

Day 1

Introduction to Cloud Computing with Amazon EC2 and Apache Hadoop

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Presented By Saliya Ekanayake



Cloud Computing

- What's Cloud?
 - Defining this is not worth the time
 - Ever heard of The Blind Men and The Elephant?
 - · If you still need one, see NIST definition next slide
 - The idea is to consume X as-a-service, where X can be
 - · Computing, storage, analytics, etc.
 - X can come from 3 categories
 - Infrastructure-as-a-S, Platform-as-a-Service, Software-as-a-Service

Classic Computing

IaaS



My washer My bleach I wash

Rent a washer or two or three My bleach I wash Cloud Computing

PaaS



I tell, comforter → dry clean shirts → regular clean

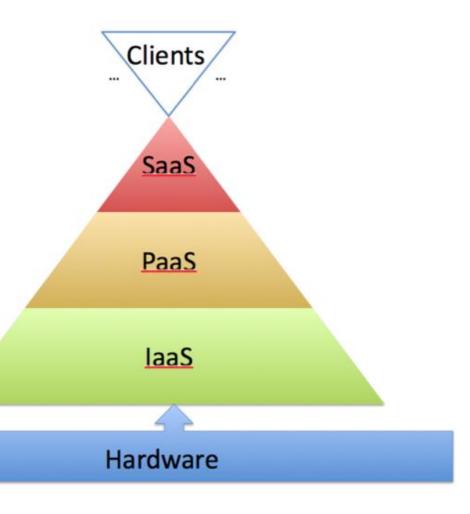
SaaS



Put my clothes in and they magically appear clean the next day

The Three Categories

- Software-as-a-Service
 - Provides web-enabled software
 - Ex: Google Gmail, Docs, etc
- Platform-as-a-Service
 - Provides scalable computing environments and runtimes for users to develop large computational and big data applications
 - Ex: Hadoop MapReduce
- Infrastructure-as-a-Service
 - Provide virtualized computing and storage resources in a dynamic, on-demand fashion.
 - Ex: Amazon Elastic Compute Cloud



The NIST Definition of Cloud Computing?

- "Cloud computing is a model for enabling ubiquitous, convenient, on-demand network access to a shared pool of configurable computing resources (e.g., networks, servers, storage, applications, and services) that can be rapidly provisioned and released with minimal management effort or service provider interaction."
 - On-demand self-service, broad network access, resource pooling, rapid elasticity, measured service,
 - http://nvlpubs.nist.gov/nistpubs/Legacy/SP/nistspecialpublication800-145.pdf
- However, formal definitions may not be very useful. We need hands on experience!

Cloud Computing

- Why Cloud?
 - Cost-effective
 - No upfront cost pay as you go model
 - Elastic
 - On demand scaling
 - Maintenance free
 - Experienced people maintain it for you
 - Flexible
 - Mix and match architectures
 - Secure
 - Simple Programming Models and Services
 - Not always, but built-in support for many data analytic tasks

5

I Like Clouds. What Are My Options?

- Major Cloud Providers
 - Amazon https://aws.amazon.com/
 - Microsoft https://azure.microsoft.com/en-us/
 - Google https://cloud.google.com/
- · Amazon vs. Microsoft vs. Google
 - http://cloudacademy.com/blog/public-cloud-war-aws-vs-azure-vs-google/
 - https://www.youtube.com/watch?v=342KEaxFVjM
- Other Providers
 - http://cloud-computing.softwareinsider.com/

Grants for Educators – Amazon

Amazon AWS Educate https://aws.amazon.com/education/awseducate/

AWS Educate: Program Benefits

Access cloud content, training, collaboration tools, and AWS technology at no cost by joining AWS Educate today.

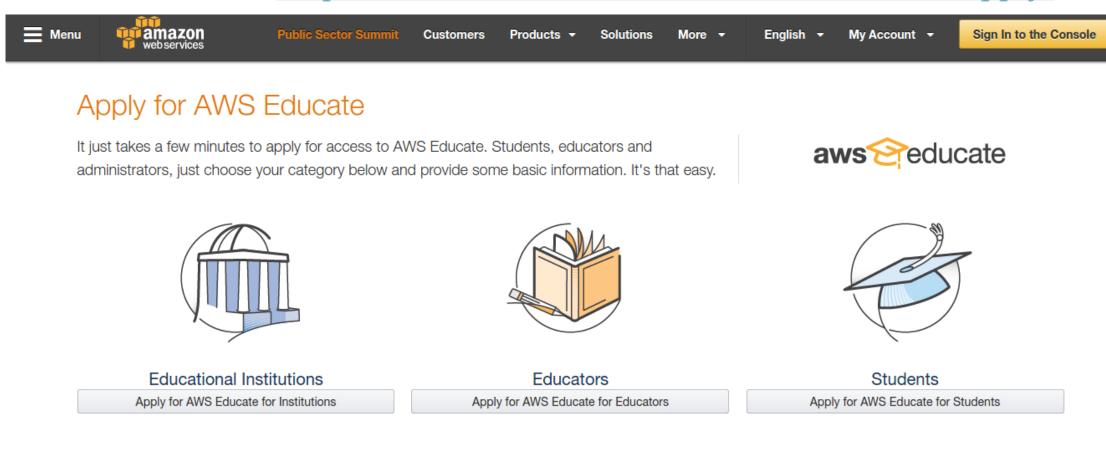
Students

Educators

	Educators	Students
AWS Credits (annually renewable)	 \$200 in AWS credits per educator – at member institutions \$75 in AWS credits per educator – at non-member institutions 	 \$100 in AWS credits per student – at member institutions \$35 in AWS credits per student – at non-member institutions
AWS Training	 Free access to labs Free AWS Technical Essentials eLearning course 50% off instructor-led training provided by AWS in the United States, Brazil or Japan 50% off AWS certification exams 	Free access to labs
Curated Content	 Free access to AWS content for classes Free access to content contributed by leading educators 	Free access to AWS content for homework, labs, or self- study
Collaboration Tools	 Educator Collaboration Portal access Virtual and in-person events Contribute and rate content Private and public discussion forums Provide feedback on AWS Educate 	 Student Portal access Virtual and in-person event to gather information, share best practices, and network Provide feedback on AWS Educate

Grants for Educators – Amazon

• Amazon AWS Educate http://aws.amazon.com/education/awseducate/apply/



Have questions about signing up?

Contact us today »

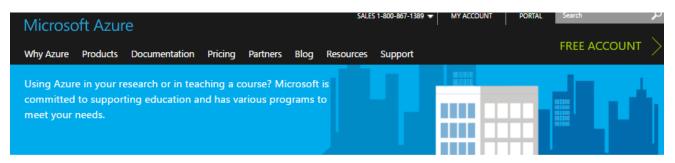


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Grants for Educators – Amazon

- Amazon offers credits to institutions, instructors, and students to use Amazon Web Services for free.
- Can apply for up to \$200 in instructor credits, \$100 in student credits if you are a member institution.
 - Must have class website with curriculum and members for verification
 - Apply with school .edu email address
- Applications processed in around 48 hours.
- · Given a promotion code that's easily applied to your Amazon account.
- We are using AWS Educate credits for this workshop!

Grants for Educators – Microsoft



Educators

Empower faculty to leverage Microsoft Azure in teaching cutting edge courses



Virtual Machines: Run Windows or Linux virtual machines in the cloud



Mobile Services: Includes features that accelerate the development of mobile applications



Media Services: Create, manage or distribute media



Cloud Services: Build or extend existing enterprise applications



Big Data: Process enormous amounts of data

See all services •

The Educator Grant is a program designed specifically to provide access to Microsoft Azure to college and university professors teaching advanced courses. As part of the program, faculty teaching Azure in their curricula are awarded subscriptions to support their course.

To apply for an Educator Grant fill out this simple application form.



See all services at

https://azure.microsoft.com/en-us/services/

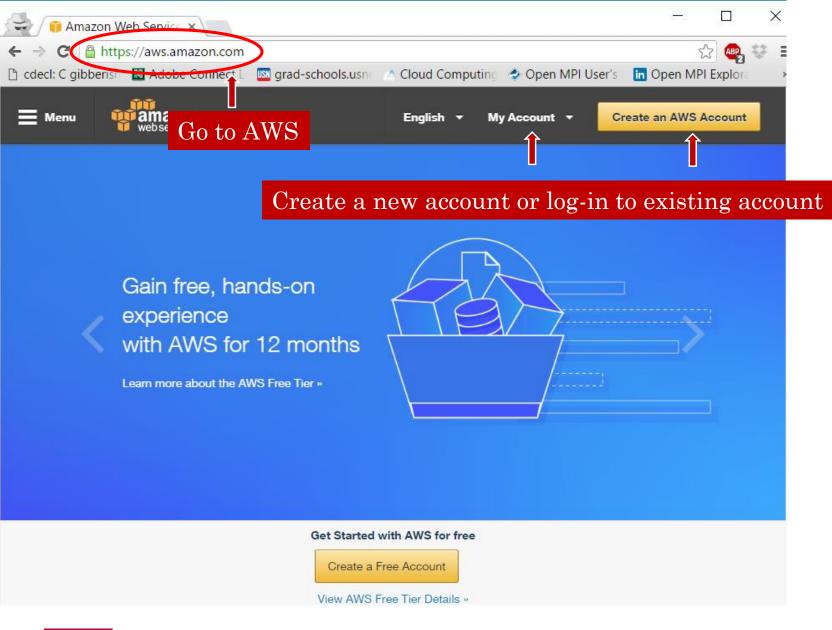
Apply at

https://azure.microsoft.com/en-us/community/education/



Hands-on 1

Getting Started with Amazon AWS

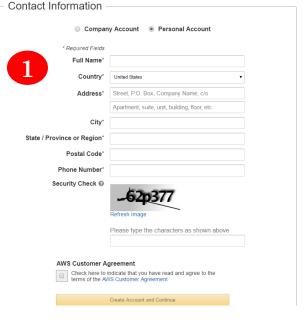




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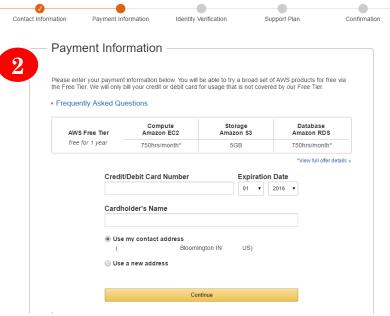
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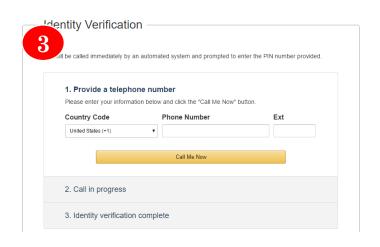
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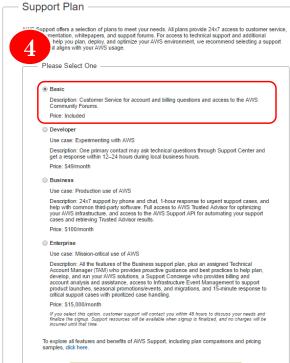
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Identity Verification





Thank you for creating an Amazon Web Services Account. We are activating your account, which should only takes a few minutes. You will receive an email when this is complete.

Contact Information

Payment Information

Sign In to the Console Contact Sales

Confirmation

Get Started with AWS Technical Documentation









Launch a Linux Virtual Machine Store Your Files in the Cloud

Launch a WordPress Website

Launch a Web Application

View all documentation >>

UTING

Quick Starts



Build a web app

mobile app



Launch a Virtual Machine (EC2 Instance)

Host a static website



Back up your files Learn More



Analyze big data

If all goes well, you should be able to see this page

AWS Services show categories

Build a backend for your

COMPUTE

EC2

EC2 Container Service Elastic Beanstalk Lambda

STORAGE & CONTENT DELIVERY

S3

CloudFront

Elastic File System PREVIEW

Glacier Snowball Storage Gateway

DATABASE

RDS

DynamoDB ElastiCache Redshift DMS

DEVELOPER TOOLS

CodeCommit CodeDeploy CodePipeline

MANAGEMENT TOOLS

CloudWatch CloudFormation CloudTrail Config OpsWorks Service Catalog Trusted Advisor

SECURITY & IDENTITY

IAM

Directory Service Inspector WAF Certificate Manager

INTERNET OF THINGS AWS IoT

GAME DEVELOPMENT

GameLift

MOBILE SERVICES

Mobile Hub Cognito Device Farm Mobile Analytics SNS

APPLICATION SERVICES

API Gateway AppStream CloudSearch Elastic Transcoder SES SOS

SWF

GETTING STARTED

Read our documentation or view our training to learn more about AWS.

AWS CONSOLE MOBILE APP

View your resources on the go with our AWS Console mobile app, available from Amazon Appstore, Google Play, or iTunes.

AWS MARKETPLACE

Find and buy software, launch with 1-Click and pay by the hour.

FEEDBACK

Let us know what you think about new Console Home.

Service Health

View Dashboard



All services are operating normally Updated Jun 08 2016 14:36:00 GMT-0400

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Hands-on 1

Questions?

Amazon Web Services

- Grew out of Amazon's need to rapidly provision and configure machines of standard configurations for its own business.
- Early 2000s Both private and shared data centers began using virtualization to perform "server consolidation"
- 2003 Internal memo by Chris Pinkham describing an "infrastructure service for the world."
- 2006 S3 first deployed in the spring, EC2 in the fall
- 2008 Elastic Block Store available.
- 2009 Relational Database Service
- 2012 DynamoDB
- · 2015 Amazon ECS

AWS Services

Amazon Web Services

Compute



Virtual Servers in the Cloud



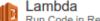
EC2 Container Service

Run and Manage Docker Containers



Elastic Beanstalk

Run and Manage Web Apps



Run Code in Response to Events

Storage & Content Delivery



Scalable Storage in the Cloud



CloudFront

Global Content Delivery Network



Elastic File System PREVIEW Fully Managed File System for EC2





Archive Storage in the Cloud



Snowball

Large Scale Data Transport



Storage Gateway

Hybrid Storage Integration

Database



Managed Relational Database Service



DvnamoDB

Managed NoSQL Database



ElastiCache

ElastiCacne
In-Memory Cache



Redshift

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

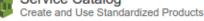


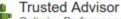
OpsWorks

Automate Operations with Chef



Service Catalog





Optimize Performance and Security

Security & Identity



Identity & Access Management Manage User Access and Encryption Keys



Directory Service

Host and Manage Active Directory



Inspector

Analyze Application Security



Web Traffic

Internet of Things



AWS IoT

Connect Devices to the Cloud

Game Development



GameLift

Deploy and Scale Session-based Multiplayer Games

Mobile Services



Mobile Hub

Build, Test, and Monitor Mobile Apps



Cognito

User Identity and App Data Synchronization



Device Farm

Test Android, iOS, and Web Apps on Real Devices in



Mobile Analytics Collect, View and Export App Analytics



Push Notification Service

Application Services



API Gateway Build, Deploy and Manage APIs



Low Latency Application Streaming



CloudSearch Managed Search Service



Easy-to-Use Scalable Media Transcoding



Email Sending and Receiving Service



Message Queue Service



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Get Certified!

https://aws.amazon.com/certification/

AWS Certification

AWS Certifications recognize IT professionals with the technical skills and expertise to design, deploy, and operate applications and infrastructure on AWS. Exams are offered in multiple languages at testing centers around the world.



Why Get Certified?

Show You're an Expert

AWS Certification is an industry-recognized credential that shows you have the expertise to design, deploy, or operate applications and infrastructure on AWS.

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Advance Your Career

AWS Certification shows customers, employers, and recruiters that you have the skills and knowledge to build AWS solutions.

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become a member of our LinkedIn AW Certified community.

Roadmap Associate Exams Professional Exams

Earn your Associate level certification and then advance to Professional level within a given role.



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AWS Certified Solutions Architect - Associate

AWS Certified Solutions Architect - Professional



Developer

AWS Certified

Developer - Associate



SysOps Administrator

AWS Certified SysOps
Administrator - Associate

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AWS Certified DevOps Engineer - Professional

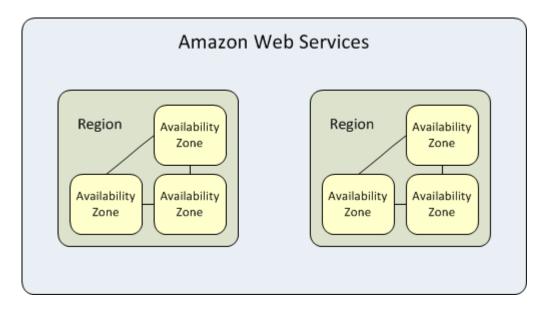
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Amazon Elastic Compute Cloud (EC2)

- Amazon EC2 is a central component of the Amazon Web Services
- Provides virtualized computing resources on-demand.
- Creates and manages VM instances, thereby renting computing services based on resource requests
- Interaction with other AWS services such as S3, EBS, etc.
- Public Infrastructure-as-a-Service

Terminology

- Instance
 - One running virtual machine.
- Instance Type
 - · hardware configuration: cores, memory, disk.
- Instance Store Volume
 - Temporary disk associated with instance.
- Image (AMI)
 - Stored bits which can be turned into instances.
- Key Pair
 - · Credentials used to access VM from command line.
- Region
 - · Geographic location, price, laws, network locality.
- Availability Zone
 - Subdivision of region the is fault-independent.
 - http://docs.aws.amazon.com/AWSEC2/latest/UserGuide/using-regions-availability-zones.html



Model	vCPU	CPU Credits / hour		Mem (GiB)	Storage (GB)
t2.micro	1	6	,	1	EBS Only
t2.small	1	12	2	2	EBS Only
t2.medium	2	24	4	4	EBS Only
c3.large		2	3.75	2	2 x 16
c3.xlarge		4	7.5	2	2 x 40
c3.2xlarge		8	15	2	2 x 80
c3.4xlarge		16	30	2	x 160
c3.8xlarge		32	60	2	x 320

Use Cases

High performance front-end fleets, web-servers, on-demand batch processing, distributed analytics, high performance science and engineering applications, ad serving, batch processing, MMO gaming, video encoding, and distributed analytics.

Model	vCPU	Mem (GiB)	SSD Storage (GB)
m3.medium	1	3.75	1 x 4
m3.large	2	7.5	1 x 32
m3.xlarge	4	15	2 x 40
m3.2xlarge	8	30	2 x 80
r3.large	2	15.25	1 x 32
r3.xlarge	4	30.5	1 x 80
r3.2xlarge	8	61	1 x 160
r3.4xlarge	16	122	1 x 320
r3.8xlarge	32	244	2 x 320

Use Cases

We recommend memory-optimized instances for high performance databases, distributed memory caches, in-memory analytics, genome assembly and analysis, larger deployments of SAP, Microsoft SharePoint, and other enterprise applications.

EC2 Pricing Model

- Free Usage Tier
- On-Demand Instances
 - Start and stop instances whenever you like, costs are rounded up to the nearest hour. (Worst price)
- Reserved Instances
 - Pay up front for one/three years in advance. (Best price)
 - · Unused instances can be sold on a secondary market.
- Spot Instances
 - Specify the price you are willing to pay, and instances get started and stopped without any warning as the marked changes. (Kind of like Condor!)

http://aws.amazon.com/ec2/pricing/

Free Usage Tier

- 750 hours of EC2 running Linux, RHEL, or SLES t2.micro instance usage
- 750 hours of EC2 running Microsoft Windows Server t2.micro instance usage
- 750 hours of Elastic Load Balancing plus 15 GB data processing
- 30 GB of Amazon Elastic Block Storage in any combination of General Purpose (SSD) or Magnetic, plus 2 million I/Os (with Magnetic) and 1 GB of snapshot storage
- 15 GB of bandwidth out aggregated across all AWS services
- 1 GB of Regional Data Transfer

Surprisingly, you can't scale up that large.

Q: How many instances can I run in Amazon EC2?

You are limited to running up to 20 On-Demand Instances, purchasing 20 Reserved Instances, and requesting 5 Spot Instances per region. New AWS accounts may start with limits that are lower than the limits described here. Certain instance types are further limited per region as follows:

Instance Type	On-Demand Limit	Reserved Limit	Spot Limit
cg1.4xlarge	2	20	5
hi1.4xlarge	2	20	5
hs1.8xlarge	2	20	Not offered
cr1.8xlarge	2	20	5
g2.2xlarge	5	20	5
r3.4xlarge	10	20	5

Simple Storage Service (S3)

- A **bucket** is a container for objects and describes location, logging, accounting, and access control. A bucket can hold any number of **objects**, which are files of up to 5TB. A bucket has a name that must be **globally unique**.
- Fundamental operations corresponding to HTTP actions:
 - http://bucket.s3.amazonaws.com/object
 - POST a new object or update an existing object.
 - GET an existing object from a bucket.
 - DELETE an object from the bucket
 - LIST keys present in a bucket, with a filter.
- A bucket has a **flat directory structure** (despite the appearance given by the interactive web interface.)

Bucket Properties

- Versioning If enabled, POST/DELETE result in the creation of new versions without destroying the old.
- Lifecycle Delete or archive objects in a bucket a certain time after creation or last access or number of versions.
- Access Policy Control when and where objects can be accessed.
- Access Control Control who **may** access objects in this bucket.
- Logging Keep track of how objects are accessed.
- Notification Be notified when failures occur.

S3 Weak Consistency Model

From Amazon developer API:

- "Updates to a single key are **atomic**...."
- Amazon S3 achieves high availability by replicating data across multiple servers within Amazon's data centers.
- If a PUT request is successful, your data is safely stored.
 - · However, information about the changes must replicate across Amazon S3, which can take some time

	Standard Storage	Reduced Redundancy Storage	Glacier Storage
First 1 TB / month	\$0.0300 per GB	\$0.0240 per GB	\$0.0100 per GB
Next 49 TB / month	\$0.0295 per GB	\$0.0236 per GB	\$0.0100 per GB
Next 450 TB / month	\$0.0290 per GB	\$0.0232 per GB	\$0.0100 per GB
Next 500 TB / month	\$0.0285 per GB	\$0.0228 per GB	\$0.0100 per GB
Next 4000 TB / month	\$0.0280 per GB	\$0.0224 per GB	\$0.0100 per GB
Over 5000 TB / month	\$0.0275 per GB	\$0.0220 per GB	\$0.0100 per GB

Elastic Block Store

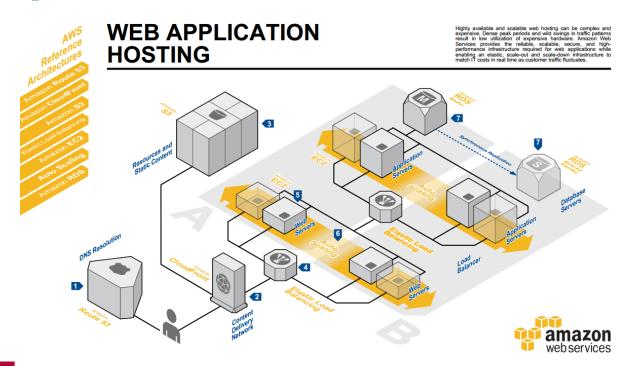
- An EBS volume is a **virtual disk** of a fixed size with a block read/write interface. It can be **mounted** as a filesystem on a running EC2 instance where it can be **updated incrementally.** Unlike an instance store, an EBS volume is **persistent.**
- (Compare to an S3 object, which is essentially a file that must be accessed in its entirety.)
- Fundamental operations:
 - CREATE a new volume (1GB-1TB)
 - COPY a volume from an existing EBS volume or S3 object.
 - MOUNT on one instance at a time.
 - SNAPSHOT current state to an S3 object.

Amazon EBS Volume Types

Volume Type	EBS General Purpose (SSD)	EBS Provisioned IOPS (SSD)	EBS Magnetic
Use Cases	Boot volumes Small to Med DBs Dev and Test	I/O intensive Relational DBs NoSQL DBs	Infrequent Data Access
Storage Media	SSD-backed	SSD-backed	Magnetic disk-backed
Max Volume Size	1TB	1TB	1TB
Max IOPS/volume	3,000 (burst)	4,000	40 - 200
Max throughput/volume	128MBps	128MBps	40 - 90MBps
Max IOPS/instance	48,000	48,000	48,000
Max throughput/instance	800MBps	800MBps	800MBps
API Name	gp2	io1	standard
Price*	\$.10/GB - Month	\$.125/GB - Month \$.065/provisioned IOPS	\$.05/GB - Month \$.05/million I/O

Where to Find More Info?

- The Getting Started Guide
 - http://docs.aws.amazon.com/gettingstarted/latest/awsgsg-intro/gsg-aws-intro.html
- AWS Architecture Center
 - https://aws.amazon.com/architecture/



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Hands-on 2

Launching EC2 Instances

Go to AWS.Amazon.com





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Sign In to the Console

PRODUCTS & SERVICES

Amazon EC2 Product Details > > Instances > Pricing Purchasing Options Developer Resources > > **FAQs** Getting Started > Amazon EC2 Run Command RELATED LINKS Amazon EC2 Dedicated Hosts Amazon EC2 Spot Instances Amazon EC2 Reserved Instances Amazon EC2 Dedicated Instances

Amazon EC2 - Virtual Server Hosting

Amazon Elastic Compute Cloud (Amazon EC2) is a web service that provides resizable compute capacity in the cloud. It is designed to make web-scale cloud computing easier for developers.

Amazon EC2's simple web service interface allows you to obtain and configure capacity with minimal friction. It provides you with complete control of your computing resources and lets you run on Amazon's proven computing environment. Amazon EC2 reduces the time required to obtain and boot new server instances to minutes, allowing you to quickly scale capacity, both up and down, as your computing requirements change. Amazon EC2 changes the economics of computing by allowing you to pay only for capacity that you actually use. Amazon EC2 provides developers the tools to build failure resilient applications and isolate themselves from common failure scenarios.

Introduction to Amazon EC2 (4:01)





Enter EC2 Console



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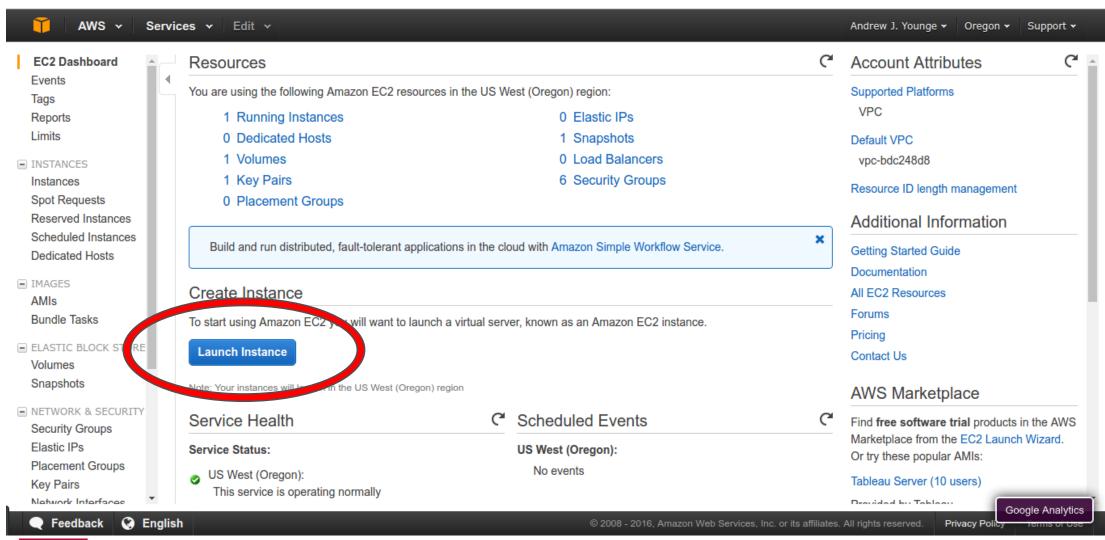
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Log into EC2 Dashboard



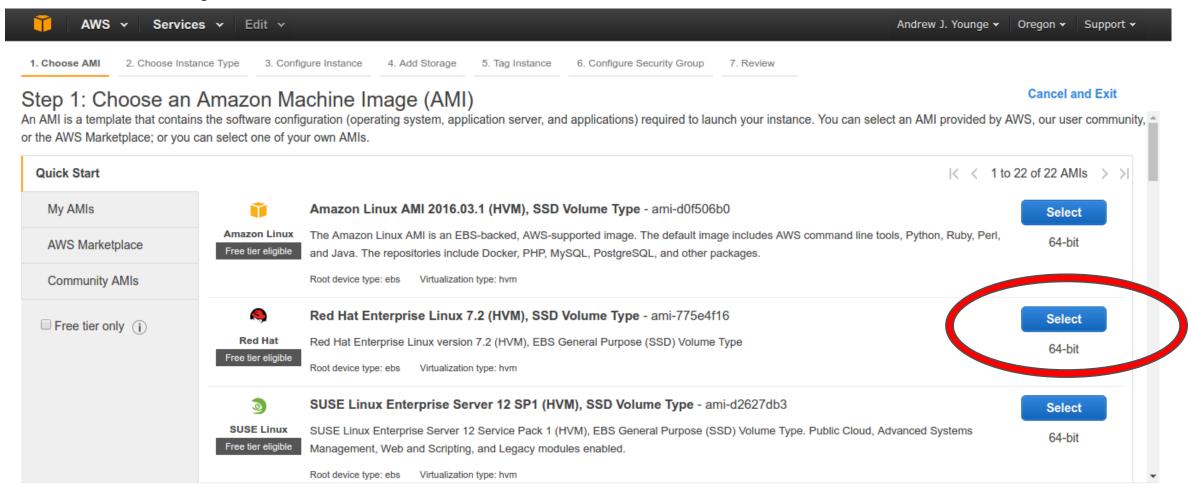


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Launch your first EC2 instance!



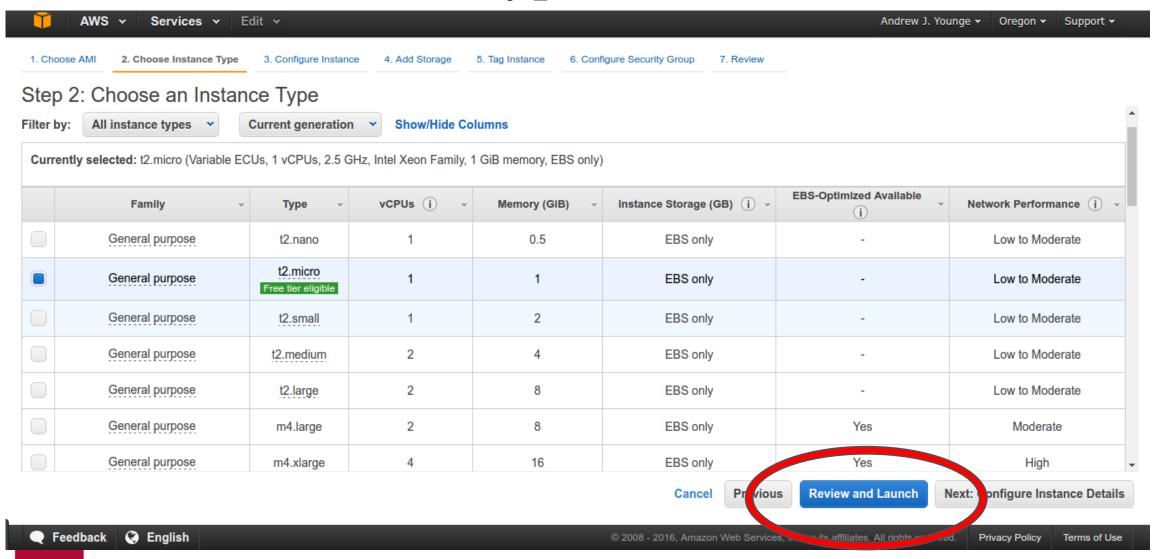
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Google Analytics

Privacy Policy

Select an Instance Type

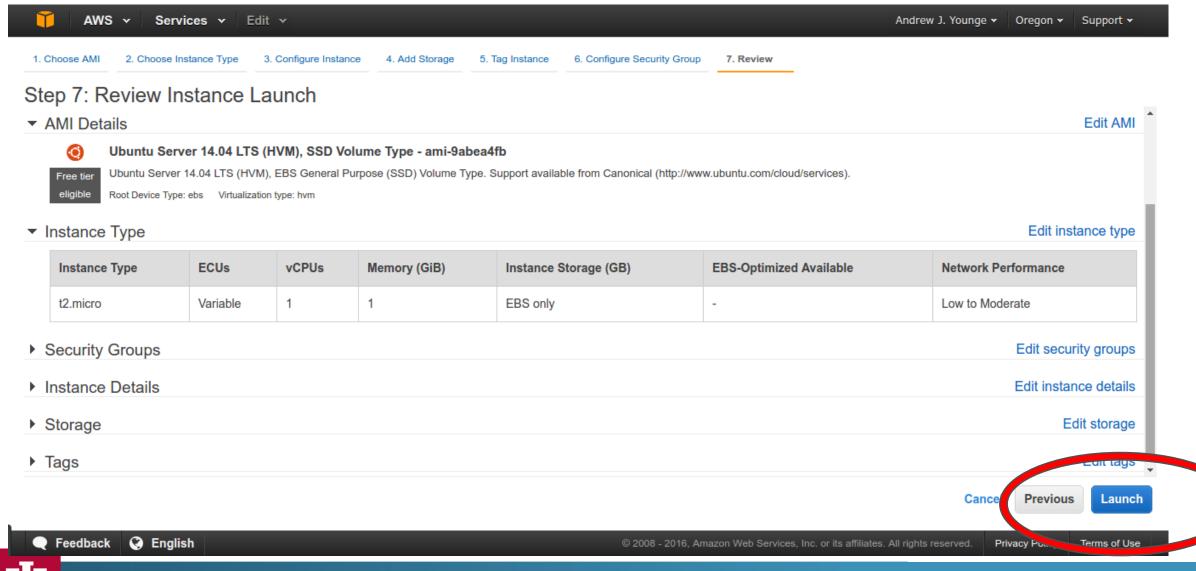


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Review your Instance settings, and Launch!



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Amazon uses SSH keypairs

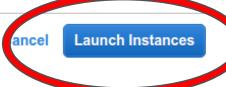
- Amazon EC2 uses SSH keypairs to control access to VMs
- Consists of public key (known) and private key (secret)
- You select which public key to use, and log in with your private key.
- Can use many different keypairs

Select an existing key pair or create a new key pair

A key pair consists of a **public key** that AWS stores, and a **private key file** that you store. Together, they allow you to connect to your instance securely. For Windows AMIs, the private key file is required to obtain the password used to log into your instance. For Linux AMIs, the private key file allows you to securely SSH into your instance.

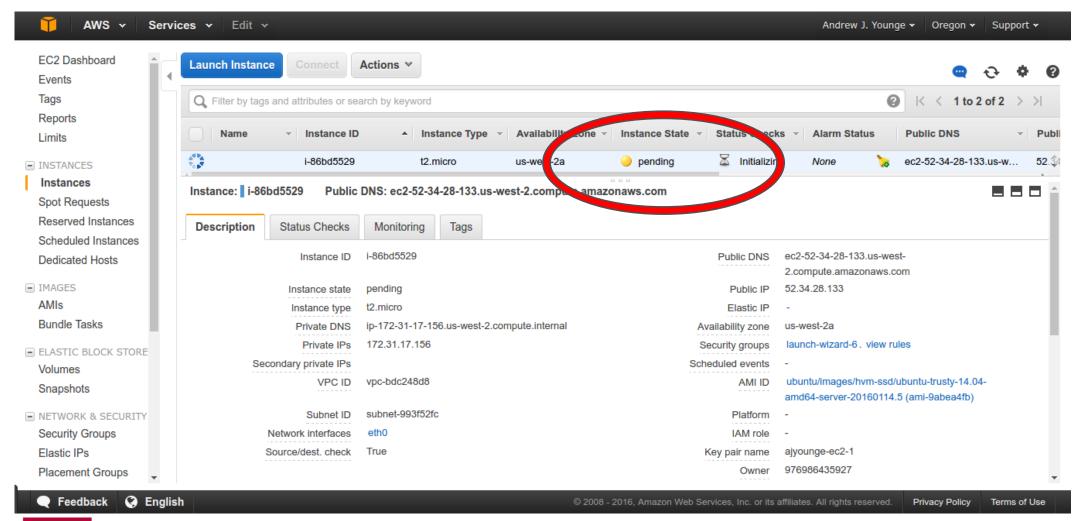
Note: The selected key pair will be added to the set of keys authorized for this instance. Learn more about removing existing key pairs from a public AMI.





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Booting your Instance...

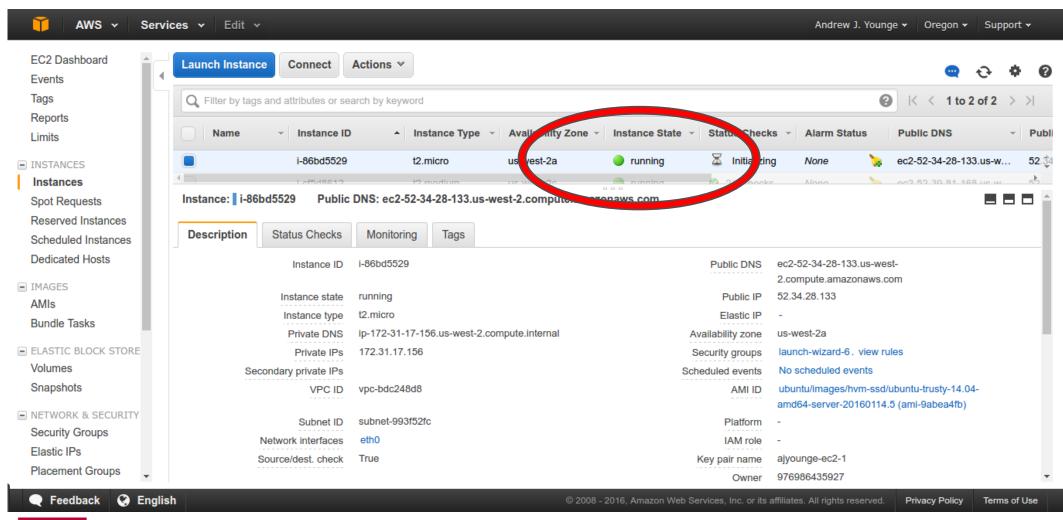




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Instance is running!



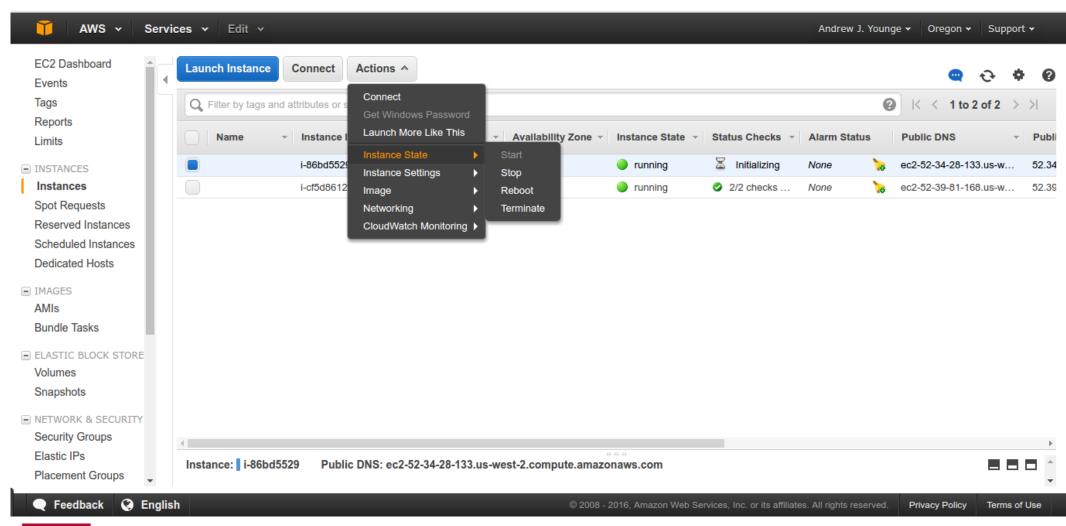
Login via SSH to your Instance

ssh -I ~/.ssh/ajyounge-ec2-1.pem ubuntu@52.34.28.133

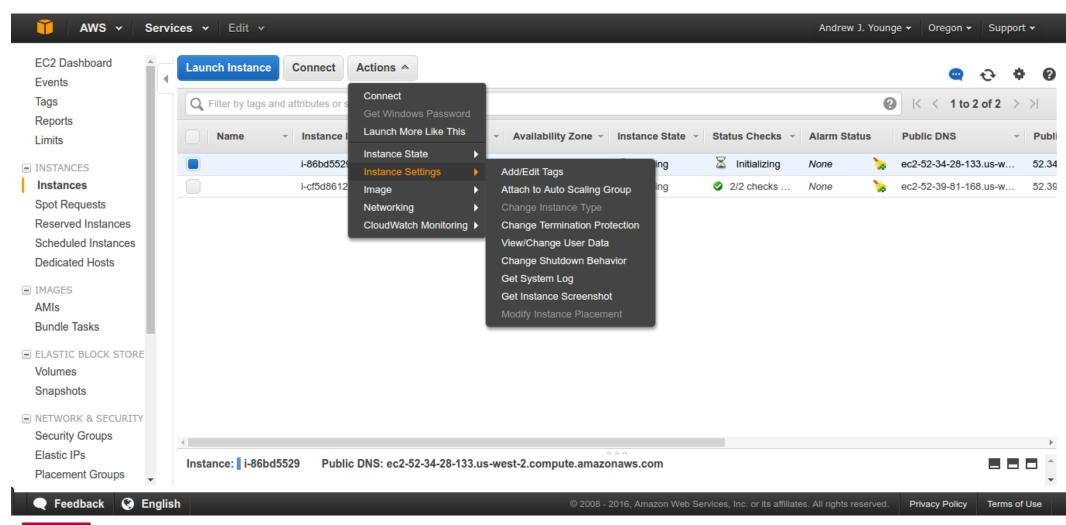
```
ubuntu@ip-172-31-17-156: ~ 168x45
ajyounge@gondor:~$ ssh -i ~/.ssh/ajyounge-ec2-1.pem ubuntu@52.34.28.133
The authenticity of host '52.34.28.133 (52.34.28.133)' can't be established.
ECDSA key fingerprint is SHA256:fiM87HqGkd4dCtKk03aV14L4U2Cp0rRq7MmF3E58wZI.
Are you sure you want to continue connecting (yes/no)? yes
Warning: Permanently added '52.34.28.133' (ECDSA) to the list of known hosts.
Welcome to Ubuntu 14.04.3 LTS (GNU/Linux 3.13.0-74-generic x86 64)
 * Documentation: https://help.ubuntu.com/
 System information as of Tue Jun 7 16:11:42 UTC 2016
 System load: 0.16 Memory usage: 5% Processes:
 Usage of /: 9.9% of 7.74GB Swap usage: 0% Users logged in: 0
 Graph this data and manage this system at:
   https://landscape.canonical.com/
  Get cloud support with Ubuntu Advantage Cloud Guest:
   http://www.ubuntu.com/business/services/cloud
 packages can be updated.
 updates are security updates.
The programs included with the Ubuntu system are free software;
the exact distribution terms for each program are described in the
individual files in /usr/share/doc/*/copyright.
Ubuntu comes with ABSOLUTELY NO WARRANTY, to the extent permitted by
applicable law.
ubuntu@ip-172-31-17-156:~$
```



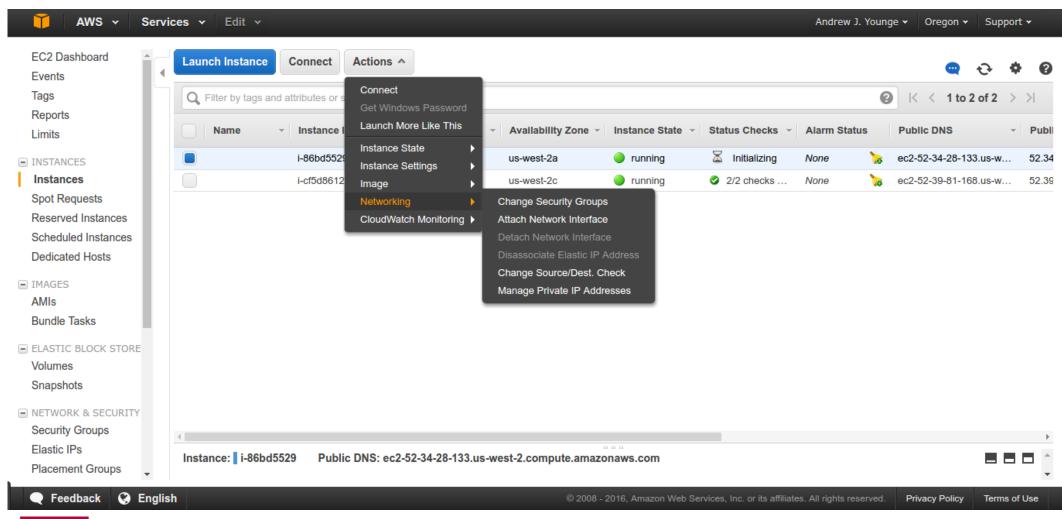
Manage Instance State



Manage Instance Settings

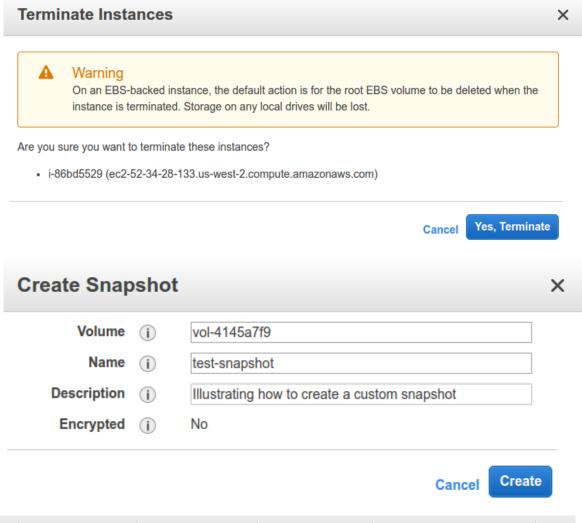


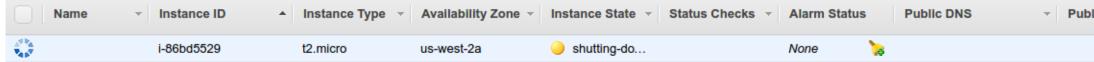
Manage Instance Networking



Terminate your Instance

- Make sure to terminate all your instances when you are finished
- Remember: You pay by the hour
- Even small instances can rack up large bills if left running!
- NOTE: You will lose all data when you terminate an instance.
 - Backup data to EBS, S3, or personal workstation.
 - Create an image snapshot to save current file system state.





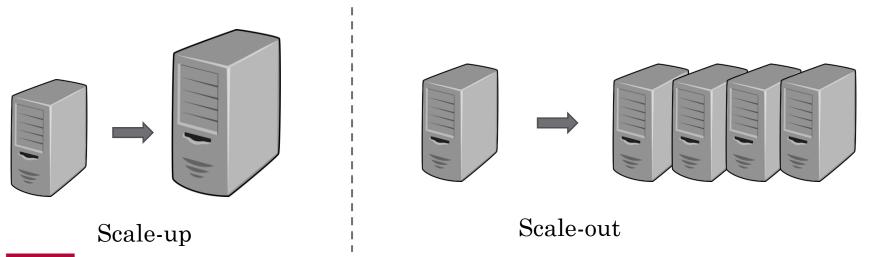


Hands-on 2

Questions?

MapReduce

- What Happened in ~2004
 - Google wanted to process web data a whole lot of web data
 - Also, do it in a scale-out fashion over commodity hardware
 - With fault-tolerance too
 - They developed MapReduce
 - MapReduce: simplified data processing on large clusters (http://dl.acm.org/citation.cfm?id=1251264)



MAPREDUCE: SIMPLIFIED DATA PROCESSING ON LARGE CLUSTERS

by Jeffrey Dean and Sanjay Ghemawa

apReduce is a programming model and an associated implementation for processing and generating large datasets that is amenable to a broad variety of real-world tasks. Users specify the computation in terms of a map and a reduce function, and the underlying runtime system automatically parallelizes the computation across large-scale clusters of machines, handles machine failures, and schedules inter-machine communication to make efficient use of the network and disks. Programmers find the system easy to use: more than ten thousand distinct MapReduce programs have been implemented internally at Google over the past four years, and an average of one hundred thousand MapReduce jobs are executed on Google's clusters every day, processing a total of more than twenty petabytes of data per day.

at Google implemented hundreds of special-purpose computations that large-scale computations, combined with an implementation of this process large amounts of raw data, such as crawled documents, Web interface that achieves high performance on large clusters of cominverted indices, various representations of the graph structure of Web computations across multiple cores of the same machine. locuments, summaries of the number of pages crawled per host, and the set of most frequent queries in a given day. Most such computa-tions are conceptually straightforward. However, the input data is usu-interface tailored towards our cluster-based computing environment.

As a reaction to this complexity, we designed a new abstraction that — lated and future work allows us to express the simple computations we were trying to perform but hides the messy details of parallelization, fault tolerance, data distribution and load balancing in a library. Our abstraction is inspired by the may and reduce primitives present in Lisp and many other functional lan- set of our put key/value pairs. The user of the MapReduce library guages. We realized that most of our computations involved applying a expresses the computation as two functions: map and reduce. p operation to each logical record in our input in order to compute a set of intermediate key/value pairs, and then applying a reduce operation to all the values that shared the same key in order to combine the derived all intermediate values associated with the same interm data appropriately. Our use of a functional model with user-specified map and passes them to the reduce function. and reduce operations allows us to parallelize large computations easily secution as the primary mechanism for fault tolerance.

ng on a large vartery of large-scale distributed systems at Google's Moun

n the distributed computing infrastructure used by most the company!

The major contributions of this work are a simple and powerful Prior to our development of MapReduce, the authors and many others interface that enables automatic parallelization and distribution of request logs, etc., to compute various kinds of derived data, such as modity PCs. The programming model can also be used to parallelize

Section 2 describes the basic programming model and gives several ally large and the computations have to be distributed across hundreds Section 4 describes several refinements of the programming model that or thousands of machines in order to finish in a reasonable amount of we have found useful. Section 5 has performance measurements of our time. The issues of how to parallelize the computation, distribute the implementation for a variety of tasks. In Section 6, we explore the use of data, and handle failures conspire to obscure the original simple com- MapReduce within Google including our experiences in using it as the banutation with large amounts of complex code to deal with these issues sis for a rewrite of our production indexing system. Section 7 discusses re-

The computation takes a set of tropus key/value pairs, and produces a

Map, written by the user, takes an input pair and produces a set of tniermediate key/value pairs. The MapReduce library groups together

The reduce function, also written by the user, accepts an interme diate key I and a set of values for that key. It merges these values together to form a possibly smaller set of values. Typically just zero or values are supplied to the user's reduce function via an iterator. This allows us to handle lists of values that are too large to fit in memory.

Consider the problem of counting the number of occurrences of each word in a large collection of documents. The user would write code stmtlar to the following pseudocode.



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What's MapReduce

• The Concept Isn't New

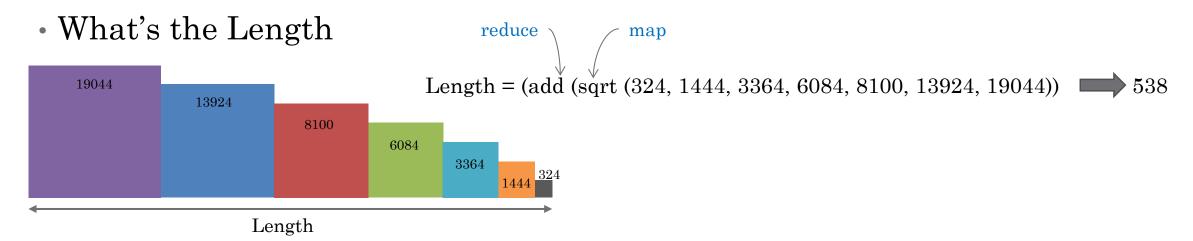
- A list of values mapped into another list of values, which gets reduced into a single value
 - Apply a function -map() to individual data items
 - Collect results with a reduction function *reduce()*
- Dates back to Lambda calculus

Google's Implementation

- A *list of <key, value>* pairs mapped into another *list of <key, value>* pairs, which gets grouped by the key and reduced into a *list of values*
- Distributed and horizontally scalable
- Fault tolerant
- Easy to program



A Few Examples



Counting Words

```
"Mary had a little lamb,
His fleece was white as snow,
And everywhere that Mary went,
The lamb was sure to go"
```



{(Mary, 2), (had, 1), (a, 1), (little, 1), (lamb, 2), (His, 1), (fleece, 1), (was, 2), (white, 1), (as, 1), (snow, 1), (And, 1), (everywhere, 1), (that, 1), (went, 1), (The, 1), (sure, 1), (to, 1), (go, 1) }

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Why Is It Easy?

- Think in Map and Reduce
 - Simplified abstraction somewhat resembles Legos with just two type of blocks



- Hides Intricacies of Parallel Programming
 - · Communication, data distribution, fault-tolerance, etc.
- Many Applications Fall into MapReduce Model and Its Extensions
 - Distributed Grep
 - Calculating Statistics
 - Page Rank
 - K-Means
 - Multidimensional Scaling
 - See
 - http://web.cs.wpi.edu/~cs4513/d08/OtherStuff/MapReduce-TeamC.ppt
 - Many other applications, if you Google ©



Apache Hadoop (It's Free!!)

- The Open Source MapReduce Implementation
- Scalable
 - Almost linear scaling with cores and disks
 - Can handle thousands of nodes across multiple racks
 - · Can handle large loads without crashing!
- Reliable
 - · All the data blocks are replicated
 - Data recoverability
 - · Nodes can join or leave cluster any time
- Fault Tolerance
 - Re-execution of failed tasks
 - Retry data transmissions
 - · Can tolerate Hardware failures
- Simple
 - Simple storage and programming model

Hadoop MapReduce v2 Cookbook Second Edition

https://www.amazon.com/Hadoop-MapReduce-v2-Cookbook-Secondebook/dp/B00U1D9WT6?ie=UTF8&ref_=asap_bc



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Apache Hadoop

- Distributed Storage (HDFS)
 - Not LUSTRE or a SAN...
 - Can't do random reads/writes
 - But cheap, reliable and scalable
 - Parallel storage
 - Very large aggregate bandwidth
- Processing
 - Not MPI
 - · Can't do inter process communication or collective operations
 - But highly scalable, easy to program and runs on commodity hardware
 - Fault tolerant, dynamic scheduling
- Querying and Table storage
 - Not Netezza or Teradata
 - · Do not support full SQL, full indexing and has high latency
 - But highly scalable, cheap and fast for very large data sets



Why Hadoop?

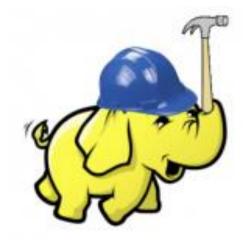
- Not the best in any of them (may be in cheap storage), but good at all of those. Taken altogether makes it very attractive.
 - Not the fastest, but scalable
 - Easy to code
 - Cheap to scale
 - Runs on commodity hardware
 - Can handle very very large data and computations
 - Battle tested in thousands of clusters
- Large open source echo system
 - Many projects add functionalities on top of HDFS and Hadoop
 - Large community of developers and users

Hadoop Usage

- · Yahoo!, Facebook, Netflix, Amazon, Twitter, LinkedIN, Link Analytics
- Support by Cloudera, Hortonworks, Intel, IBM, MapR, etc.
- Processing petabytes of data daily
- Yahoo Hadoop cluster is 40,000 nodes
- Facebook is storing more than 100PB in their Hadoop cluster
- Hosted Hadoop as a service by Amazon EMR, Microsoft Azure, Google...

Hadoop is Not!

- Hadoop is a very big Hammer!
 - Not for small data / jobs
 - Not to store ton of small files
 - Real-time or interactive results
 - For hard to parallelize problems



Apache Big Data Stack

- More Than Hadoop
- Over 350 Open Source Software Packages
 - As of January 2016
- Popular Projects
 - Apache Hadoop
 - · Apache Storm
 - Apache Spark
 - Apache Flink

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Kaleidoscope of (Apache) Big Data Stack (ABDS) and HPC Technologies	
Functions	17) Workflow-Orchestration: ODE, ActiveBPEL, Airavata, Pegasus, Kepler, Swift, Taverna, Triana, Trident, BioKepler, Galaxy, IPython, Dryad, Naiad, Oozie, Tez, Google FlumeJava, Crunch, Cascading, Scalding, e-Science Central, Azure Data Factory, Google Cloud Dataflow, NiFi (NSA), Jitterbit, Talend, Pentaho, Apatar, Docker Compose, KeystoneML
Data Protocols: Avro, Thrift,	16) Application and Analytics: Mahout, MLlib, MLbase, DataFu, R, pbdR, Bioconductor, ImageJ, OpenCV, Scalapack, PetSc, PLASMA MAGMA, Azure Machine Learning, Google Prediction API & Translation API, mlpy, scikit-learn, PyBrain, CompLearn, DAAL(Intel), Caffe, Torch, Theano, DL4j, H2O, IBM Watson, Oracle PGX, GraphLab, GraphX, IBM System G, GraphBuilder(Intel), TinkerPop, Parasol, Dream:Lab, Google Fusion Tables, CINET, NWB, Elasticsearch, Kibana, Logstash, Graylog, Splunk, Tableau, D3.js, three.js, Potree, DC.js, TensorFlow, CNTK
Coordination: Google Chubby,	15B) Application Hosting Frameworks: Google App Engine, AppScale, Red Hat OpenShift, Heroku, Aerobatic, AWS Elastic Beanstalk, Azure, Cloud Foundry, Pivotal, IBM BlueMix, Ninefold, Jelastic, Stackato, appfog, CloudBees, Engine Yard, CloudControl, dotCloud, Dokku, OSGi, HUBzero, OODT, Agave, Atmosphere 15A) High level Programming: Kite, Hive, HCatalog, Tajo, Shark, Phoenix, Impala, MRQL, SAP HANA, HadoopDB, PolyBase, Pivotal HD/Hawq, Presto, Google Dremel, Google BigQuery, Amazon Redshift, Drill, Kyoto Cabinet, Pig, Sawzall, Google Cloud DataFlow, Summingbird
3) Security & Privacy: InCommon, Eduroam,	14B) Streams: Storm 34, Samza, Granules, Neptune, Google MillWheel, Amazon Kinesis, LinkedIn, Twitter Heron, Databus, Facebook Puma/Ptail/Scribe/ODS, Azure Stream Analytics, Floe, Spark Streaming, Flink Streaming, DataTurbine 14A) Basic Programming model and runtime, SPMD, MapReduce Hadoop Spark, Twister, MR-MPI, Stratosphere (Apache Flink), Reef, Disco, Hama, Giraph, Pregel, Pegasus, Ligra, GraphChi, Galois, Medusa-GPU, MapGraph, Totem
Keystone, LDAP, Sentry, Sqrrl,	13) Inter process communication Collectives, point-to-point, publish-subscribe: MPI, HPX-5, Argo BEAST HPX-5 BEAST PULSAR, Harp, Netty, ZeroMQ, ActiveMQ, RabbitMQ, NaradaBrokering, QPid, Kafka, Kestrel, JMS, AMQP, Stomp, MQTT, Marionette Collective, Public Cloud: Amazon SNS, Lambda, Google Pub Sub, Azure Queues, Event Hubs
OAuth	 12) In-memory databases/caches: Gora (general object from NoSQL), Memcached, Redis, LMDB (key value), Hazelcast, Ehcache, Infinispan, VoltDB, H-Store 12) Object-relational mapping: Hibernate, OpenJPA, EclipseLink, DataNucleus, ODBC/JDBC 12) Extraction Tools: UIMA, Tika
	11C) SQL(NewSQL): Oracle, DB2, SQL Server, SQLite, MySQL, PostgreSQL, CUBRID, Galera Cluster, SciDB, Rasdaman, Apache Derby, Pivotal Greenplum, Google Cloud SQL, Azure SQL, Amazon RDS, Google F1, IBM dashDB, N1QL, BlinkDB, Spark SQL
	11B) NoSQL: Lucene, Solr, Solandra, Voldemort, Riak, ZHT, Berkeley DB, Kyoto/Tokyo Cabinet, Tycoon, Tyrant, MongoDB, Espresso, CouchDB, Couchbase, IBM Cloudant, Pivotal Gemfire, HBase, Google Bigtable, LevelDB, Megastore and Spanner, Accumulo, Cassandra, RYA, Sqrrl, Neo4J, graphdb, Yarcdata, AllegroGraph, Blazegraph, Facebook Tao, Titan:db, Jena, Sesame Public Cloud: Azure Table, Amazon Dynamo, Google DataStore
	11A) File management: iRODS, NetCDF, CDF, HDF, OPeNDAP, FITS, RCFile, ORC, Parquet 10) Data Transport: BitTorrent, HTTP, FTP, SSH, Globus Online (GridFTP), Flume, Sqoop, Pivotal GPLOAD/GPFDIST
Over 350 Software Packages	9) Cluster Resource Management: Mesos, Yarn, Helix, Llama, Google Omega, Facebook Corona, Celery, HTCondor, SGE, OpenPBS, Moab, Slurm, Torque, Globus Tools, Pilot Jobs
	8) File systems: HDFS, Swift, Haystack, f4, Cinder, Ceph, FUSE, Gluster, Lustre, GPFS, GFFS Public Cloud: Amazon S3, Azure Blob, Google Cloud Storage 7) Interoperability: Libvirt, Libcloud, JClouds, TOSCA, OCCI, CDMI, Whirr, Saga, Genesis
	6) DevOps: Docker (Machine, Swarm), Puppet, Chef, Ansible, SaltStack, Boto, Cobbler, Xcat, Razor, CloudMesh, Juju, Foreman, OpenStack Heat, Sahara, Rocks, Cisco Intelligent Automation for Cloud, Ubuntu MaaS, Facebook Tupperware, AWS OpsWorks, OpenStack Ironic, Google Kubernetes, Buildstep, Gitreceive, OpenTOSCA, Winery, CloudML, Blueprints, Terraform, DevOpSlang, Any2Api
	5) IaaS Management from HPC to hypervisors: Xen, KVM, QEMU, Hyper-V, VirtualBox, OpenVZ, LXC, Linux-Vserver, OpenStack, OpenNebula, Eucalyptus, Nimbus, CloudStack, CoreOS, rkt, VMware ESXi, vSphere and vCloud, Amazon, Azure, Google and other public Clouds



Networking: Google Cloud DNS, Amazon Route 53

Tools of the Trade

- Programming Languages
 - Java is the dominant one in Big Data space
 - Python, C/C++ to follow
- Integrated Development Environments
 - Eclipse https://eclipse.org/downloads/
 - IntelliJIDEA https://www.jetbrains.com/idea/ (personal preference)
 - Good news! The commercial version is free for students and educators
 - Both these are pretty powerful comparing one vs the other is like Mercedes vs BMW
- Other Tools
 - Version controlling systems Git/GitHub is currently preferred by many, so is SVN
 - Build tools Apache Maven, Apache ANT, and
 - Testing (JUnit), Continuous Integration (CI) Travis

When I am Stuck

Google

• This has become an art in its own right

Stack Overflow

• Works best if you know what you are trying to solve like a specific exception

• Quora

• Trending place to ask general questions – "I am 20 I need to be a millionaire by 25. How to?"

Learning

- Linux Software Carpentry http://software-carpentry.org/ is good
- Java Tutorialspoint http://www.tutorialspoint.com/java/
- Online courses so many available look in Coursera, Lynda, etc. YouTube too!

Hands-on 3

Getting Started with Apache Hadoop

Refer to

http://admicloud.github.io/www/SetUpHadoop.html

Programming with MapReduce

Word Count

- Count the occurrence of words in a set of text files
- · The de-factor "Hello, World" application of cloud computing

K-Means

- Given N points, group them into K clusters
- A commonly used machine learning algorithm

Page Rank

- Given an adjacency matrix representing Web pages and their target pages, compute a rank for each page
- The rank indicates the probability of someone visiting a given page, i.e. higher the rank the higher the chances it being visited by a user
- The foundation of Google's search algorithm

Word Count

Input

• "Mary had a little lamb,
His fleece was white as snow,
And everywhere that Mary went,
The lamb was sure to go"

Output

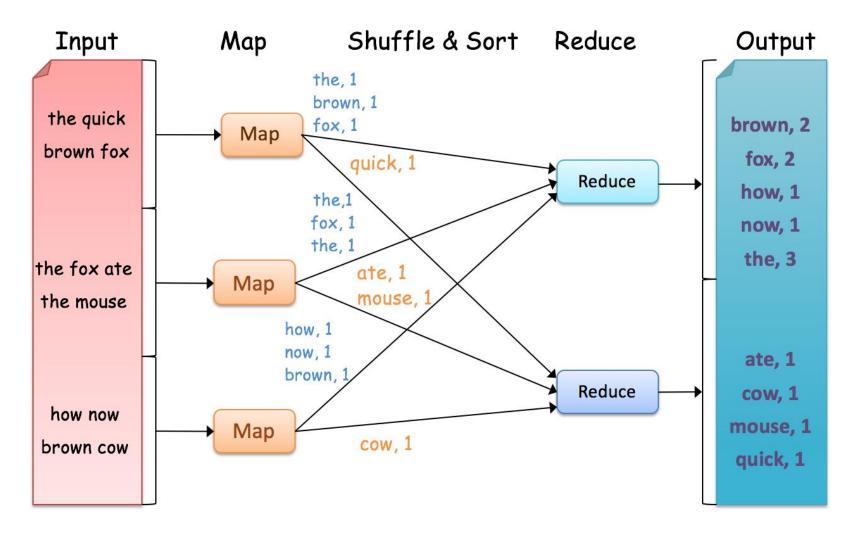
• {(Mary, 2), (had, 1), (a, 1), (little, 1), (lamb, 2), (His, 1), (fleece, 1), (was, 2), (white, 1), (as, 1), (snow, 1), (And, 1), (everywhere, 1), (that, 1), (went, 1), (The, 1), (sure, 1), (to, 1), (go, 1) }

Serial Implementation

- Create a hash table (HT)
- While more lines to read
 - Read line
 - Split into words
 - For each word
 - If HT has word increment its count
 - Else add word to HT with count=1
- Output HT

```
BufferedReader br = new BufferedReader(new FileReader(wordFile));
Hashtable<String, Integer> wordToCountTable = new Hashtable<>();
Pattern pat = Pattern.compile(" ");
String line;
String [] splits;
while ((line = br.readLine()) != null) {
    splits = pat.split(line);
   for (String s:splits) {
        if (wordToCountTable.containsKey(s)) {
            wordToCountTable.put(s, wordToCountTable.get(s)+1);
            continue;
        wordToCountTable.put(s, 1);
Enumeration<String> words = wordToCountTable.keys();
String key;
while (words.hasMoreElements()) {
    key = words.nextElement();
    System.out.println(key + " " + wordToCountTable.get(key));
```

Hadoop (MapReduce) Implementation



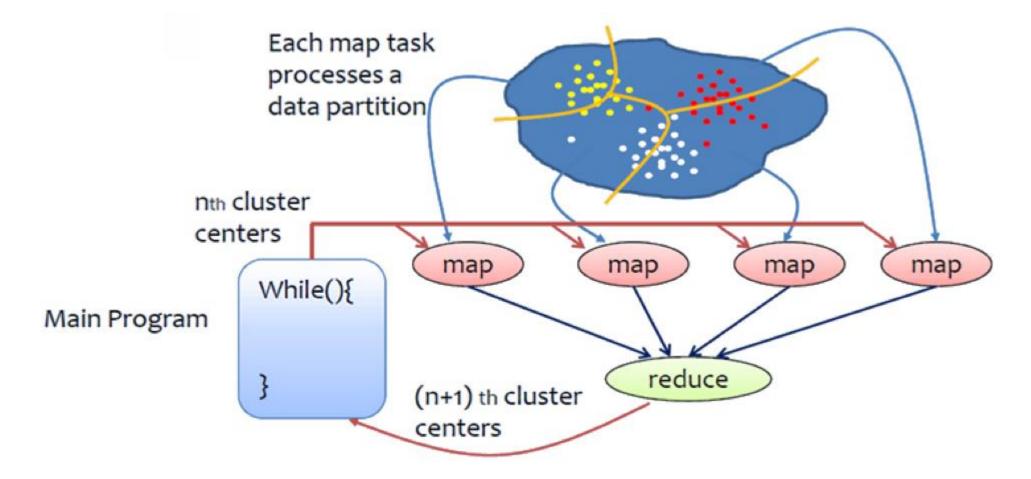
Hands-on 4

Word Count with Apache Hadoop

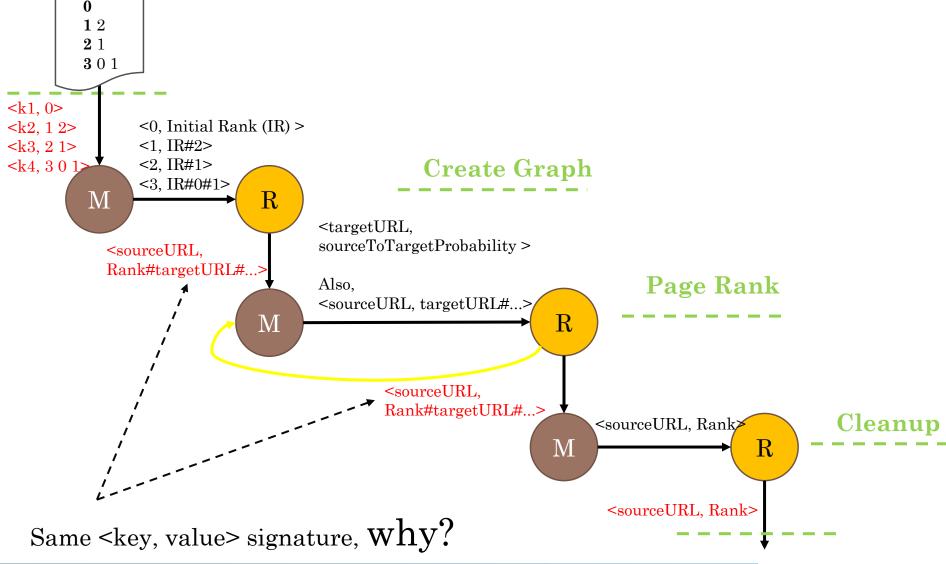
Refer to

http://admicloud.github.io/www/wordcount.html

K-Means



Page Rank





Output total rank sum

Hands-on 5

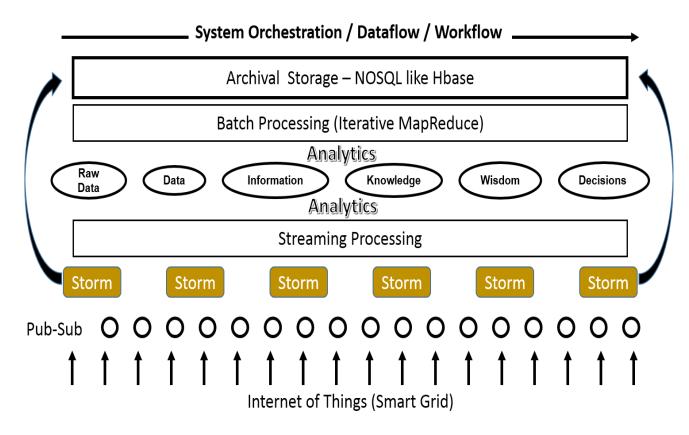
K-Means with Apache Hadoop

Refer to

http://admicloud.github.io/www/kmeans.html

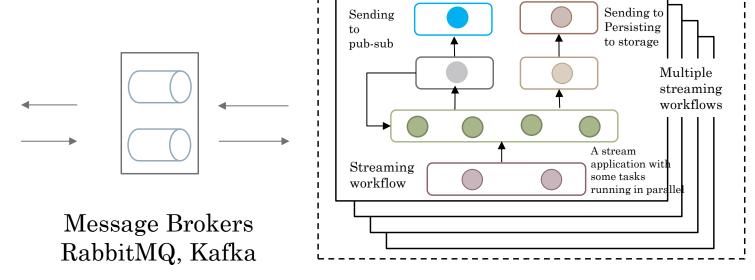
Stream Processing

• Data, Information, Knowledge, Wisdom



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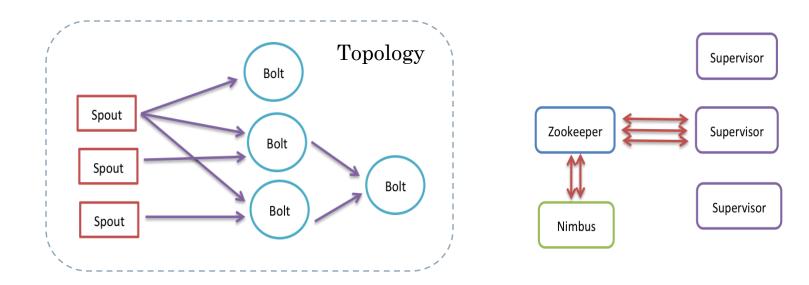
Data pipeline



Streaming Workflows Apache Storm

Apache Storm

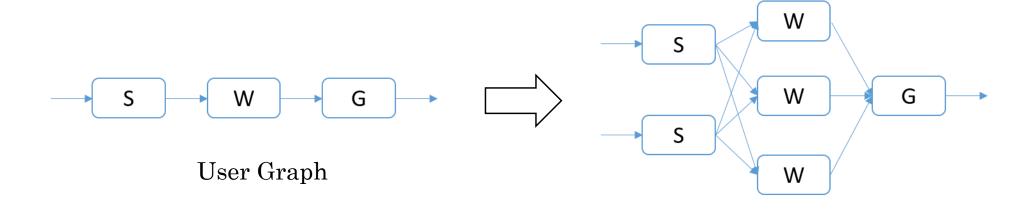
- Storm is the Hadoop for distributed stream processing?
- Storm is Stream Partitioning + Fault Tolerance + Parallel Execution



Programming Model Java, Ruby, Python, Javascript, Perl, and PHP

Architecture

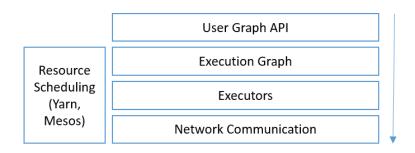
Storm Application

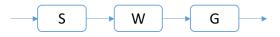


Execution Graph

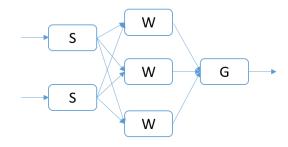
User graph is converted to an execution graph

DSPF Architecture





User graph

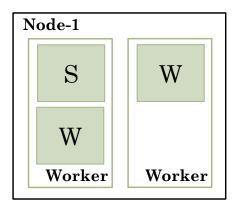


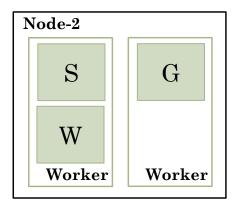
Execution graph

Apache Storm

- Data Mobility
 - Pull based, No blocking operations, ZeroMQ and Netty Based communication
- Fault Tolerance
 - · Rollback Recovery with Upstream backup
 - The messages are saved in out queue of Spout until acknowledged
- Stream Partition
 - · User defined, based on the grouping
- Storm Query Model
 - Trident, A Java library providing high level abstraction

Execution Graph Distribution in the Cluster

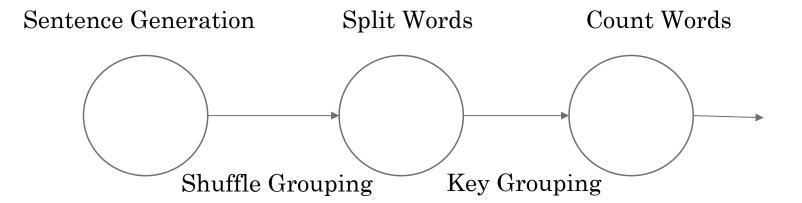




Two node cluster each running two workers. The tasks of the Topology is assigned to the workers

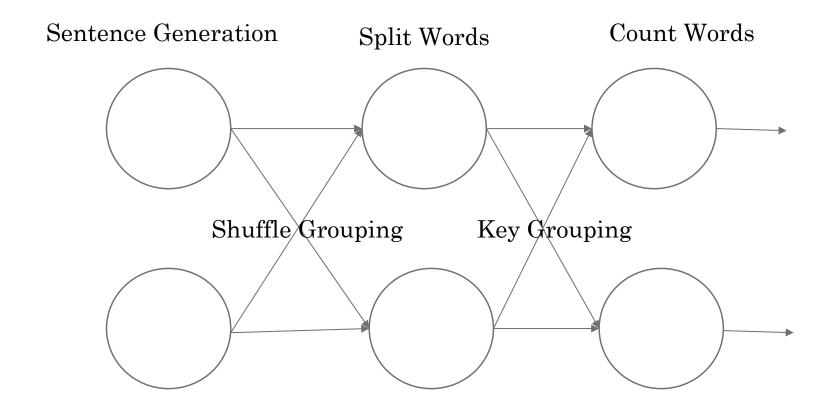
Word Count

User Topology



Word Count

Execution Graph



6/10/2016

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Hands-on 6

Streaming Word Count with Apache Storm Refer to

http://admicloud.github.io/www/storm.html

Acknowledgement

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- Thank you,



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Supun Kamburugamuve

Zou, Yiming



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Assignment: Distributed Grep with Hadoop

- Just Like Word Count
 - Except now match a given pattern
 - Output 1 only if the current word matches the pattern