# Cloud Computing and Distributed Systems Introduction

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# **Cloud computing: The disruption**

"The worldwide public cloud services market is projected to reach a total of \$214.3 billion in 2019. Cloud Services Industry to grow exponentially to \$331 billion by 2022." – Gartner

"In 2018, AWS delivered most of Amazon's operating income" - Amazon

"80% of organizations will migrate toward the cloud by 2025." - Gartner

"50% of all data will be held in the cloud by 2020. Cloud data centers will process 94% of workloads in 2021." – IDC & Cisco

"Global data centers used roughly 416 terawatts (3% of the total electricity) last year, nearly 40% more than the entire United Kingdom." - Forbes

"Big data solutions via cloud subscriptions will increase about 7.5 times faster than on-premise options." - Forrester

"Al without the cloud is tough" – Information Age

### **This Course**

- What you will learn (roadmap)
  - Economic foundations
    - Cloudonomics & Service models
  - Infrastructure foundations
    - Virtualization, containerization, serverless functions
  - Systems foundations
    - In-depth description of Hadoop & ecosystem
    - Architecture of Apache Spark
  - Programming foundations
    - Map—reduce and functional programming
    - Relational Algebra and High-Level Languages
  - Algorithmic foundations
    - Cluster scheduling with YARN, Mesos, Omega
    - CAP theorem, SQL and NoSQL
    - Coordination & Apache Zookeeper
    - Decentralization & blockchain (if time permits)

### Who is this course for?

- Cloud system and application engineers
- Data scientists
- Requirements
  - Good knowledge of Python
  - Familiarity with operating systems concepts, and Linux
  - Good knowledge of git
  - Ideally, familiarity with distributed algorithms

### How to make the most of this course?

### Attend classes and the labs

- Many discussions in live classes, that are not on the slides
- Laboratories can be hard for people with little CS background

### Resources

Lecture notes: <a href="https://raja-appuswamy.github.io/DISC-CLOUD-COURSE/">https://raja-appuswamy.github.io/DISC-CLOUD-COURSE/</a>

# **Grading**

### Final exam

- 50% of the grade
- Generally divided in two parts
  - A series of questions
  - One or more problems to solve

### Laboratory sessions

- Mainly Notebooks, some special labs
- Question answering
- Heuristic to map credits to grade

# **Tentative timeline**

| Date          | Tentative lecture topic                            |
|---------------|--|
| Oct 3         | Introduction to cloud computing                    |
| Oct 10        | Economic + infrastructure fundamentals             |
| Oct 24        | Programming models + runtimes (Map reduce, Hadoop) |
| Nov 7         | Programming models + runtimes (Spark)              |
| <u>Nov 14</u> | <u>LAB 1</u>                                       |
| Nov 21        | Cluster scheduling and resource management         |
| Nov 28        | Consistency in distributed systems                 |
| <u>Dec 5</u>  | <u>LAB 2</u>                                       |
| Dec 12        | Consistency in distributed systems                 |
| <u>Dec 19</u> | <u>LAB 3</u>                                       |
| <u>Jan 9</u>  | <u>LAB 4</u>                                       |
| Jan 16        | Coordination and consensus in distributed systems  |
| Jan 23        | Coordination and consensus in distributed systems  |

# Introduction to the Cloud Computing

### We live in a world of data

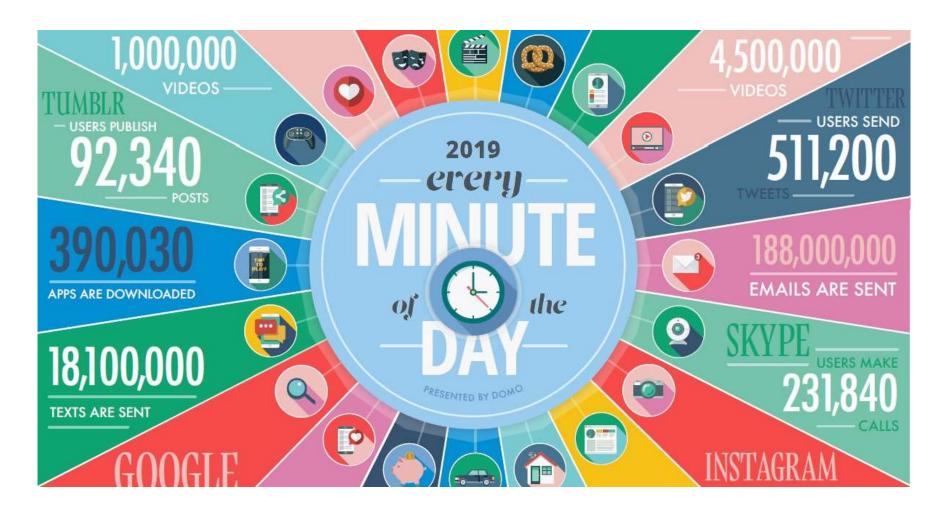


Figure: Data deluge.

# **Big Data**

- Big data is defined as large pools of data that can be captured, communicated, aggregated, stored, and analyzed.
- Data continues to grow

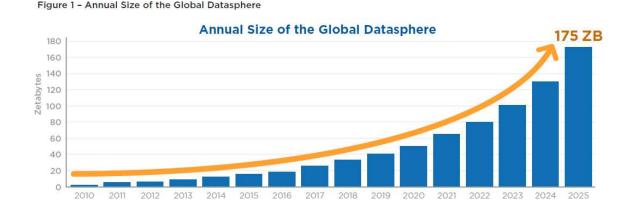


Figure: Global datasphere

- Applications are becoming data intensive
  - More data leads to better accuracy
  - With more data, accuracy of different algorithms converges

# Let's look at your data.







Mobile Devices



...and even appliances

You want to access, shared, process your data from all your devices, anytime, anywhere.

### How will we manage all this data?

### Manage it ourselves?

- How do we store it?
- How do we share it?
- How can we enable access to it from any place?
- How do we process all of it?
- How do we secure it?
- •

### What if it is managed by someone else?

- Someone provides a management "service"
- You pay a subscription for this "service"

# **Cloud computing: The prophecy**

- In 1965, MIT's Fernando Corbató and the other designers of the Multics operating system envisioned a computer facility operating "like a power company or water company".
- Plug your thin client into the computing Utility and Play your favorite Intensive Compute & Communicate Application

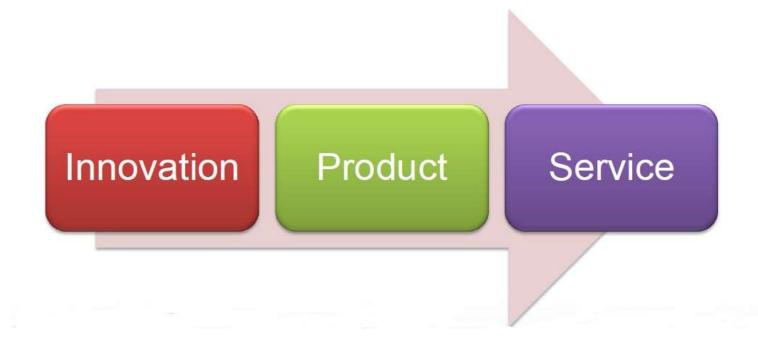
# **Utility–Product–Service lifecycle: Water**



# **Utility–Product–Service lifecycle: Electricity**



# **Generalizing the lifecycle**



# **Cloud Computing**

### Transformation of IT from a product to a service



# How did IT transformation happen?

### Requirements to transform IT

- Connectivity to move data
- Interactivity for seamless interface
- Reliability against failures
- Acceptable performance
- Ease of programmability for developing new services
- Manageability for Big Data
- Pay-as-you-go to avoid capital investment
- Scalability and elasticity for changing needs

# **Supporting technologies**

- Cloud computing is a combination of technologies
  - Connectivity to move data => Networked systems
  - Interactivity for seamless interface => Web 2.0 and HCI
  - Reliability against failures => Dependable systems
  - Acceptable performance => Parallel and distributed systems
  - Ease of programmability for developing new services => Programming languages
  - Manageability for Big Data => Storage systems
  - Pay-as-you-go to avoid capital investment => Utility computing & economics
  - Scalability and elasticity for changing needs => Virtualization

### **Formal definition**



Cloud Computing is the delivery of computing as a service rather than a product,

whereby shared resources, software, and information are provided to computers and other devices,





as a metered service over a network.

# Why Cloud Computing?



#### Pay-as-You-Go economic model

- Reduce capital expenditure
- No upfront cost
- Reduced Time to Market



# Simplified IT management

- All you need is access to the internet.
- It's the providers responsibility to manage the details.



# Scale quickly and effortlessly

- Resources can be rented and released as required
- Software Controlled
- Instant scalablility



### Flexible options

- Configure software packages, instance types operating systems.
- Any software platform
- Access from any machine connected to the Internet



#### Resource Utilization is improved

- Reduce Idle resources by sharing and conolidation
- Better utilization of CPU / Storage and Bandwidth.



Carbon Footprint decreased

 Sharing of resources means less servers, less power and less emissions.

### Applications enabled by cloud computing

### High-growth applications

- When you startup gains traction, can you keep up?
- Friendster(2001): Could not keep up with user growth
- Facebook (2006): \$Billion company today
- Airbnb, Uber, Expedia, ...

### Aperiodic applications

- How do you deal with sudden load peaks?
  - Amazon Prime Day: Aurora cloud database processed 148 billion transactions, stored 609 terabytes of data, and transferred 306 terabytes of data
  - Flipkart: Website crashed on their "Big Billion Day" sale
- If you design for peak, how do you deal with low loads?
  - Amazon normal day: 1.3 billion transactions

# **Applications enabled by cloud computing(2)**

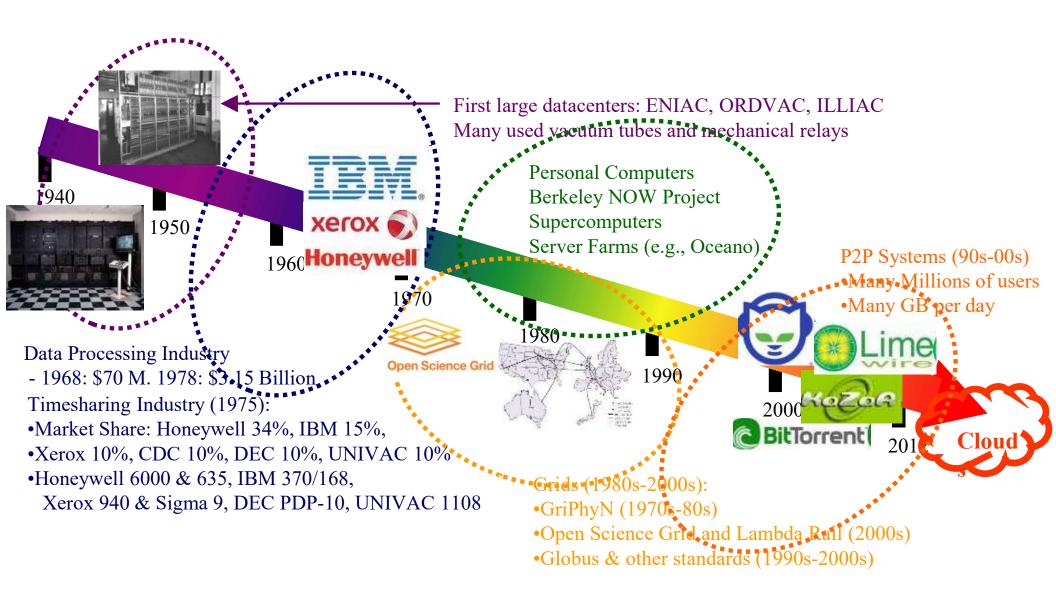
### On-off applications

- Scientific simulation using 1000s of computers
  - DNA Nexus and Baylor college of medicine analyzed DNA of more than 14,000 individuals
  - 2.4 million core-hours of computational time, 440 TB of results, 1PB of storage
- Why not rent computing time to run such one-off experiments?

# Periodic applications

- Stock market analysis
  - Mine market data during day
  - Analyze data during night
  - Different computational requirements at different times
- Dynamic, flexible infrastructure can reduce costs, improve performance

# "A Cloudy History of Time"



Cloud computing: Full circle back to time sharing

# **New features of Cloud Computing**

- Massive scale.
- On-demand access: Pay-as-you-go, no upfront commitment.
  - And anyone can access it
- Data-intensive Nature: What was MBs has now become TBs, PBs and XBs.
  - Daily logs, forensics, Web data, etc.
- New Cloud Programming Paradigms: MapReduce/Hadoop, Spark, NoSQL, NewSQL,... and many others.
  - High in accessibility and ease of programmability
  - Lots of open-source

# Cloud Infrastructure

### What is a server?

- Servers are computers that provide "services" to "clients"
  - Typically designed for reliability and to service a large number of requests
  - Dual-socket servers are the fundamental building block of cloud infrastructure
- Organizations typically require many physical servers to provide various services
  - Web server, database server, mail server, ...
- Server hardware is becoming more compact
  - conserving floor space
  - improving manageability
  - power and cooling

### What is a rack?

- Servers are grouped, placed, and organized in racks
- Equipment are designed in a modular fashion to fit into rack units (1RU = 4.45cm)
- A single rack (6 ft or 180cms) can hold up to 42 1U servers



Figure: Global datasphere

### What is a data center?

- Facility used to house a large number of computer systems and associated components
  - Air conditioning
  - Power supply
  - Hazard protection
  - Security and monitoring systems
  - Networking and connectivity
- Let's take a look at a special Microsoft datacenter (<a href="https://www.youtube.com/watch?v=L2oJw1a qEM">https://www.youtube.com/watch?v=L2oJw1a qEM</a>)

# Trivia: World's largest datacenter

- (2018) China Telecom. 10.7 Million sq. ft.
- (2017) "The Citadel" Nevada. 7.2 Million sq. ft.
- (2015) In Chicago!
  - •350 East Cermak, Chicago, 1.1 MILLION sq. ft.
  - Shared by many different "carriers"
  - Critical to Chicago Mercantile Exchange

### See:

https://www.gigabitmagazine.com/top10/top-10-biggest-data-centres-world

https://www.racksolutions.com/news/data-center-news/top-10-largest-data-centers-world/

### Problems with privately owned data centers

- Expensive to setup (High capital expenses or CAPEX)
  - Real estate, server and peripherals, ...
- Expensive to operate (High operational expenses or OPEX)
  - Energy costs (Good data centers have efficiency of 1.7, 0.7
     Watts lost for each 1W delivered to the servers)
  - Administration costs
- Difficult for applications to grow/shrink
  - How do we map applications to servers?
  - What if we over/under provision?
- Low utilization (30% server usage considered good)
  - Throw money at the performance problem (peak provisioning)
  - Uneven application fit: each server has CPU, memory, and disk: most applications exhaust one resource, stranding the others
  - Uncertainty in demand: Demand for a new service can spike quickly

### What if

- Turn the servers into a single large resource pool and let services dynamically expand and contract their footprint as needed?
- Two main requirements:
  - Means for rapidly and dynamically satisfying application fluctuating resource needs
    - Provided by virtualization
  - Means for servers to quickly and reliably access shared and persistent data
    - Provided by programming models and distributed file/storage/database systems

### What is a cloud then?

### Single-site cloud

 A data center hardware and software that the vendors use to offer the computing resources and services

### Geographically distributed cloud

 Multiple such sites, with each site perhaps having different structure and services

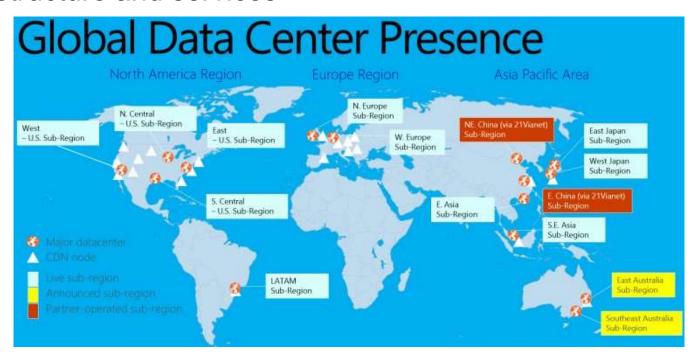


Figure: Azure: 1 million servers, 100 data centers across 90 countries.

### **Cloud Computing**



Cloud Computing is the delivery of computing as a service rather than a product,

whereby shared resources, software, and information are provided to computers and other devices,



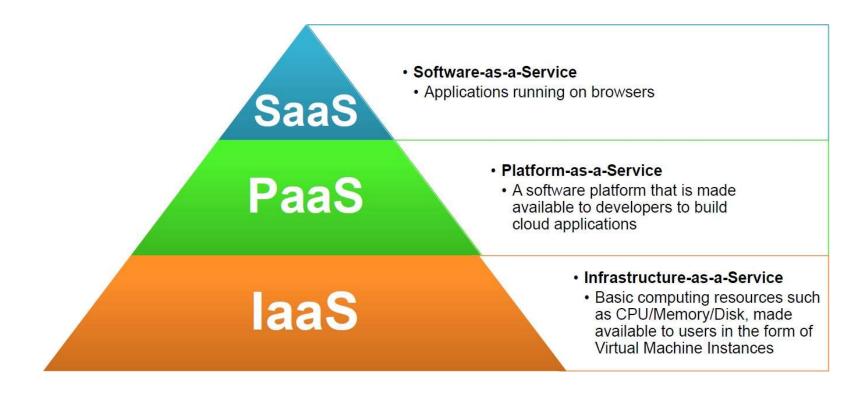


as a metered service over a network.

### IT as a service

- How do we offer IT as a service?
- Different users have different needs
  - Average end user
  - Mobile app developer
  - Enterprise systems architect
- Let us look at some service models

### **Basic cloud service models**



### SaaS

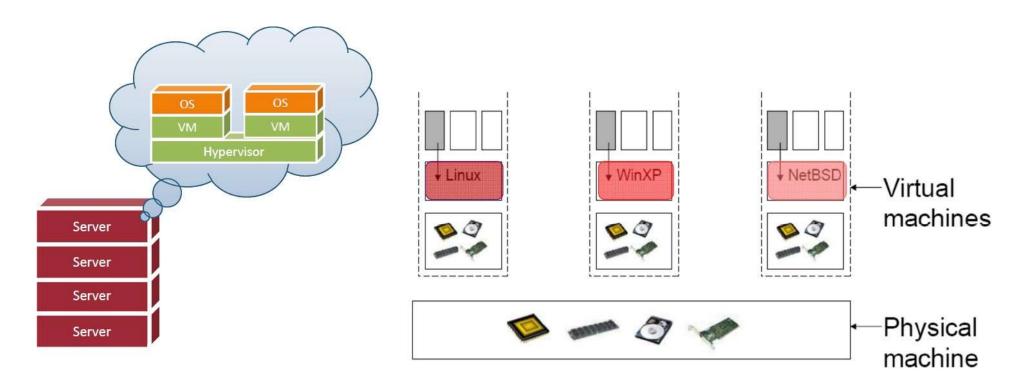
- Software is delivered as a service over the Internet, eliminating the need to install and run the application on the customer's own computer
- Simplifies maintenance and support
- You use SaaS products everyday
  - Gmail, Google docs, Youtube, ...
- Salesforce.com is a popular commercial pioneer (ERP, CRM, ...)

### **PaaS**

- The Cloud provider exposes a set of tools (a platform) and APIs which allows users to create SaaS applications
- The SaaS application runs on the provider's infrastructure
- The cloud provider manages the underlying hardware and requirements
- Examples: Google App Engine, Windows Azure Web App service

### laaS

- The cloud provider leases to users Virtual Machine Instances (i.e., computer infrastructure) using the virtualization technology
- The user has access to a standard Operating System environment and can install and configure all the layers above it
- Ex: AWS EC2, Rackspace, Google Compute Engine



### Other services models

- Hardware-as-a-service (HaaS)
  - You get access to barebones hardware machines, do whatever you want with them, Ex: Your own cluster
  - Not always a good idea because of security risks
- X-as-a-service, where X can be
  - Backend (BaaS), Desktop (DaaS), ...

### The Cloud Stack

### Applications

Cloud applications can range from Web applications to scientific computational jobs

#### Data

- Old SQL systems (Oracle, SQLServer)
- NoSQL systems (MongoDB, Cassandra)
- NewSQL systems (TimesTen, Impala, Hekaton)

### Runtime environment

- Runtime platforms to support cloud programming models
- Example: Hadoop, Spark



### The Cloud Stack

### Middleware

 Platforms for Resource Management,
 Monitoring, Provisioning, Identity Management and Security

# Operating systems

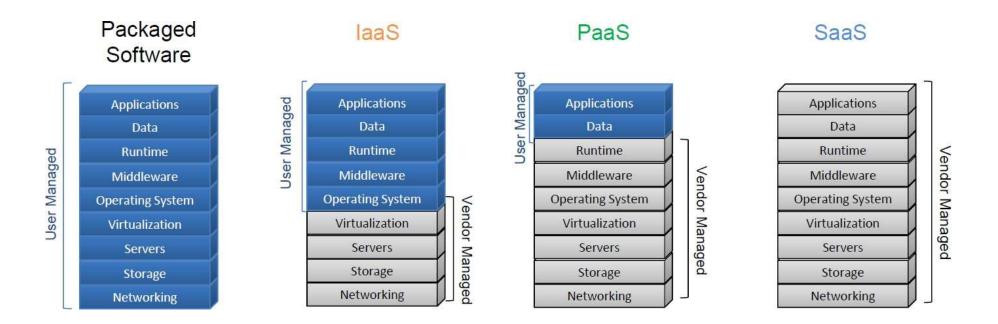
- Standard Operating Systems used in Personal Computing
- Packaged with libraries and software for quick deployment and provisioning
- E.g., Amazon Machine Images (AMI) contain
   OS as well as required software packages as a "snapshot" for instant deployment

# Virtualization (serverse, storage, networking)

- Key enabler of cloud computing
- Providers resource virtualization, multitenancy
- Ex: Amazon EC2 is based on the Xen virtualization platform, Azure based on HyperV



### Cloud service models and the cloud stack



# Types of clouds

# Public (external) cloud

- Open market for on demand computing and IT resources
- Concerns: Limited SLA, reliability, availability, security, and trust

# Private (internal) cloud

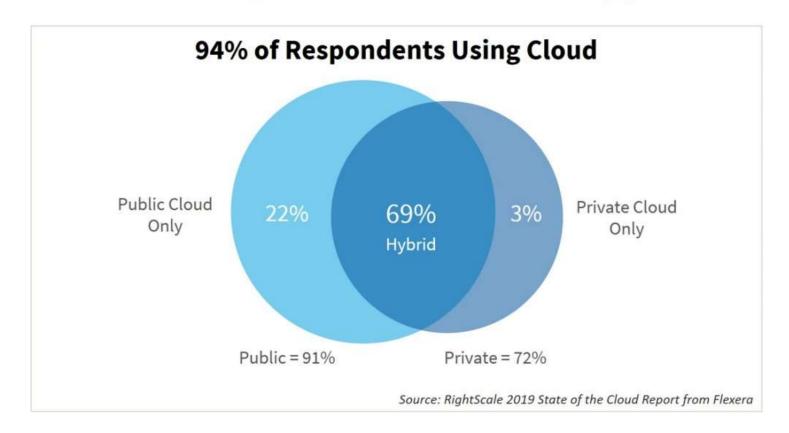
For large enterprises with the budget and large-scale IT

# Hybrid cloud

- Extend the private cloud(s) by connecting it to other public cloud vendors to make use of their available cloud services
- Use the local cloud, and when you need more resources, burst into the public cloud

# **Cloud adoption**

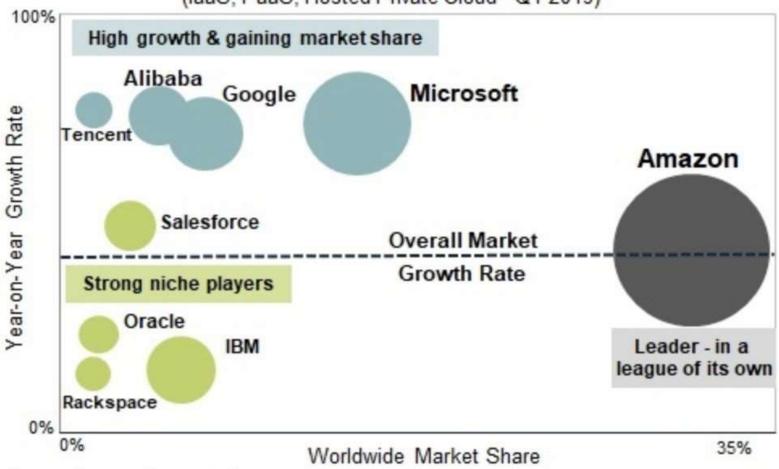
# 94% of Respondents Are Using Cloud



- All major cloud providers are extending their offering to private and hybrid markets
  - Example: Google Anthos, Microsoft AzureStack

### **Know the leaders**

# Cloud Provider Competitive Positioning (laaS, PaaS, Hosted Private Cloud - Q1 2019)



Source: Synergy Research Group

# Cloud Economics

# **Economics of cloud computing**

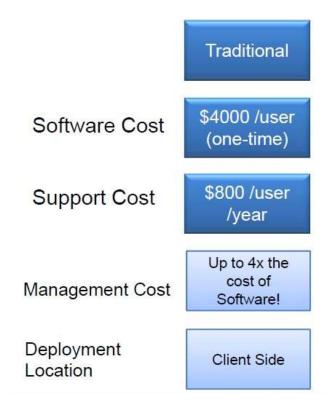
- What is the value proposition for cloud computing?
- How did Cloud Computing emerge from business / industry rather than from Academia?
- How did software service models evolve?

### **Cost of IT**

- When you are using IT there are three primary costs associated with it:
  - Software cost (Media + License cost/user)
  - Support cost (vendor support, updates, ...)
  - Management cost (Manpower, IT infrastructure, ...)

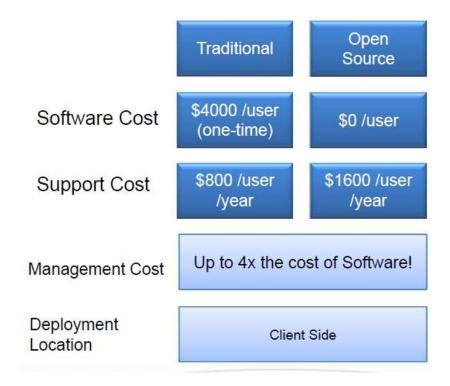
### **Traditional model**

- a.k.a Classic model
- Software provider develops software and charges a license fee per user for the client
- The provider may charge a support fee /user
- The management of the software is the clients responsibility
  - Up to 4x the cost of the actual software per year!
  - Infrastructure, Manpower, software maintenance
- Traditional Software example: Oracle, SQL Server, Outlook, ...



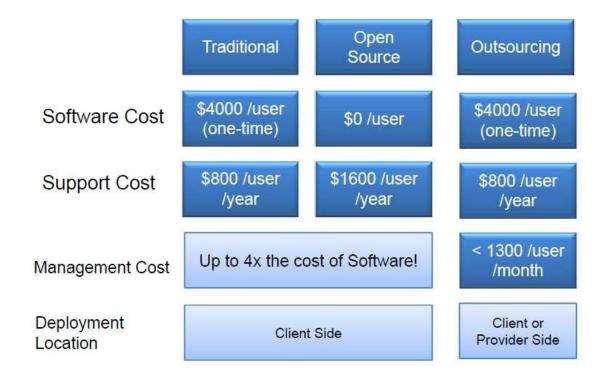
# **Open Source Model**

- a.k.a "Free" model
- Software provider packages Open Source Software and provides it at little or no cost to the client
- The provider makes money on support, charges a higher fee than traditional model
- The cost of Managing the software remains the same as Traditional Model
  - Up to 4x the cost of the actual software per year
  - Infrastructure, Manpower, software maintenance
- Traditional Software example: Oracle, SQL Server, Outlook, ...



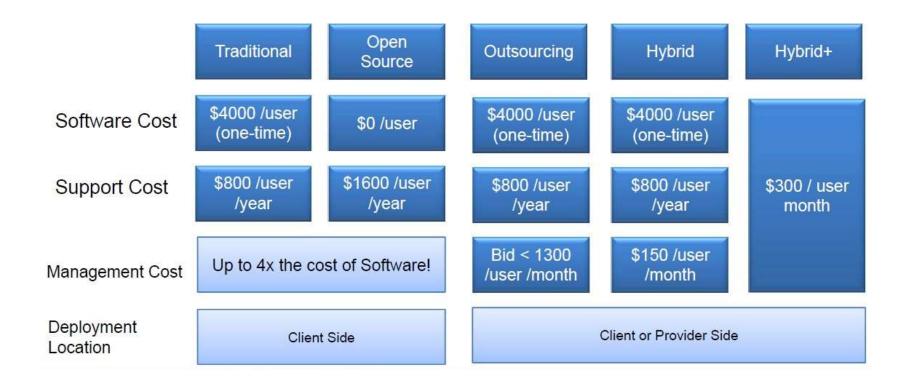
# **Outsourcing Model**

- Primary cost of Software Management is in Manpower
- Why not delegate the management of software to a country with cheaper labor costs?
- Outsource the management of software for a flat fee keep IT management costs under control



# **Hybrid and Hybrid+ models**

- Business Software Requirements do not change often.
  - ERP, Financials, CRM etc.
- Why reinvent the wheel? Standardize, Specialize and Repeat
  - Create a flexible version of the Software that can be quickly configured and deployed.
  - Automate support through remote access.
- Sell easy to deploy software to many clients.
  - Decrease the Margin
  - Increase the Customers
- Hybrid+ is more advanced charge a flat monthly fee for the software, support and management



# Software-as-a-service and cloud computing

- Develop Web Application
- Offer to customers over Internet
- No deployment costs
- Amortize Management and Support costs over many clients

