# Chapter 1: Introduction

#### What is a Distributed System?

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▶ A distributed system is a collection of independent computers that appears to its users as a single coherent system.

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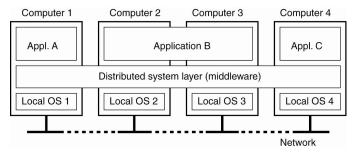
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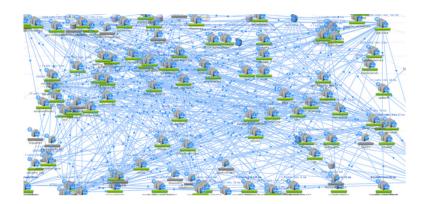
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It handles resource management, interapplication communication, masking of and recovery from failures, security and accounting services.



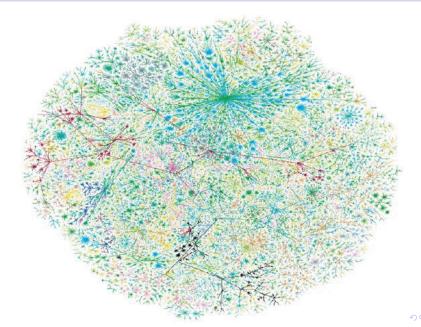


The Internet is just a world passing around notes in a classroom. -Jon Stewart



Google Search

I'm Feeling Lucky





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- Virtually every substantial website!



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- Scalable

# Making Resources Accessible

▶ Benefits

## Making Resources Accessible

- Benefits
  - Better economics by sharing expensive resources
  - ► Easier to collaborate and exchange information
  - Create virtual organizations where geographically dispersed people can work together using groupware
  - ► Enables electronic commerce
- Problems

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#### Problems

- Eavesdropping or intrusion on communication
- Tracking of communication to build a profile

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Failure	Hide the failure and recovery of a resource

Completely hiding the distribution aspects from users is not always a good idea in a distributed system.

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- Expecting several replicas to be always consistent could degrade performance unacceptably
- ► For mobile and embedded devices, it may be better to expose distribution rather than trying to hide it
- Signal transmission is limited by the speed of light as well as the speed of intermediate switches

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- Services are described via interfaces, which are often describe via an Interface Definition Language (IDL). Interfaces only specify syntax so semantics is left to the ambiguities of natural language.
- Interoperability, Portability, Extensibility.
- ▶ Separating policy from mechanism. For example: *caching* in a web browser.

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- Size: be able to easily add more users and resources to a system
- Geographical: be able to handle users and resources that are far apart
- Administrative: be able to manage even if it spans independent administrative organizations

Centralized versus distributed implementations.

Centralized services.

- Centralized services.
- Centralized data.

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- Centralized data.
- Centralized algorithms.

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- ▶ Failure of one machine does not ruin the algorithm.
- ▶ There is no implicit assumption that a global clock exists.

**In-class exercise**. Simulate a centralized and a distributed algorithm for the same problem in class!

# Scaling Techniques

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## Scaling Techniques

- ► Hiding communication latencies: Examples would be asynchronous communication as well as pushing code down to clients (E.g. Javascript)
- Distribution: Taking a component, splitting into smaller parts, and subsequently spreading them across the system. (E.g. Domain Name System)
- Replication: Replicating components increases availability, helps balance the load leading to better performance, helps hide latencies for geographically distributed systems. Caching is a special form of replication.

False assumptions made by first time developer (formulated by Peter Deustch).

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"A distributed system is one in which the failure of a computer you didn't even know existed can render your own computer unusable."

-Leslie Lamport

#### In-class Exercise

▶ Walk through architecture of various distributed systems ranging from: single server/client, multiple server/clients, point to point and others.

Distributed Computing Systems

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  - Cluster Computing Systems
  - Grid Computing Systems
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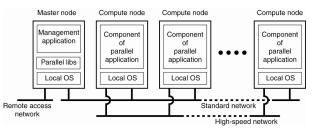
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  - ► Transaction Processing Systems
  - Enterprise Application Integration
- ► Distributed Pervasive Systems
  - Ubiquitous Computing Systems
  - Mobile Computing Systems
  - Sensor Networks

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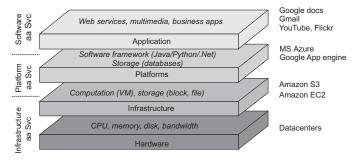
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#### Cloud Computing

 Cloud Computing provides the facilities to dynamically construct an infrastructure and compose what is needed from available services.



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- Application: Actual applications, whether distributed or not. Includes apps such as office suites (text processors, spreadsheet applications, presentation applications). Comparable to the suite of apps shipped with traditional OSes.

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- ▶ Basic approach: A networked application is one that runs on a server making its services available to remote clients. Simple integration: clients combine requests for (different) applications; send that off; collect responses, and present a coherent result to the user.
- Next step: Allow direct application-to-application communication, leading to Enterprise Application Integration (EAI).

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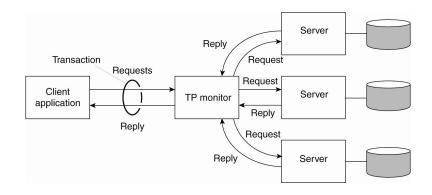
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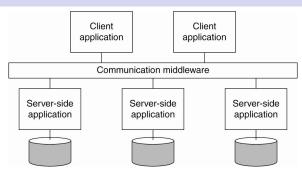
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Transactions can be **nested**. Durability applies to top-level transactions only. For example: an airline and a hotel database. This led to the design of Transaction Processing Monitors (TP Monitors) to coordinate the commitment of multiple subtransactions.



### Enterprise Application Integration



Middleware as a communication facilitator for enterprise application integration. This can be done in multiple ways. For example:

- ▶ Remote Procedure Call (RPC): Requests are sent through local procedure call, packaged as message, processed, responded through message, and result returned as return from call.
- ► Message Oriented Middleware (MOM): Messages are sent to logical contact point (published), and forwarded to subscribed applications.

### Distributed Pervasive Systems

Characteristics of pervasive systems (aka Internet Of Things):

- Blends into the environment
- Encourage ad hoc composition
- Naturally distributed
- Nodes are often small and battery powered
- Wireless/mobile communication is the norm

Examples: Ubiquitous Computing Systems, Mobile Computing Systems, Sensor (and actuator) networks

### In-class Exercise

**In-class Exercise**: Classify the distributed system examples we have seen so far into the three categories: Distributed Computing Systems, Distributed Information Systems, Distributed Pervasive Systems.

### Chapter 1: Recommended Exercises

- ▶ **Problem 1**. What is the role of middleware in a distributed system?
- ▶ **Problem 2**. Explain what is meant by transparency, and give examples of different types of transparency.
- ▶ **Problem 3**. Scalability can be achieved by applying different techniques. What are these techniques?
- Problem 4. Give further examples of distributed pervasive systems.