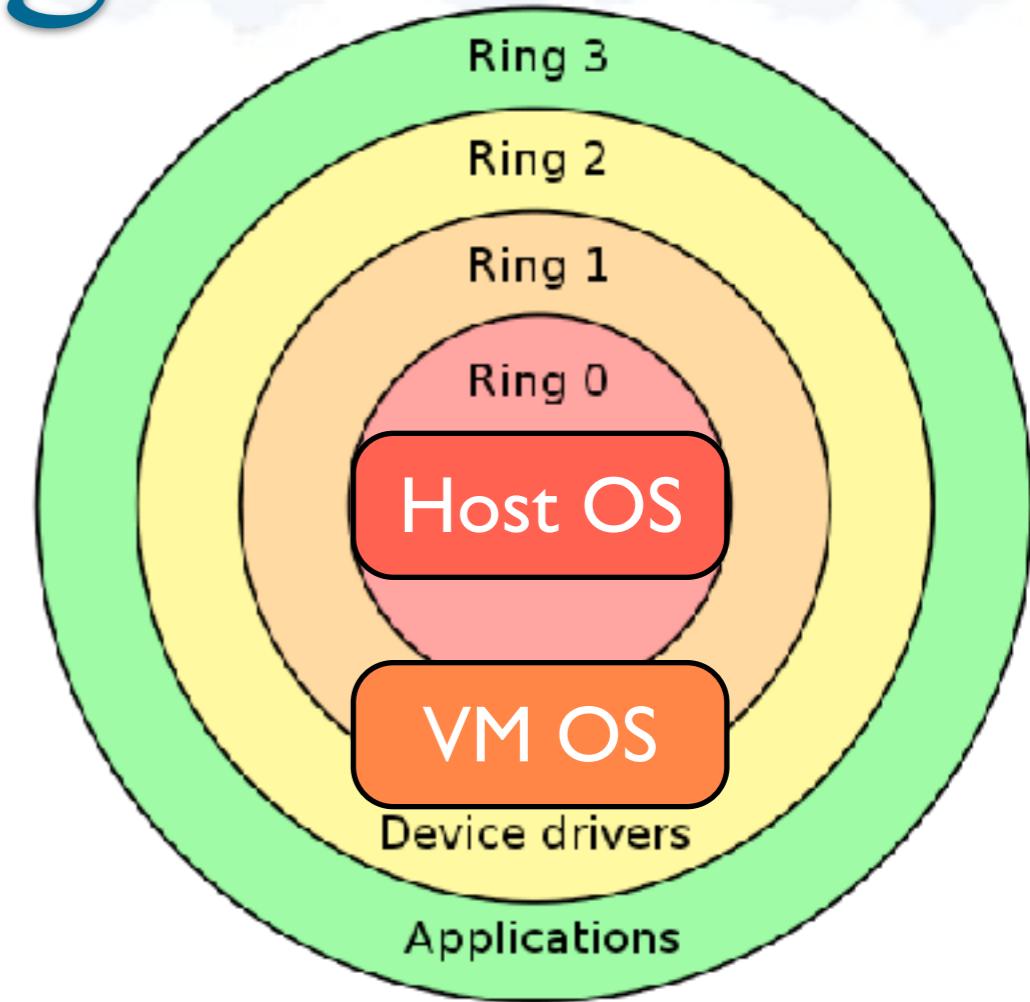


# CPU Rings

User and kernel mode are controlled by CPU

Modern CPUs support multiple protection rings

- Ring 0 = kernel mode
- Ring 3 = user mode
- Rings 1-2 = drivers or unused



Hosted virtualization runs VM OS in Ring 1

- Must detect and translate any CPU instructions that require Ring 0

## Ring 0 ops

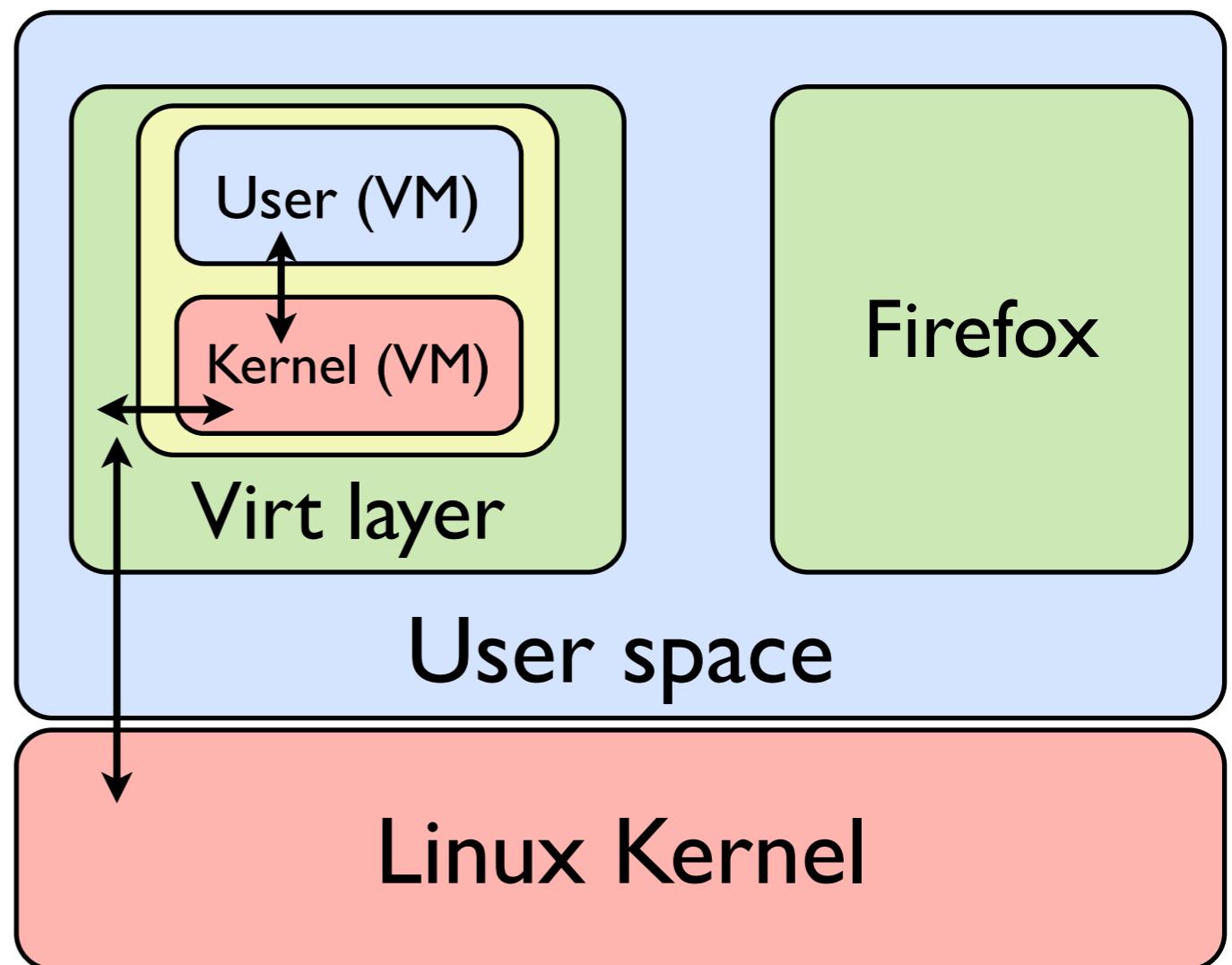
set time  
power on/off  
memory management  
etc

# Hosted Virtualization

## Dynamic translation

- Preprocess all code being run by the OS inside the VM
- Detect sensitive instructions
- Repackage and call into parent OS
- Return result to guest OS

How to optimize?



# Full Virtualization

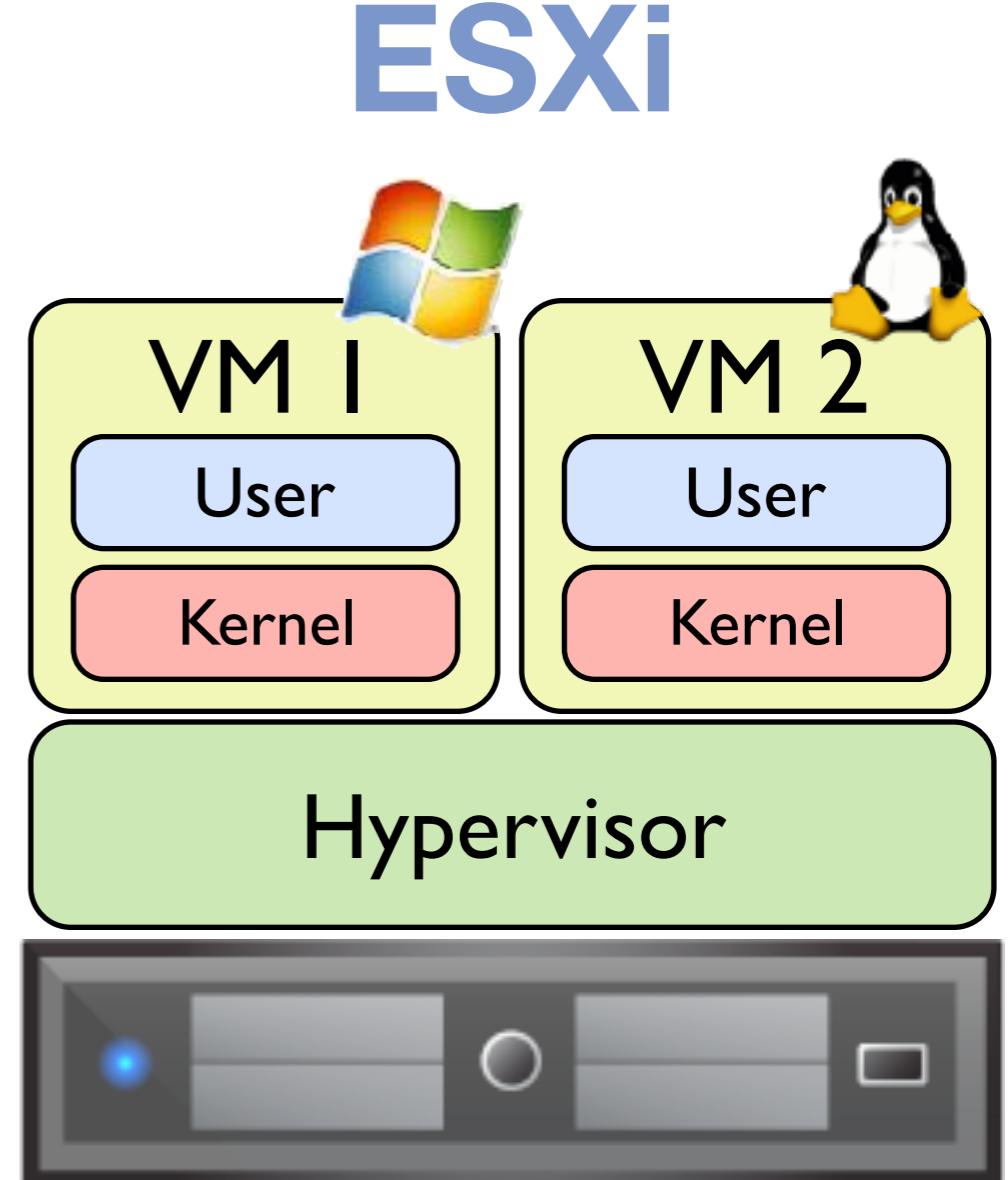
Hypervisor runs directly on hardware in Ring 0



Manages VMs

Uses dynamic translation to rewrite protected instructions

Hosts device drivers for VMs



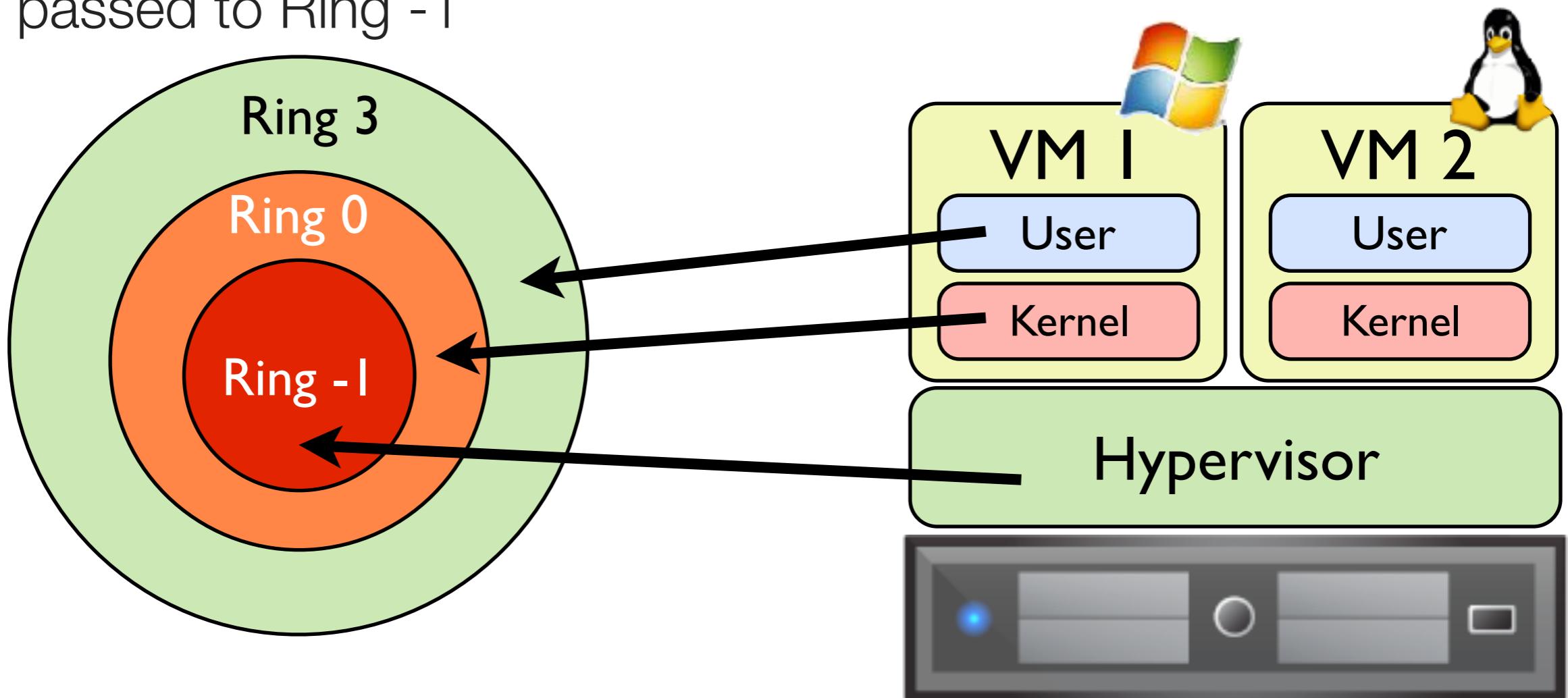
# HW Virtualization

Newer CPUs have support for virtualization

- AMD-V and Intel-VT

Provides an extra ring for running a hypervisor

- Protected instructions in VM OS are trapped and passed to Ring -1



# Getting help from the VM

Hosted and Full virtualization are VM OS agnostic

- Guest OS does not know it is being virtualized
- Translate binary code (slow)
- Get help from hardware (expensive)

What if we ask the VM's OS for help?

- Have guest OS notify hypervisor of special instructions
- Guest OS can help with device drivers

Benefits and drawbacks?

# Paravirtualization in Xen™

Modifies Linux so that it is virtualization aware

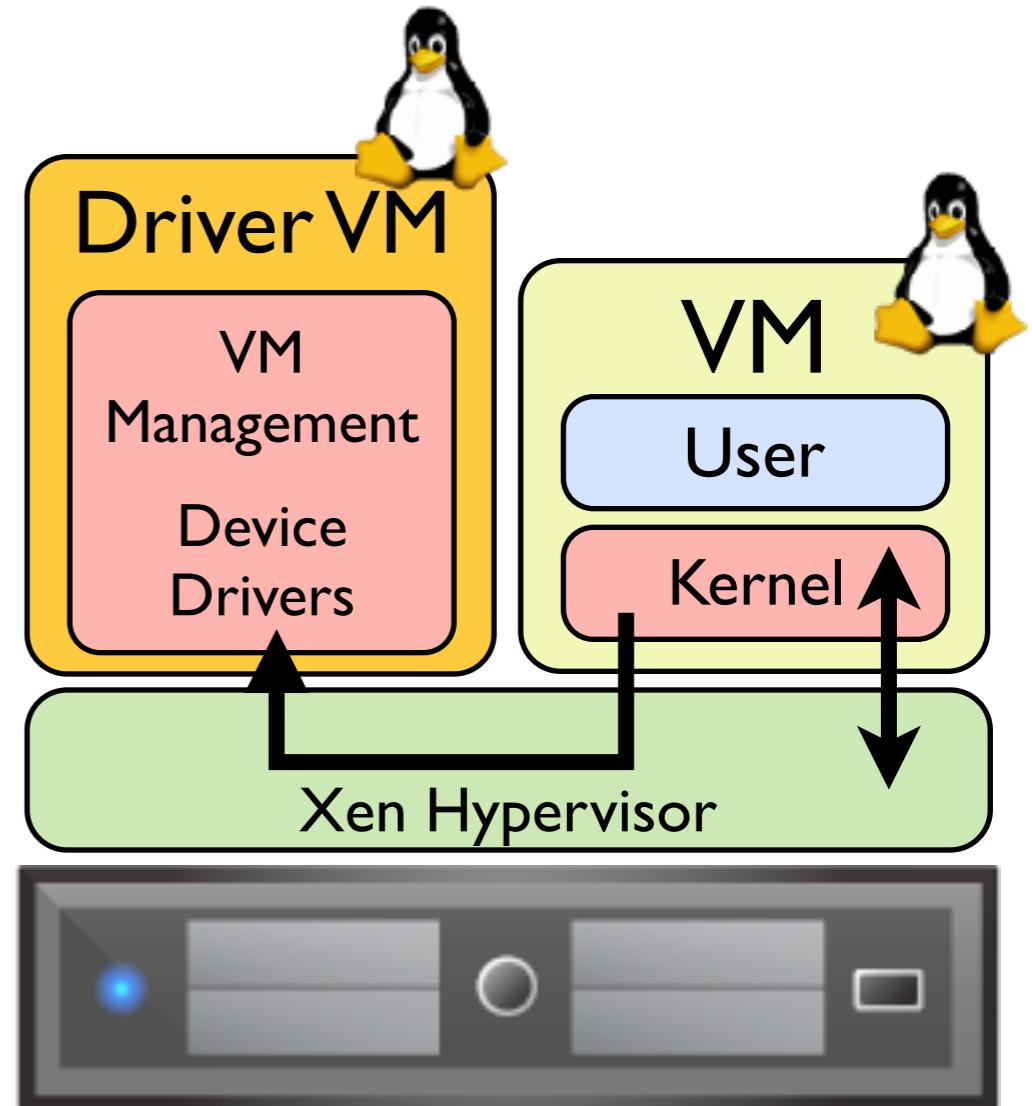
OS asks hypervisor for help to run special instructions

Driver VM is special management VM

- Starts/stops VMs
- Contains Linux device drivers

Very simple hypervisor

- Reduces overhead
- No need for HW virtualization



# Trade-offs

## Hosted Virtualization

- easier to install, and turn off, great for testing/development
- neg: fewer resources available, because need host OS

## Full Virtualization

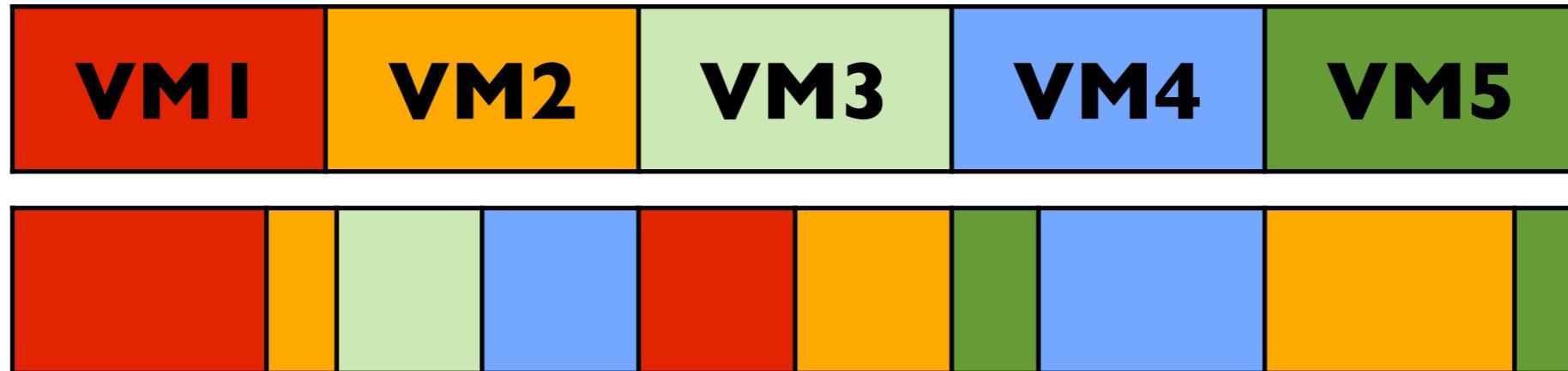
- With or without HW assist
- strong isolation
- greater performance than hosted, better scalability
- neg: needs drivers for all HW

## Paravirtualization

- neg: VM is aware it is in a virtual environment (security)
- may be able to optimize b/c it knows it is virtual
- need to modify OS

# Virtualizing Memory

System's memory must be shared by all VMs



How should we allocate memory to each VM?

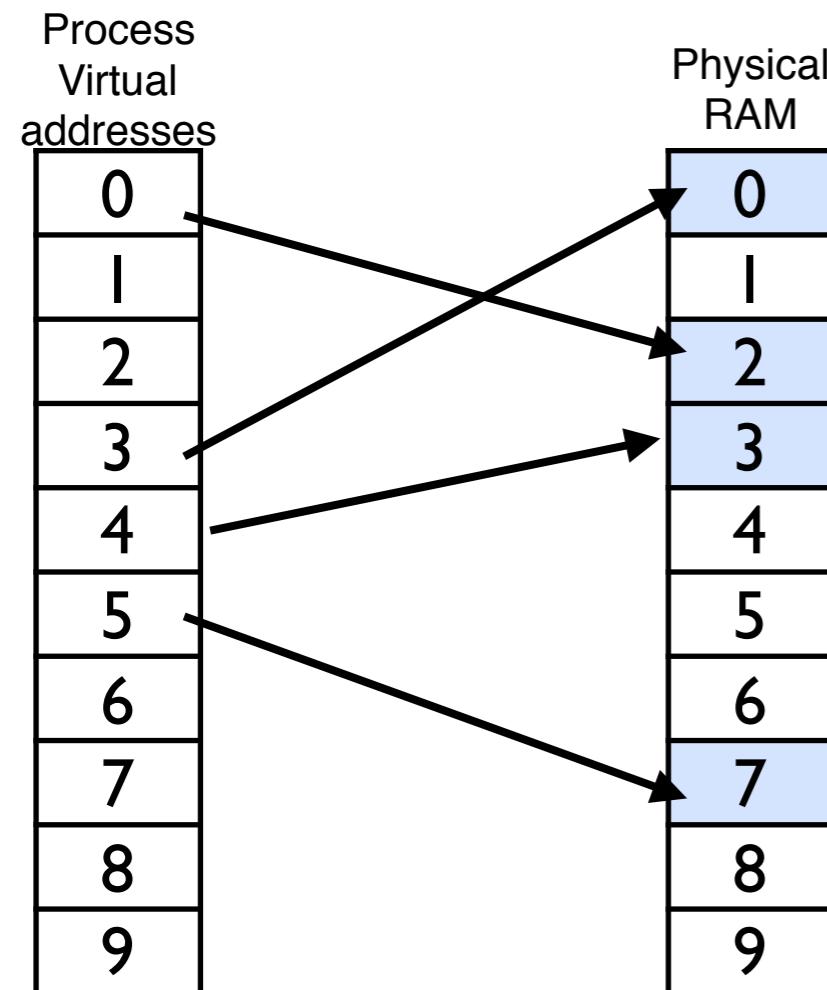
- Contiguous or non-contiguous?

Page tables let us use non-contiguous memory...

- Creating and modifying page tables uses privileged instructions!
- Guest does not even know the real physical addresses!

# Page Tables

OS has page table for each process

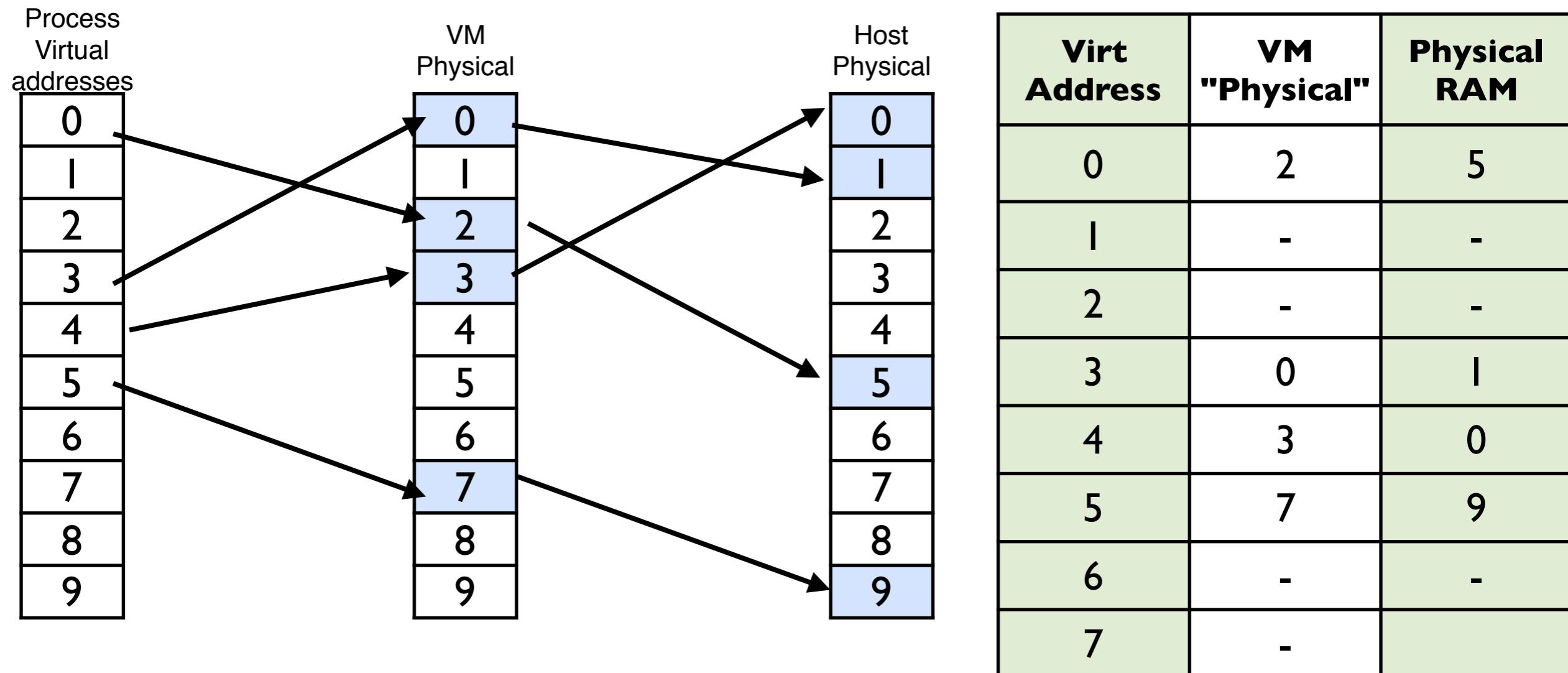


Maps **virtual addresses** to **physical address**

<b>Virt Address</b>	<b>Physical RAM</b>
0	2
1	-
2	-
3	0
4	3
5	7
6	-
7	-

# Page Tables

We can do the same thing with VMs

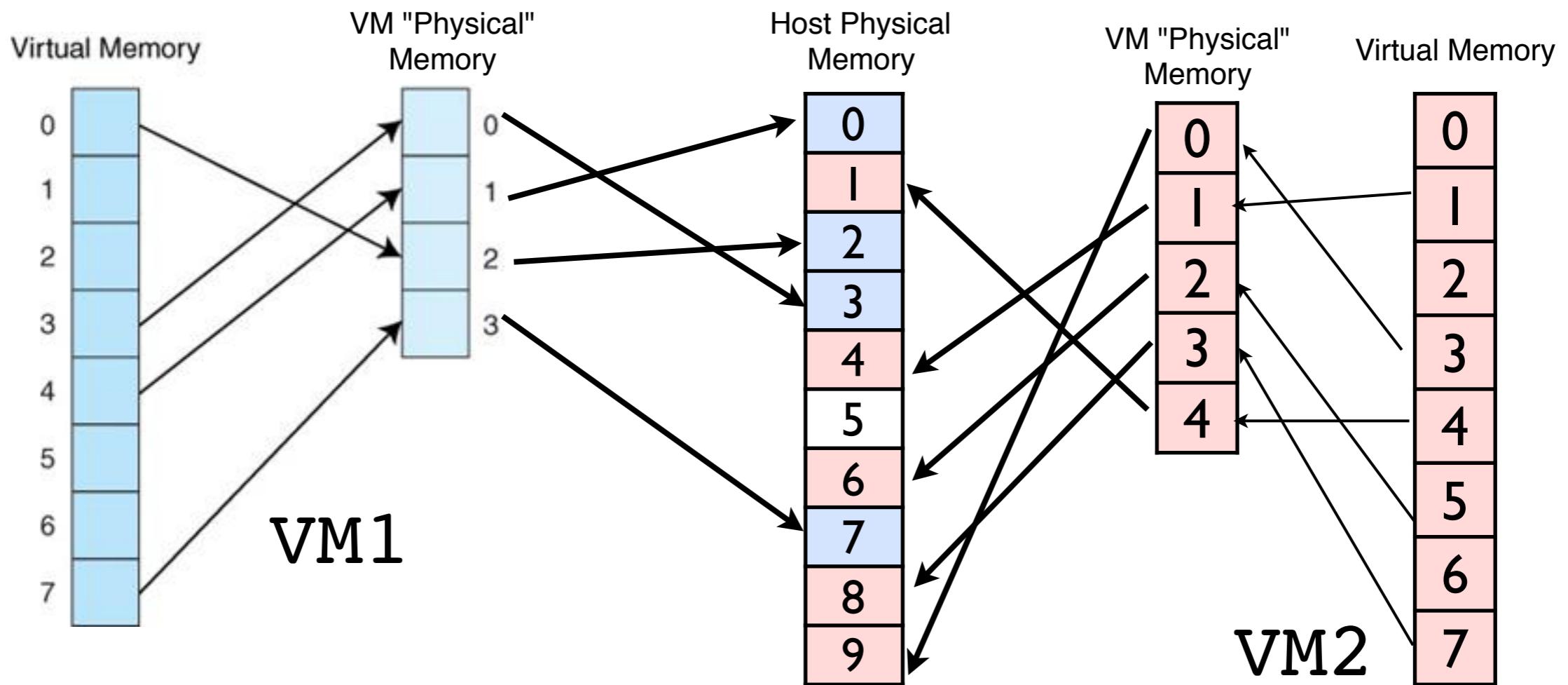


We need another layer of mappings

- Virtual Memory -> VM "Phys" Memory -> Host Phys Memory
- Only the hypervisor knows the true mapping to physical memory

# Multiple VMs

Can extend this for multiple VMs



Virtualization layer manages mappings to ensure isolation between VMs and to allocate the right amount of resources to each one

# Shadow Page Tables

## Shadow Page Tables

- VM's OS thinks it has a regular PT
- Hypervisor adds another translation layer
- Keeps a "shadow" PT with the real mappings

Virt Address	VM "Physical"	Host Physical
0	2	2
1	6	4
2	-	-

Virt Address	VM "Physical"
0	2
1	6
2	-

Virt Address	Host Physical
0	2
1	4
2	-

VM PT

Shadow PT

**MMU / TLB  
use this**

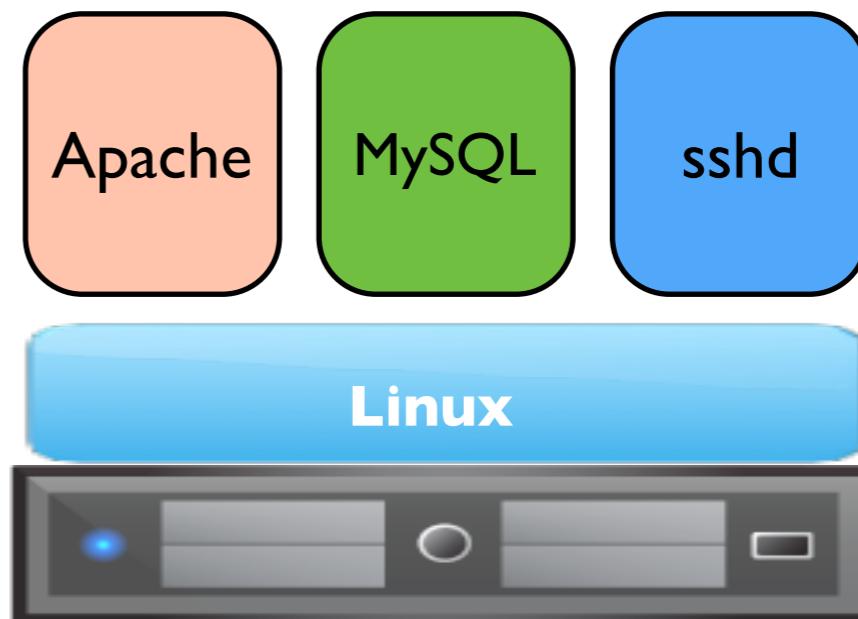
# Containers

Lightweight virtualization

# Process Isolation

## Processes

- OS provides isolation



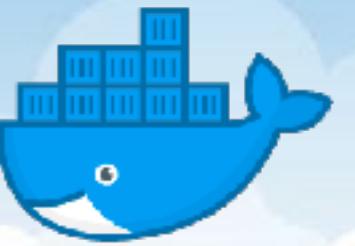
## Isolated:

- Memory

## Shared:

- File system
- Network
- Devices
- OS Kernel

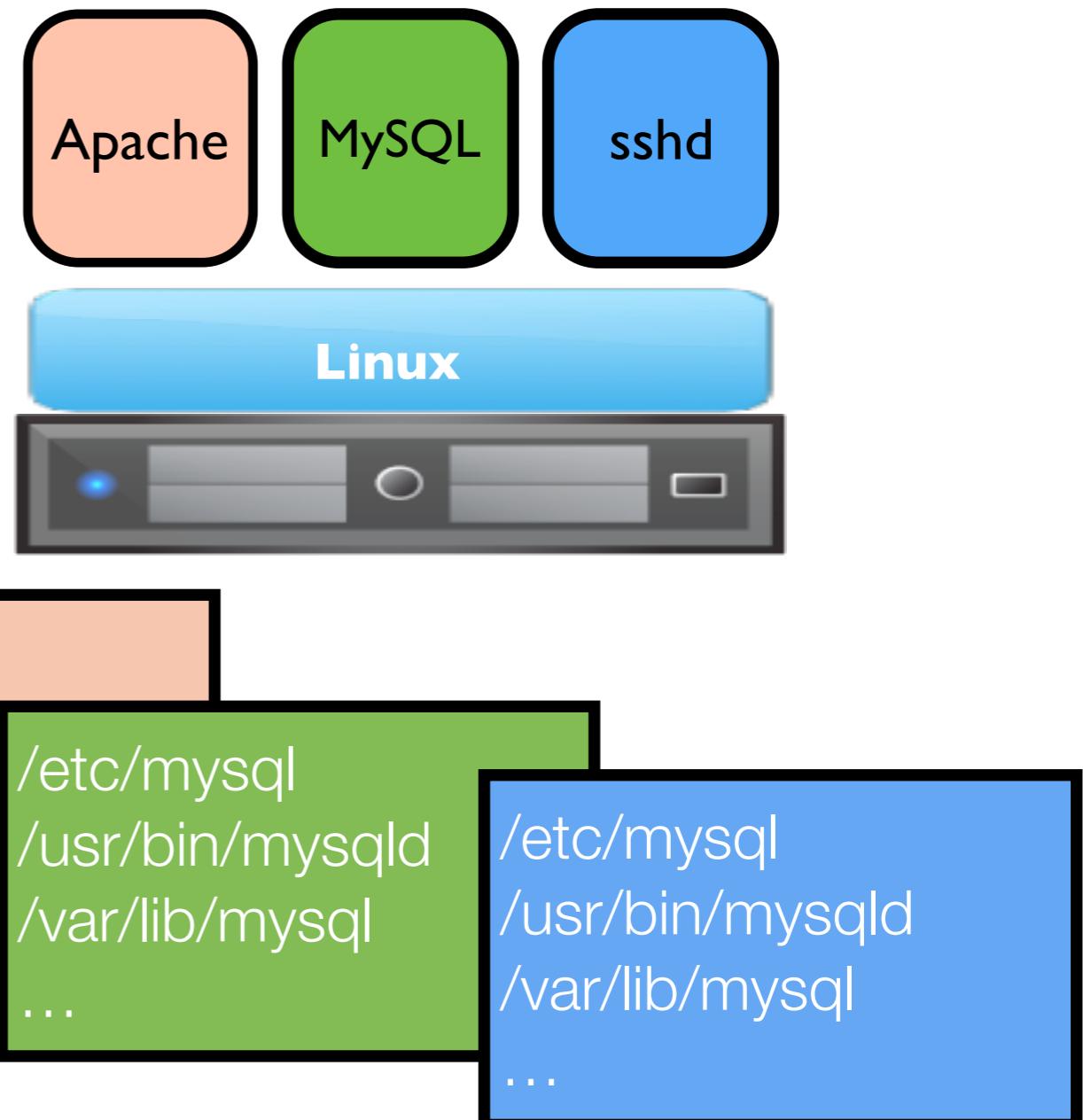
/etc/  
/etc/apache2  
/etc/sshd.conf  
/etc/mysql  
/usr/bin/mysqld  
...



# Containers

## Containers

- Namespace-based isolation using LXC and cgroups



## Isolated:

- Memory
- File system
- Network
- Devices

## Shared:

- OS Kernel

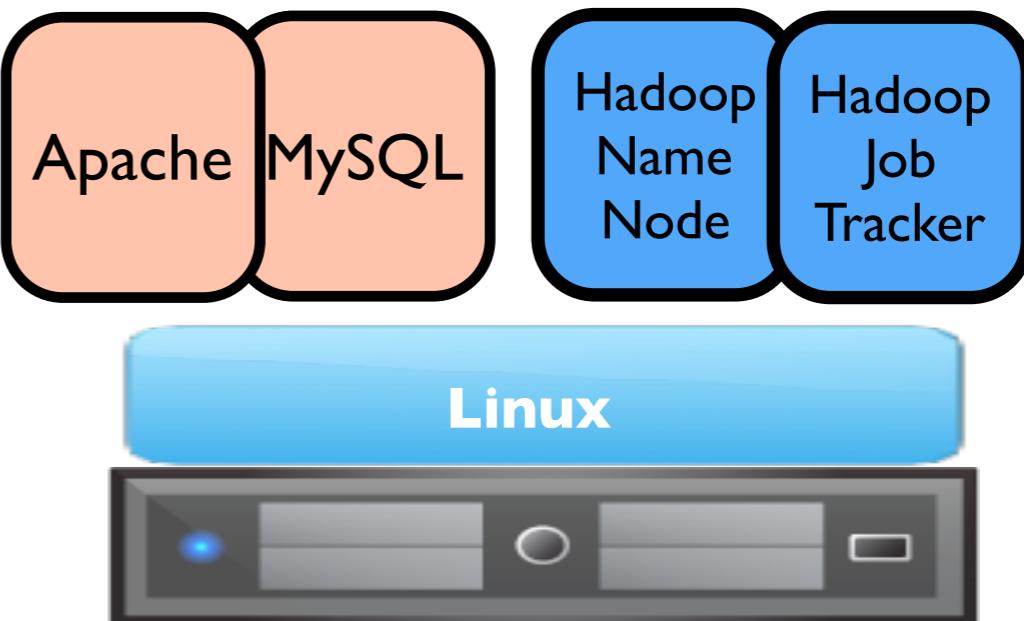
# Containers



docker

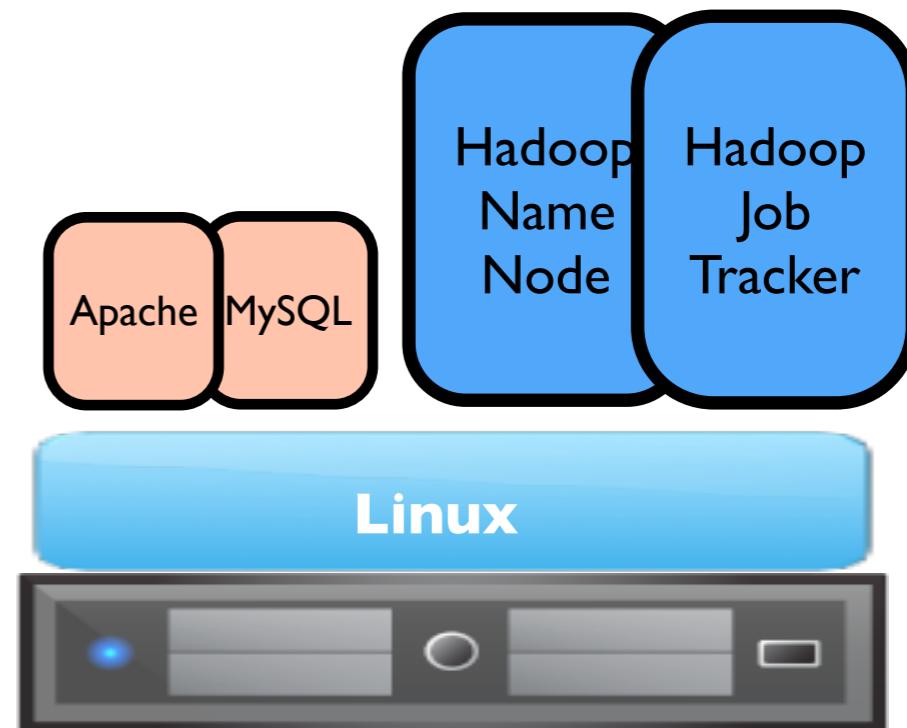
## Multi-process containers

- Can run multiple processes in the same container group



## Resources:

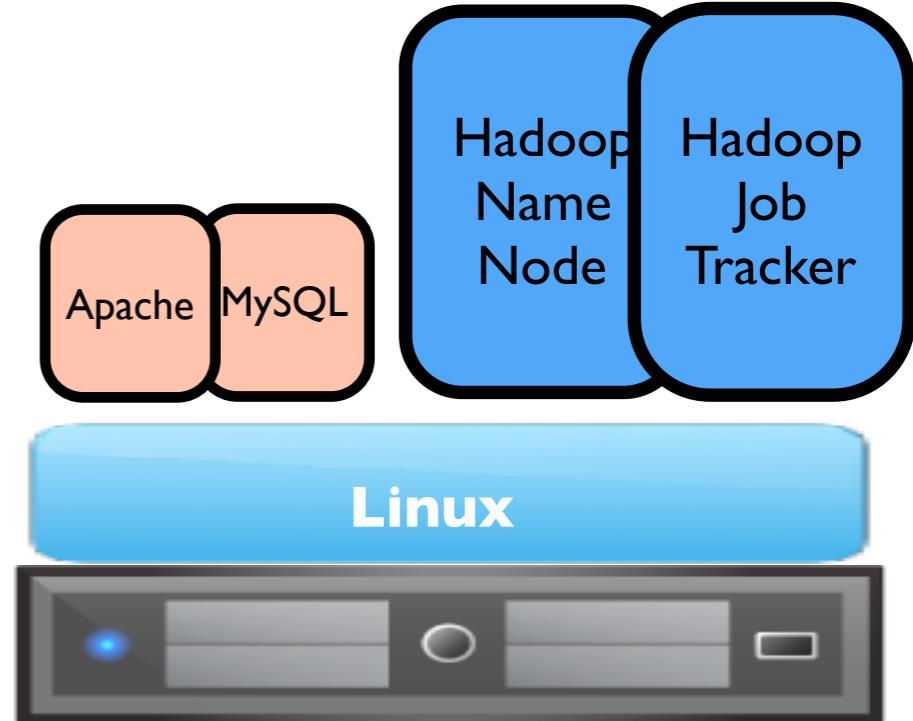
- Can assign CPU weights and memory limits for each group



# Shared Kernel

Shared Kernel provides

- Page tables (memory)
- Scheduler (CPU)
- Networking stack
- File system virtualization



What's the difference between the linux kernel and a linux distribution?

- Linux kernel 4.13 vs Linux Kernel 3.5 vs Ubuntu 14.04 vs RedHat 7?

# Distro vs Kernel

Kernel = core operating system functionality

- kernel 4.7

Distribution = collection of software and kernel

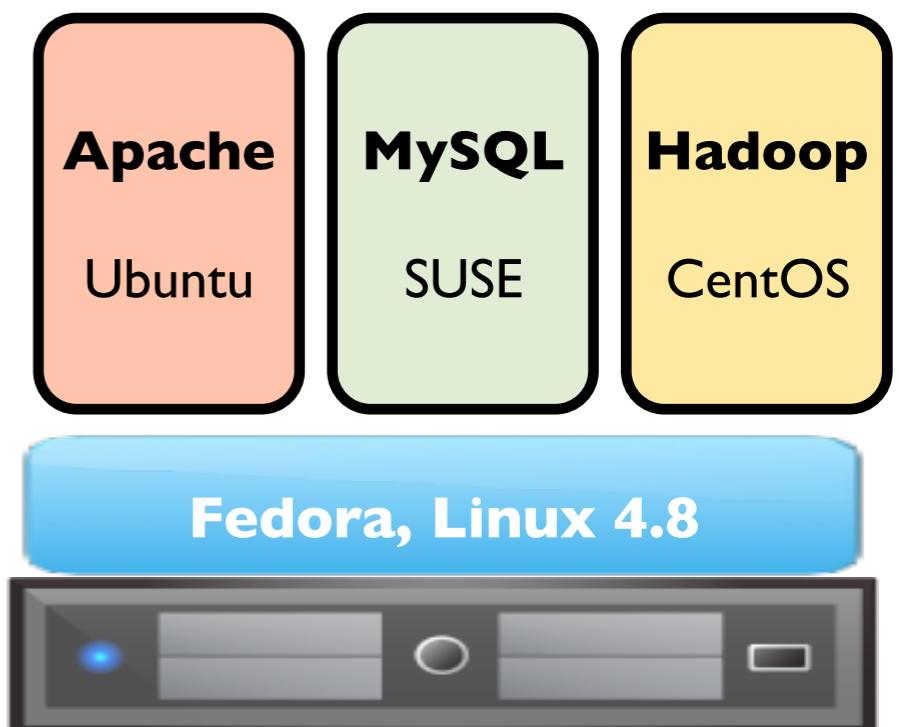
- Ubuntu, CentOS, RedHat

Distributions can work with many different kernels

# Containers and Distros

Each container can have its own distribution

Must share the same host kernel



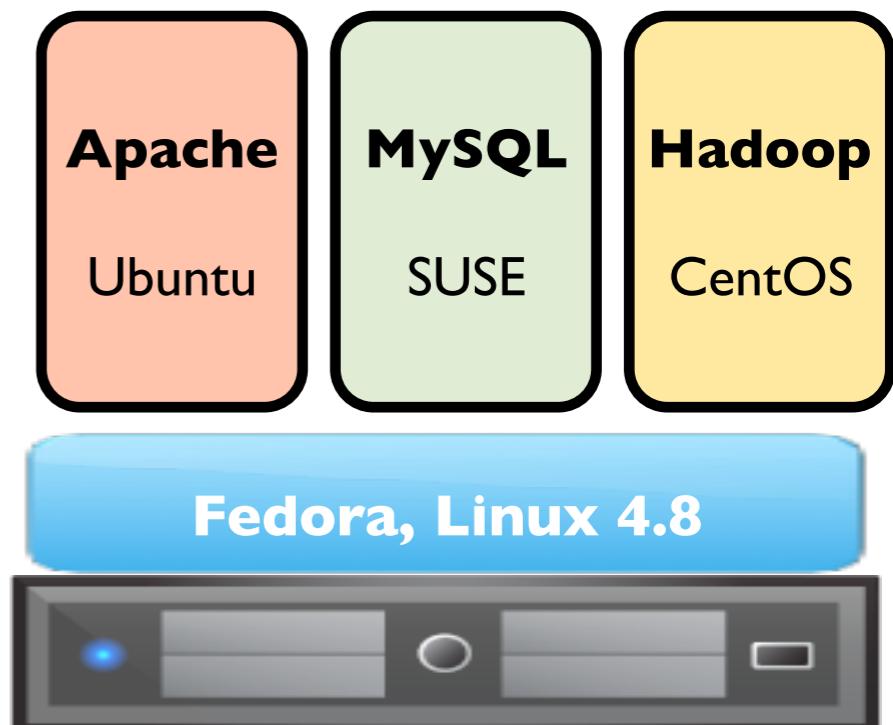
# Container Packaging

Deployment - big benefit of containers/virtualization

- Lets you package up an application and all of its requirements
- Even the distribution and 3rd party utilities!
- Very helpful for system administrators

Container “image” includes:

- Linux distribution base files
- Dependency libs/utils
- Configuration files
- Application to run



Does not include...?

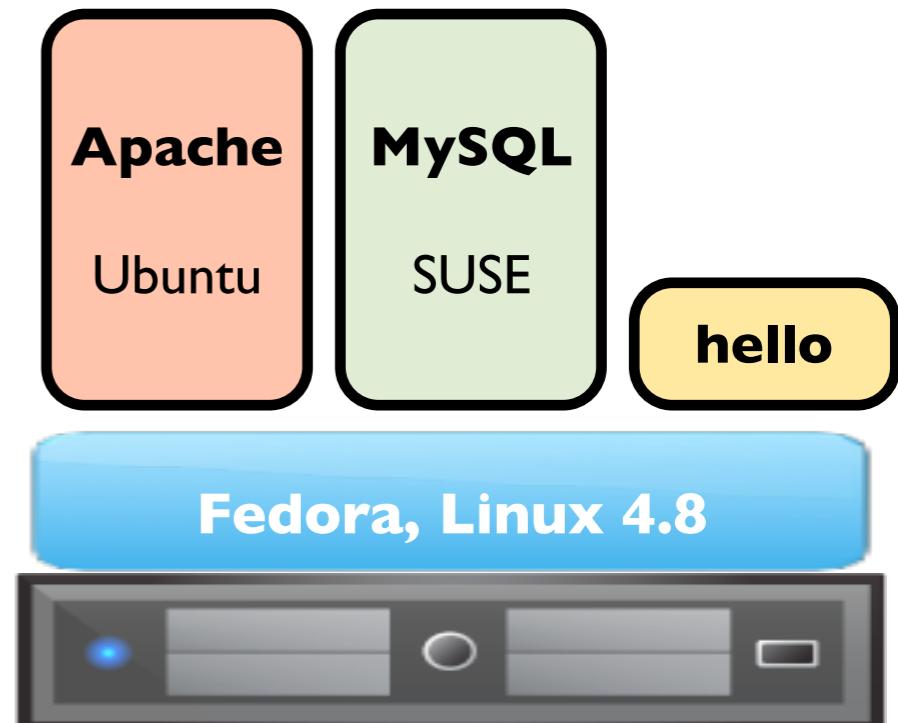
# Container Packaging

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Container “image” includes:

- Linux distribution base files
- Dependency libs/utils
- Configuration files
- Application to run



**Can inherit files/libraries from host to reduce size of the container package!**

# File System Virtualization

Container's file system is built by layering

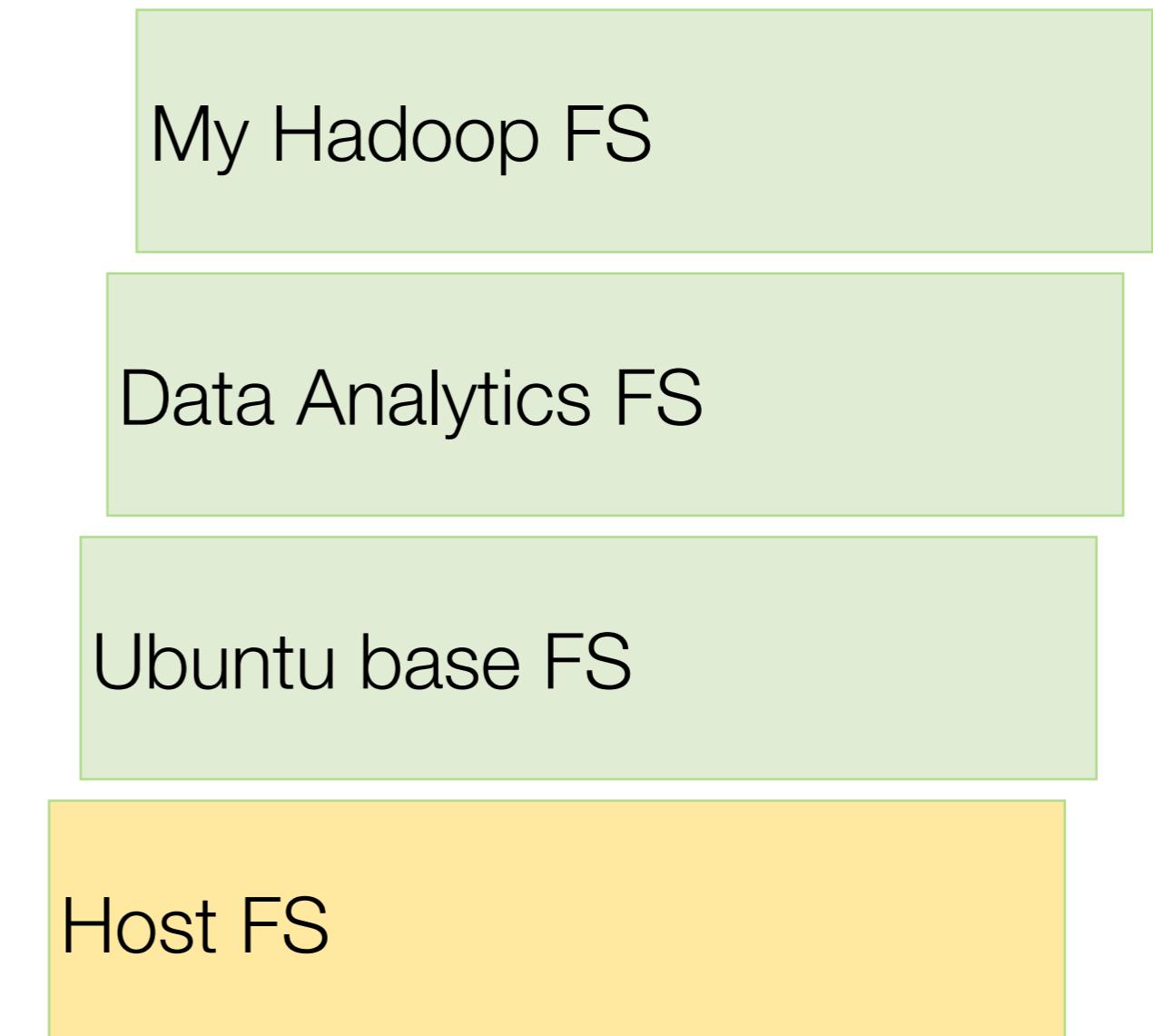
- Several containers can use the same FS layers

Read/Write

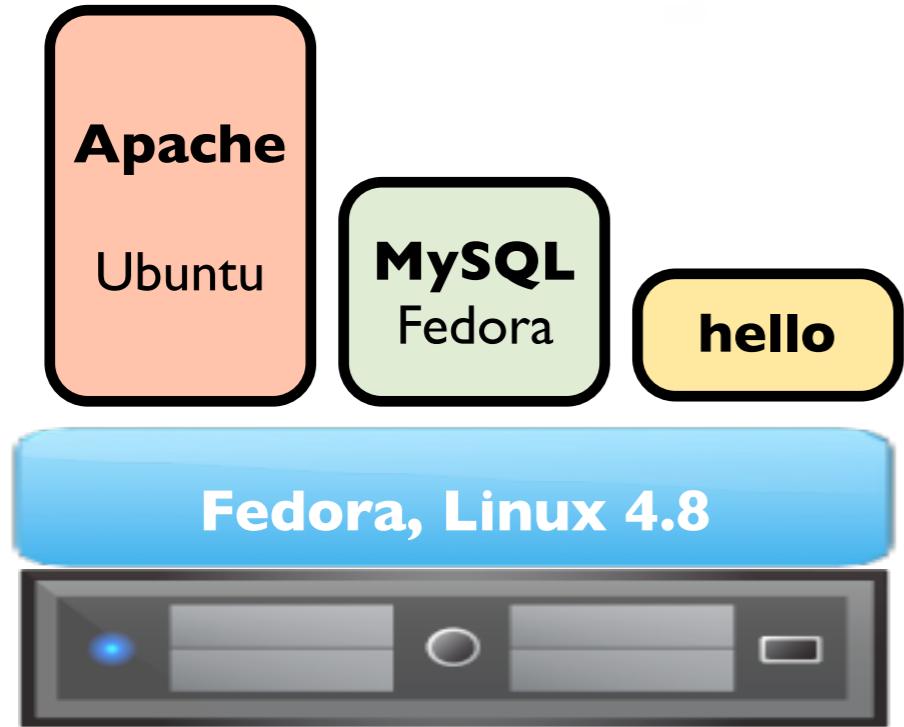
- Allow multiple containers to manipulate data on host FS

Copy on Write

- Each container thinks it has its own version of the FS
- Only duplicate the specific files (data blocks) that are written to

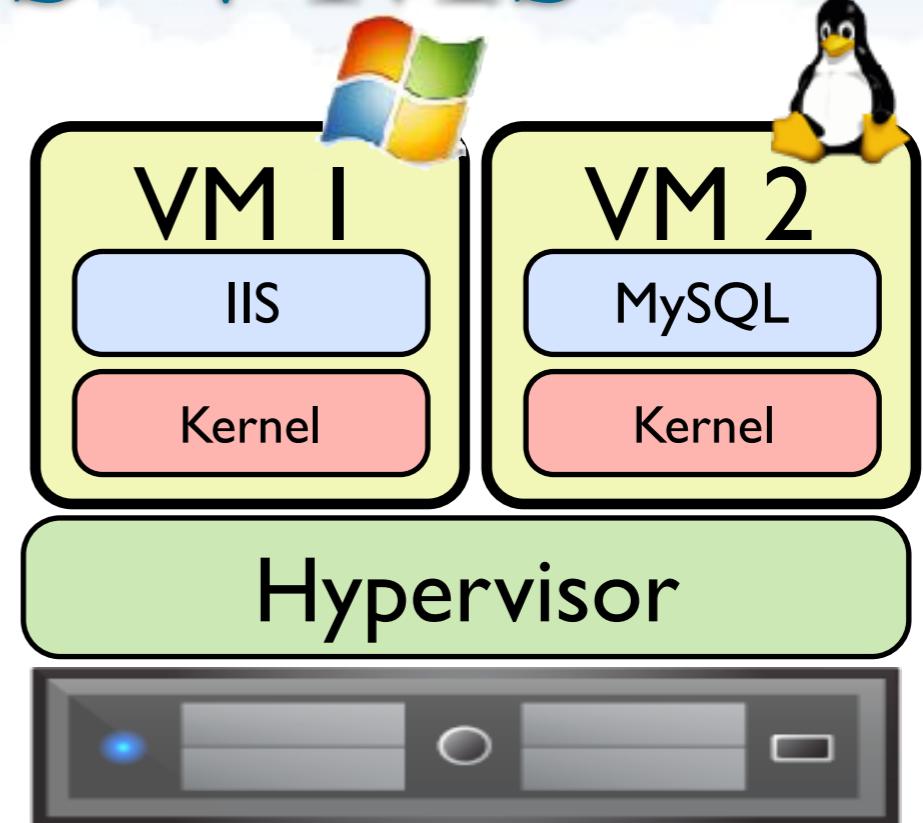


# Container vs VMs



Pros:

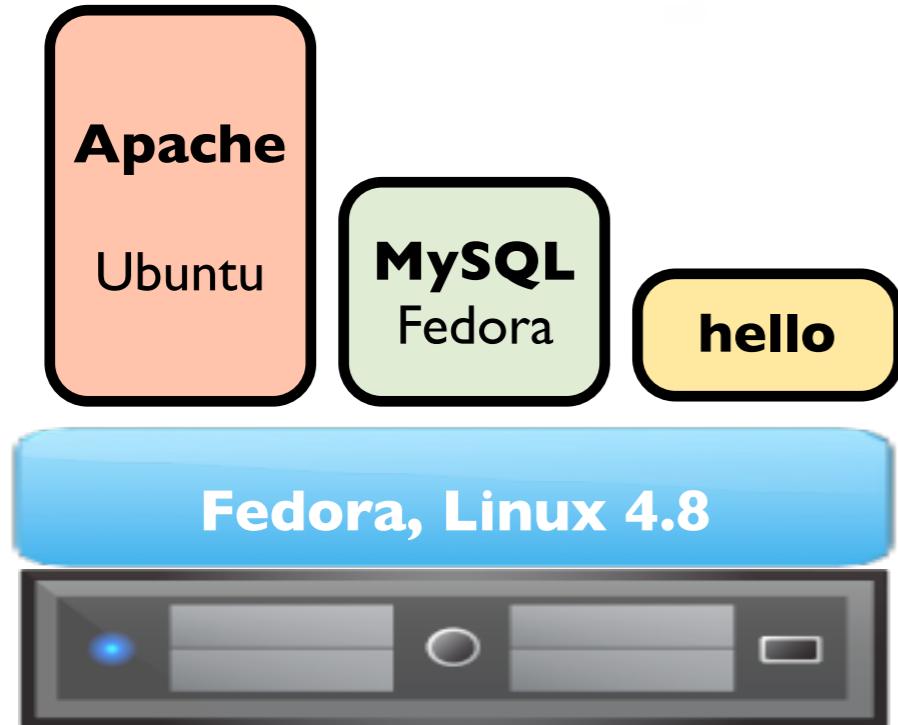
- lightweight (no duplication)
- less resource consumption
- easier to deploy
- specify resources just for application
- startup time



Pros:

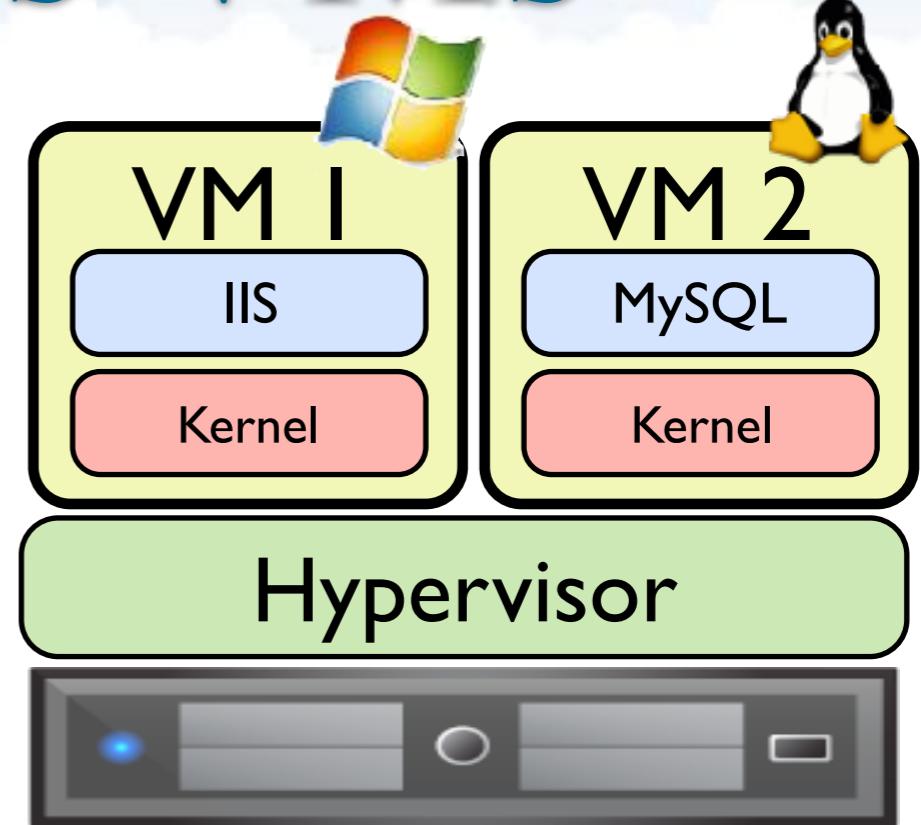
- stronger isolation
- different kernel versions/OSes
- fault tolerance / isolation
- combine with containers

# Container vs VMs



Pros:

- ???



Pros:

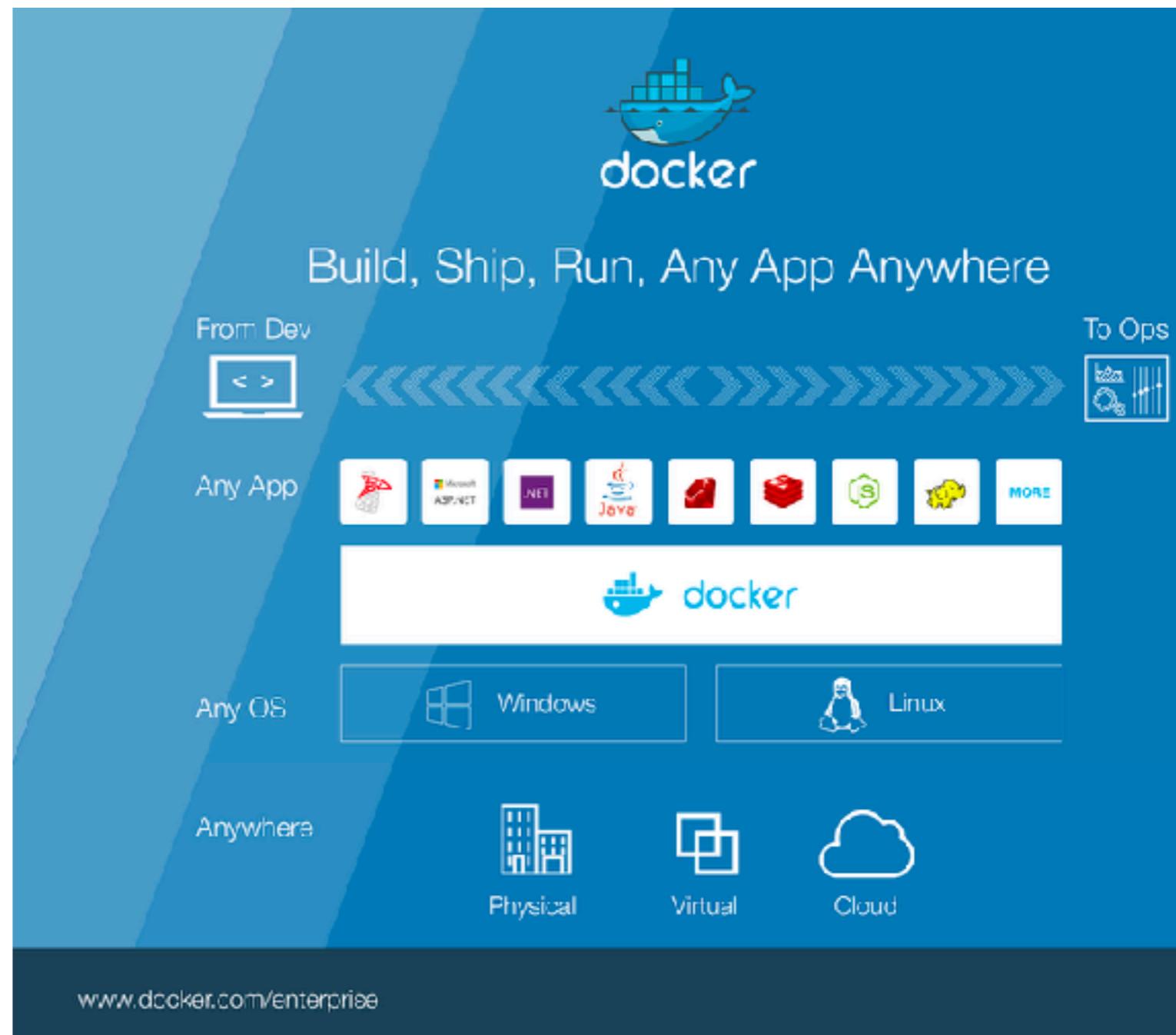
- ???

# Containers + VMs

Containers can be combined with virtualization tools

## Docker on Windows

- Lets you run windows containers using OS isolation tools
- Lets you run Linux containers by starting a linux VM automatically for you and dividing it up into containers



# Distributed Systems Challenges?

Clouds, VMs, Containers

# Challenges

Heterogeneity

Openness

Security

Failure Handling

Concurrency

Quality of Service

Scalability

Transparency

# Challenges

Heterogeneity: *different HW, SW, workloads*

Openness: *interoperability, shared protocols*

Security: *confidentiality, integrity, availability*

Failure Handling: *crashes, bugs, malicious*

Concurrency: *parallelism, consistency*

Quality of Service: *latency, throughput*

Scalability: *performance gain with more resources*

Transparency: *abstraction layers, interfaces*

# Challenges

Heterogeneity

Openness

Security

Failure Handling

Concurrency

Quality of Service

Scalability

Transparency

**Clouds**

- IaaS
- PaaS
- SaaS

**Virtual Machines**

**Containers**

# Heterogeneity

# Openness

# Security

# Failure Handling

# Concurrency

# Quality of Service

# Scalability

# Transparency

# Sources

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