



# Cooperative Private Searching in Clouds

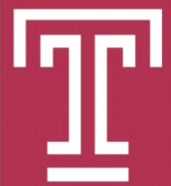
Jie Wu

Department of Computer and Information Sciences  
Temple University

# Road Map

- **Cloud Computing Basics**
  - Cloud Computing Security
  - Privacy vs. Performance
- **Proposed Scheme**
  - Trust Third Party (TTP)
  - Protocol Design
- **Evaluation**
  - Analytical study
  - Simulation study
- **Extensions**
- **Some Challenges**





# Center for Networked Computing

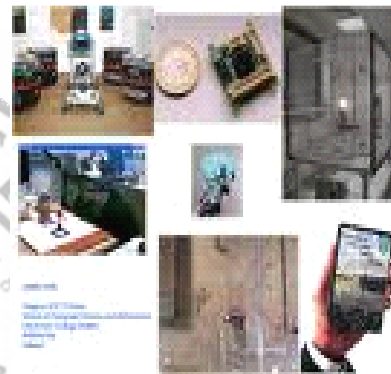
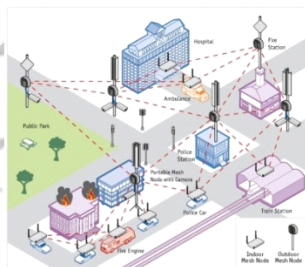
Jie Wu, Center Director  
Computer and Information Sciences, Temple University



## Networks: wireless and mobile

Internet (NSF GENI)

- Mesh networks (NSF MRI)
- Sensor networks (NSF NeTS)
- Delay-tolerant networks (NSF TC)
- Underwater networks (Navy Yard)
- Vehicular networks (SEPTA Regional Rail)



## Network security and privacy

- Wireless networks (ARO)
- RFID and medical applications



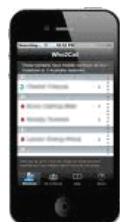
## High performance computing

- NSF GPU/CPU supercomputer (MRI)



## Social networks and cloud computing

- Online social networks (Amazon & NSF)

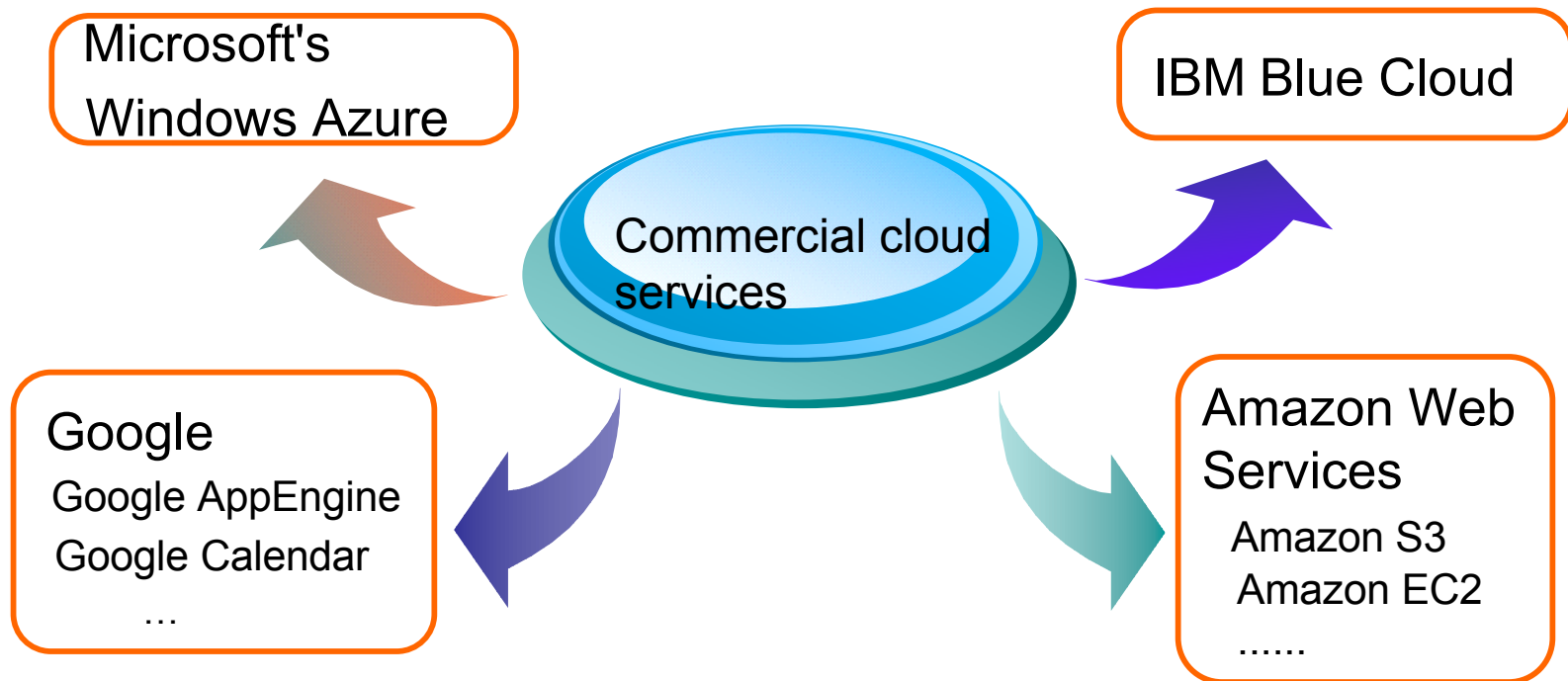


PSU



# 1. Cloud Computing Basics

## Cloud Computing Providers

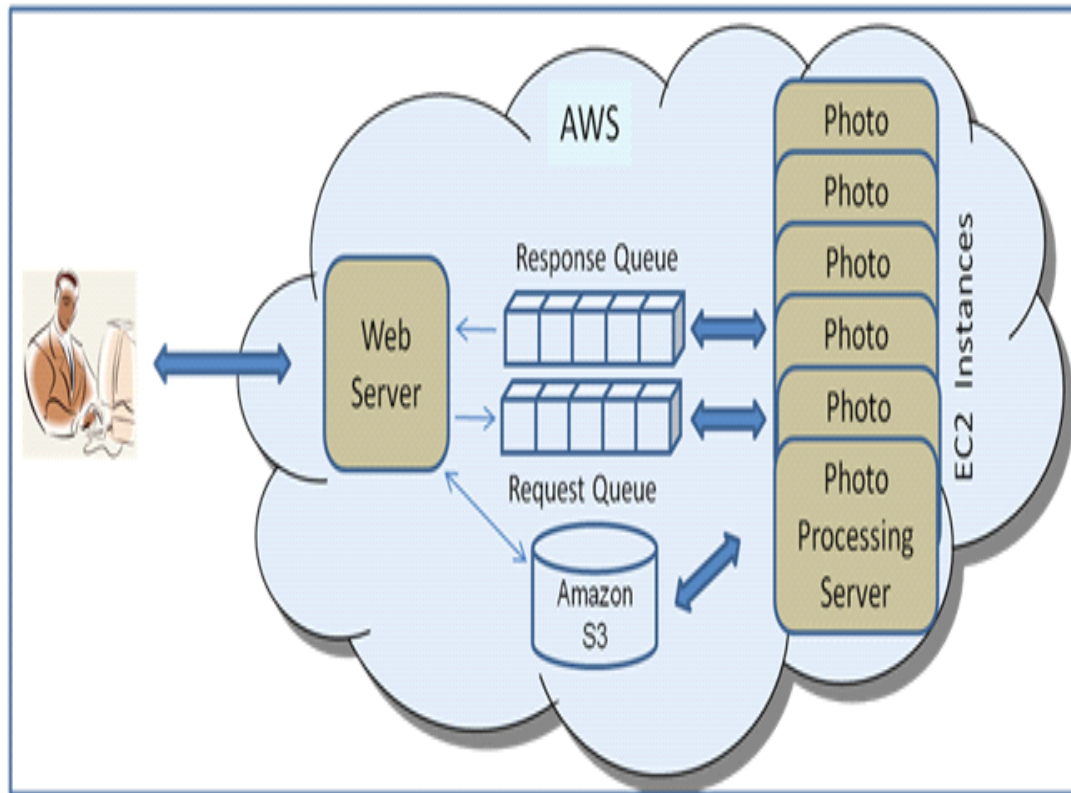


# Examples of Cloud Computing (I)



- **Google Docs:** Users can edit documents on-line.
- **Google Calendar:** Maintain a collaborated schedule with friends.
- **Google Picasa:** Share and process pictures on-line.
- **Google AppEngine :** Users can run web apps on Google's infrastructure

# Examples of Cloud Computing (II)



**Amazon Elastic Compute Cloud (EC2):** Run applications or OS on Amazon's infrastructure.

**Amazon Simple Storage Service (S3):** Store files on Amazon's storage servers

# What is Cloud Computing?

- Key characteristics (NIST)
  - On-demand service.
  - Broad network access.
  - Resource pooling.
  - Rapid elasticity.
  - Metered service.
  - Encompasses many different technologies.

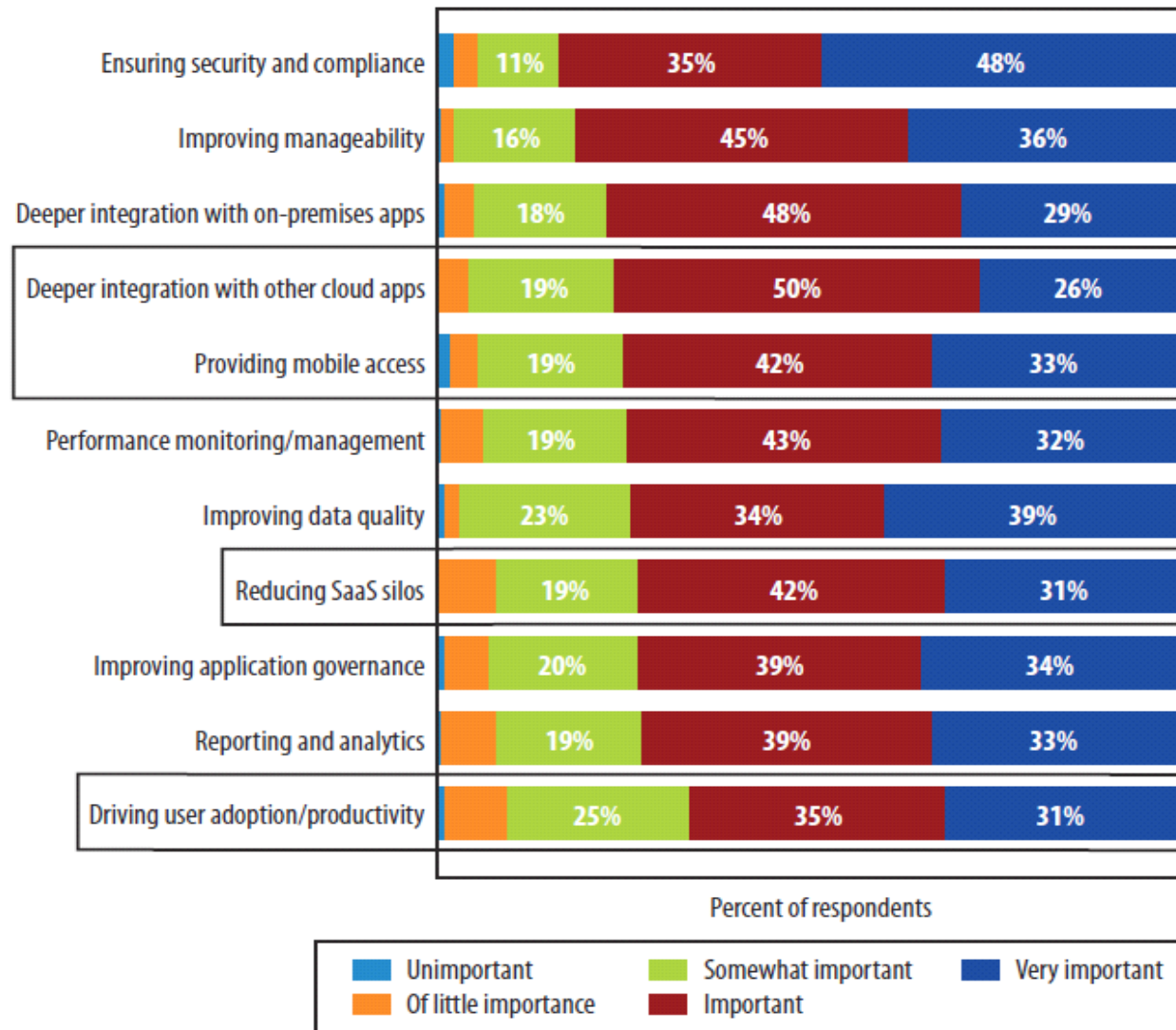
Cloud computing

Thin clients

Utility computing

Grid computing

# Cloud adopters' priorities





# Cloud Computing Security

- Different types of security
  - Insider attacks, vulnerabilities for virtualization, data loss, data leakage, vendor lock-in, and privacy.
- Conventional wisdom is to design cryptographic solutions to achieve security.
  - But there are other considerations.
- A secure cloud solution with very high overhead will not be practical !

# Analogy to Streaming Multimedia

- How to improve the user's experience of watching multimedia content ?
- Improving Internet **bandwidth** will improve streaming performance.
- But that is not the only approach.
  - Better buffering algorithms.
  - Improving **data compression** and coding.
  - Deploying web caches.
  - .....

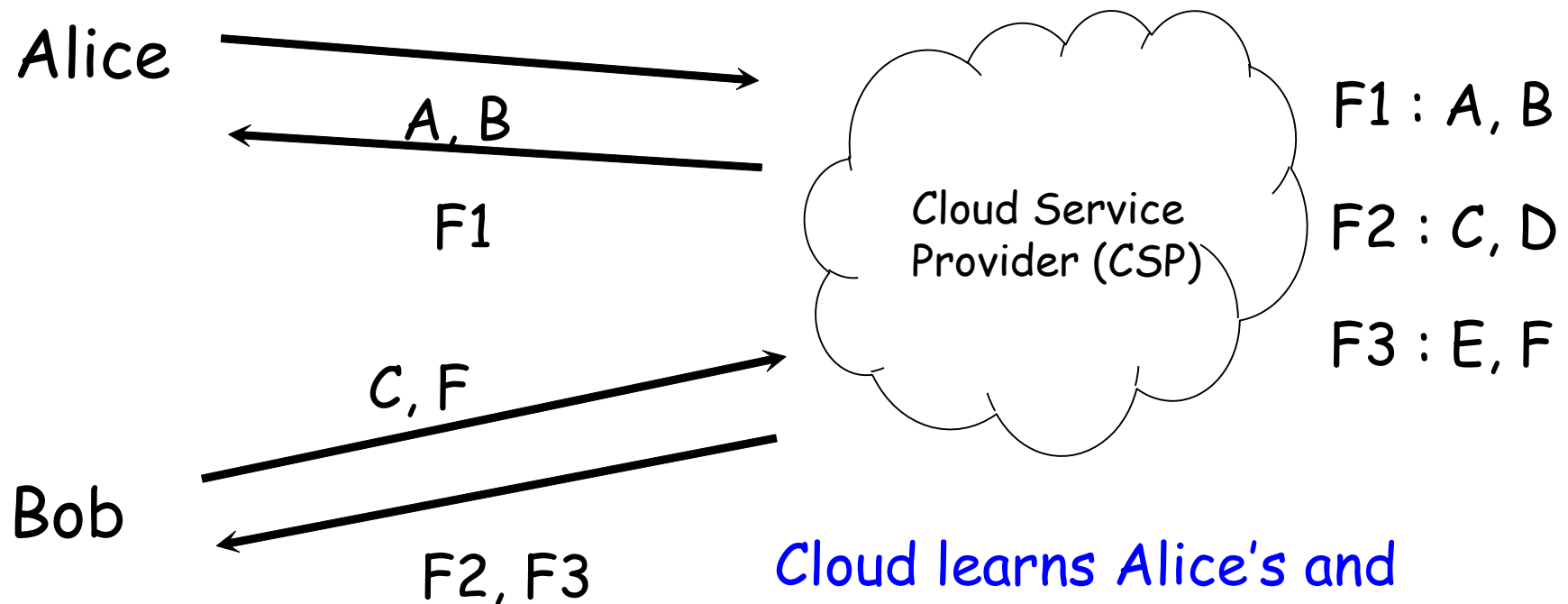
# Privacy and Performance



- How to protect **user privacy** ....
  - defending against insider attacks, data leakage, etc.
- ..... while ensuring **good systems performance**.
  - includes conserving bandwidth, reducing energy through minimizing computation and communication (green clouds).

## 2. Proposed Scheme

Example: Users Querying the Cloud



Cloud learns Alice's and Bob's queries and responses.



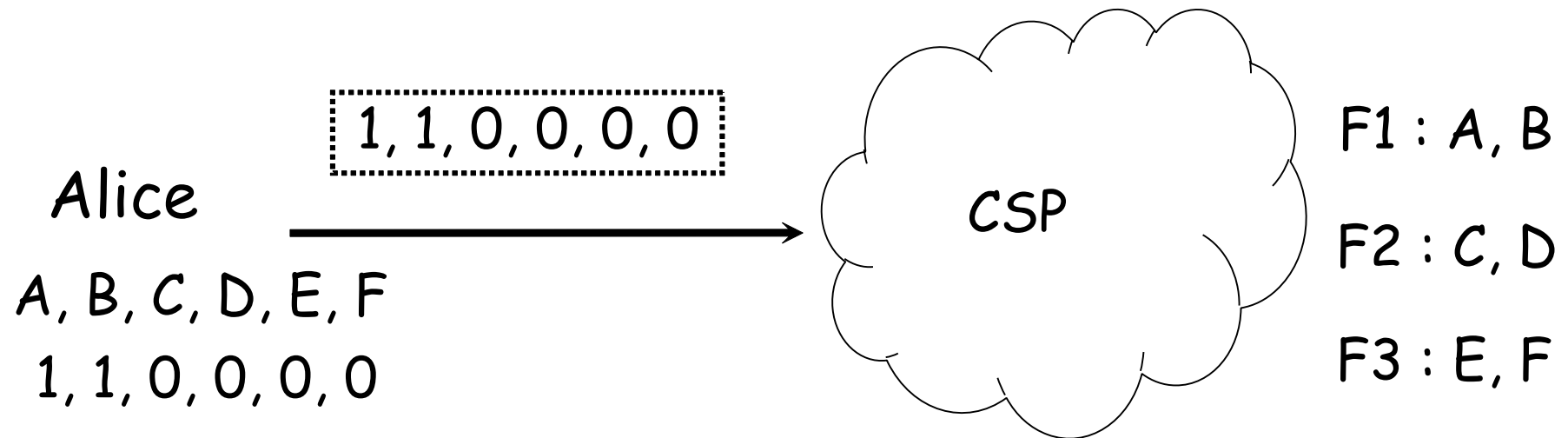
# Search and Access Privacy

Cloud neither learns what the user is searching For, nor which files are returned to a user.

Cloud: honest but curious.

It will obey general rules, but still wants to know some additional information.

# Prior Solution (CRYPTO 2005)

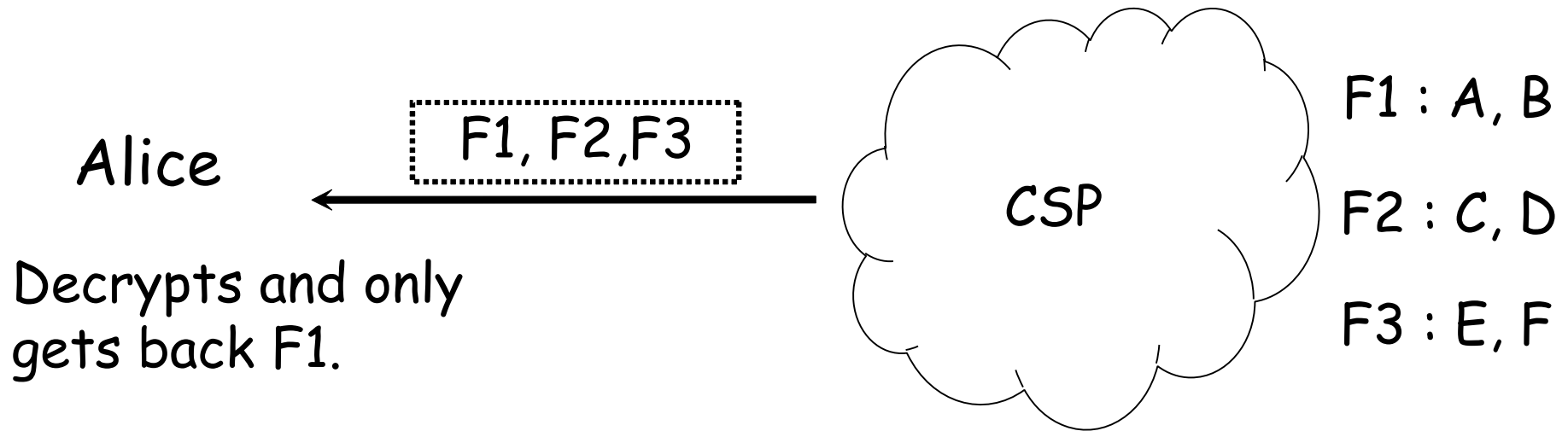


Alice issues a special query  $1, 1, 0, 0, 0, 0$

with a dictionary of  $d$  slots encrypted using **homomorphic encryption** (processing encrypted files without decryption).

Cloud compares all files and returns all.

# Prior Solution (CRYPTO 2005)



Cloud computes and returns to Alice F1, F2, F3

F1, F2, F3 is a compressed version of F1, F2, F3.

Cloud does not know what files are returned.

# Brief Background

*Homomorphic encryption allows us to perform some operations on encrypted data **without** decryption.*

Let  $E()$  be encryption.

- $E(x) * E(y) = E(x+y)$  where  $E(x) = f(g^x)$  (Paillier system)
- $E(X)^Y = E(X * Y)$

**key trick:** map unwanted file  $F$  to  $0$

- $E(0)^{|F|} = E(0 * |F|) = E(0)$
- Users encrypt interests in  $E(0)$  or  $E(1)$

Returned files can be easily compressed without conflict, as all unwanted files are now  $E(0)$



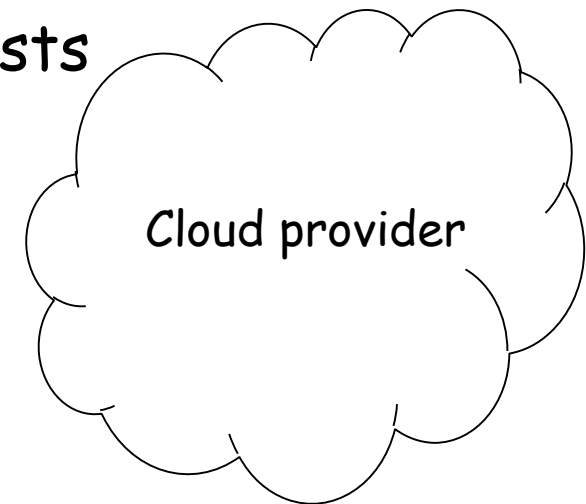
# Key Points

- Prior research solves the privacy problem.
- But the overhead is high
  - **High** bandwidth and computation costs

Alice 1, 1, 0, 0, 0, 0

Bob 0, 0, 1, 0, 0, 1

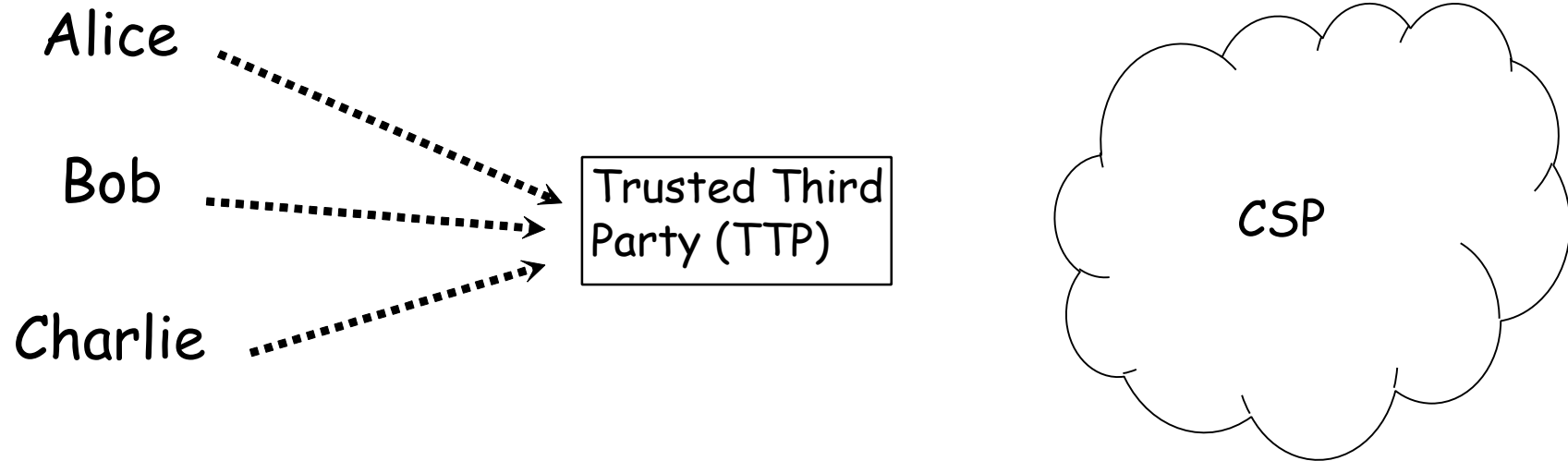
1, 1, 1, 0, 0, 1



We can combine queries

- **computation**: 1 computation for  $n$  users
- **bandwidth**:  $d$  (dictionary size) and  $2f \log(f/p)$  (from cloud), where  $f$  (# of returned files) depends on # of keywords and their distribution and  $2 \log(f/p)$  is the redundancy level given a tolerable failure rate  $p$

# Trusted Third Party (TTP)



- Deploy a **Trusted Third Party** (TTP), but we want to limit the amount of trust.
- Users forward their queries to TTP.
  - How to combine queries?
  - How to prevent TTP from learning everybody's queries?

# Conceptually

Alice

Bob

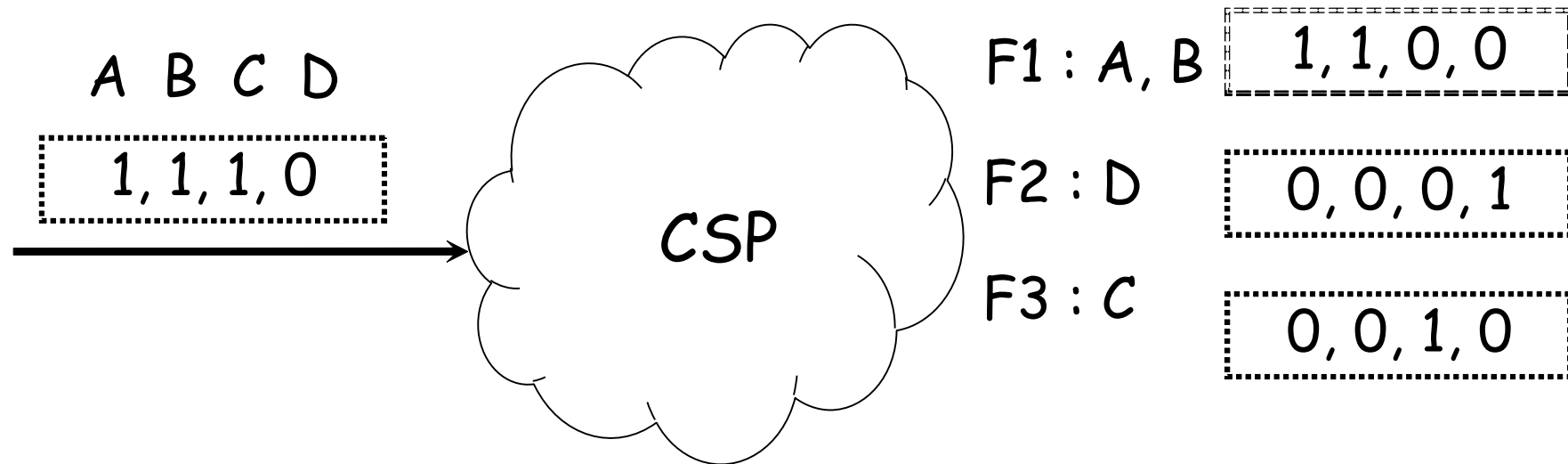
Charlie

Trusted Third  
Party (TTP)



- TTP aggregates queries and sends them to the cloud. The cloud returns answers to TTP.
- TTP looks like a "single" user.
  - How does the cloud compute aggregated query?

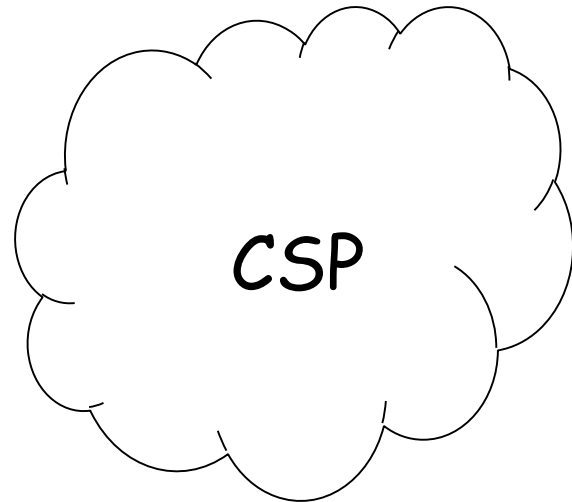
# Cloud Processing Query



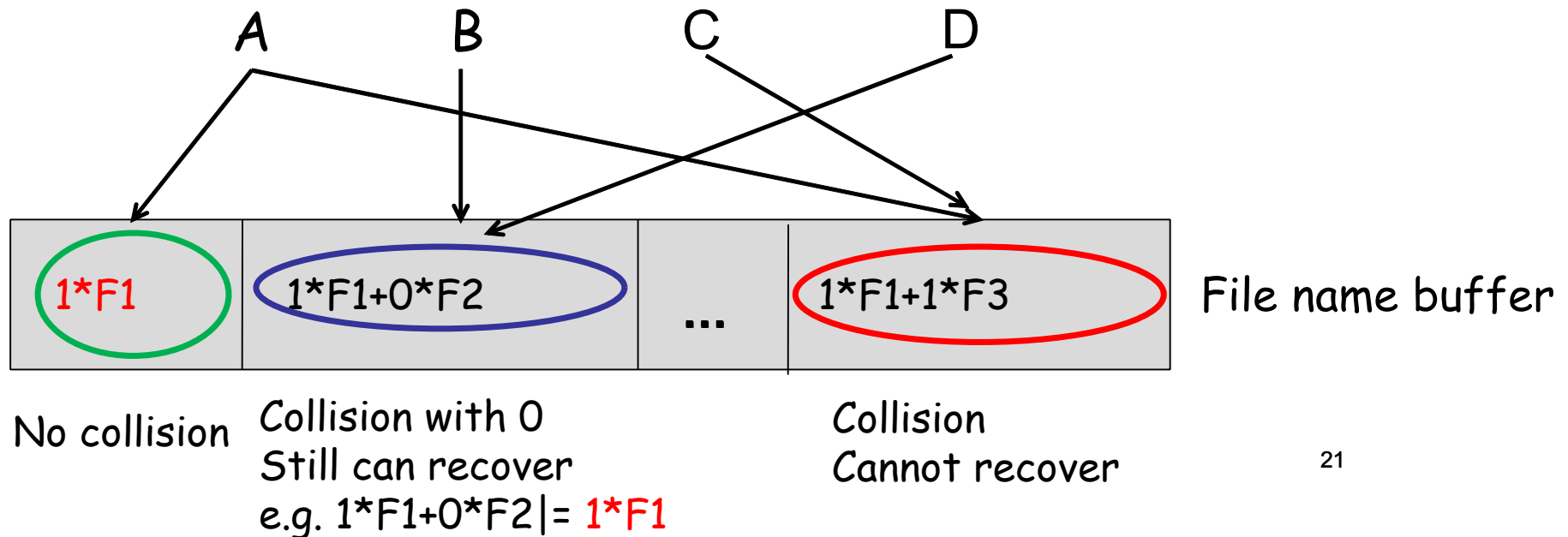
For each file, the scalar product  $E(c)$  is computed, and the file content,  $|F|$ , is then powered by  $E(C)$ , i.e.,  $E(c)^{|F|} = E(c^*|F|)$ .

$F1 : (2, 2^*|F1|), F2 : (0, 0^*|F2|), F3 : (1, 1^*|F3|)$

# Cloud Preparing Response



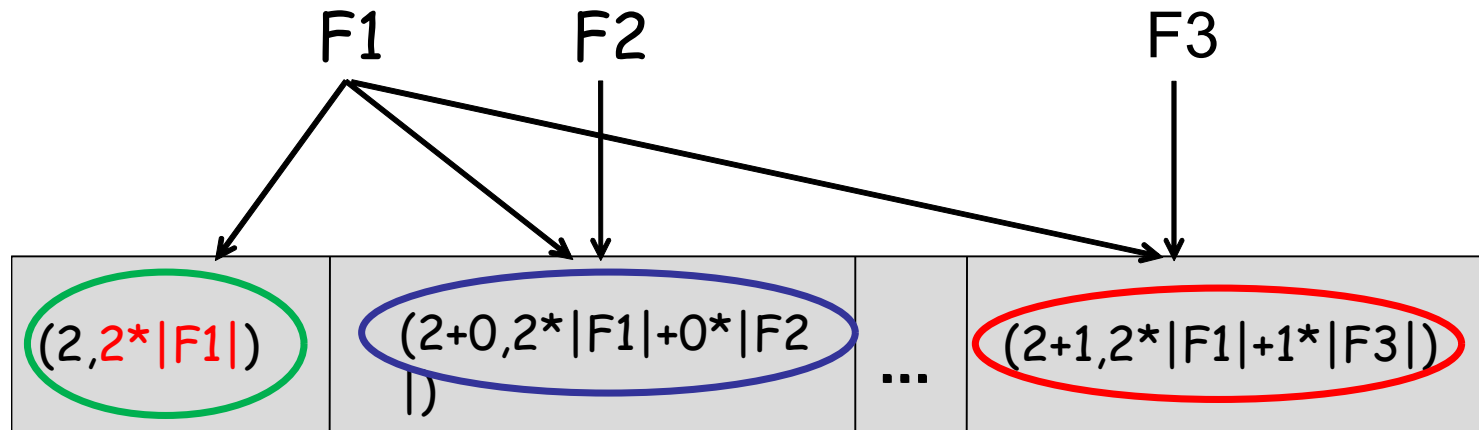
Cloud returns 2 buffers to the TTP.  
A **file name** (e.g. F1) buffer



# Cloud preparing response



A **file content** buffer (e.g.  $|F1|$ ).



File content  
buffer

No collision

Collision with 0  
Still can recover  
e.g.  $2*|F1|+0*|F2| = 2*|F1|$

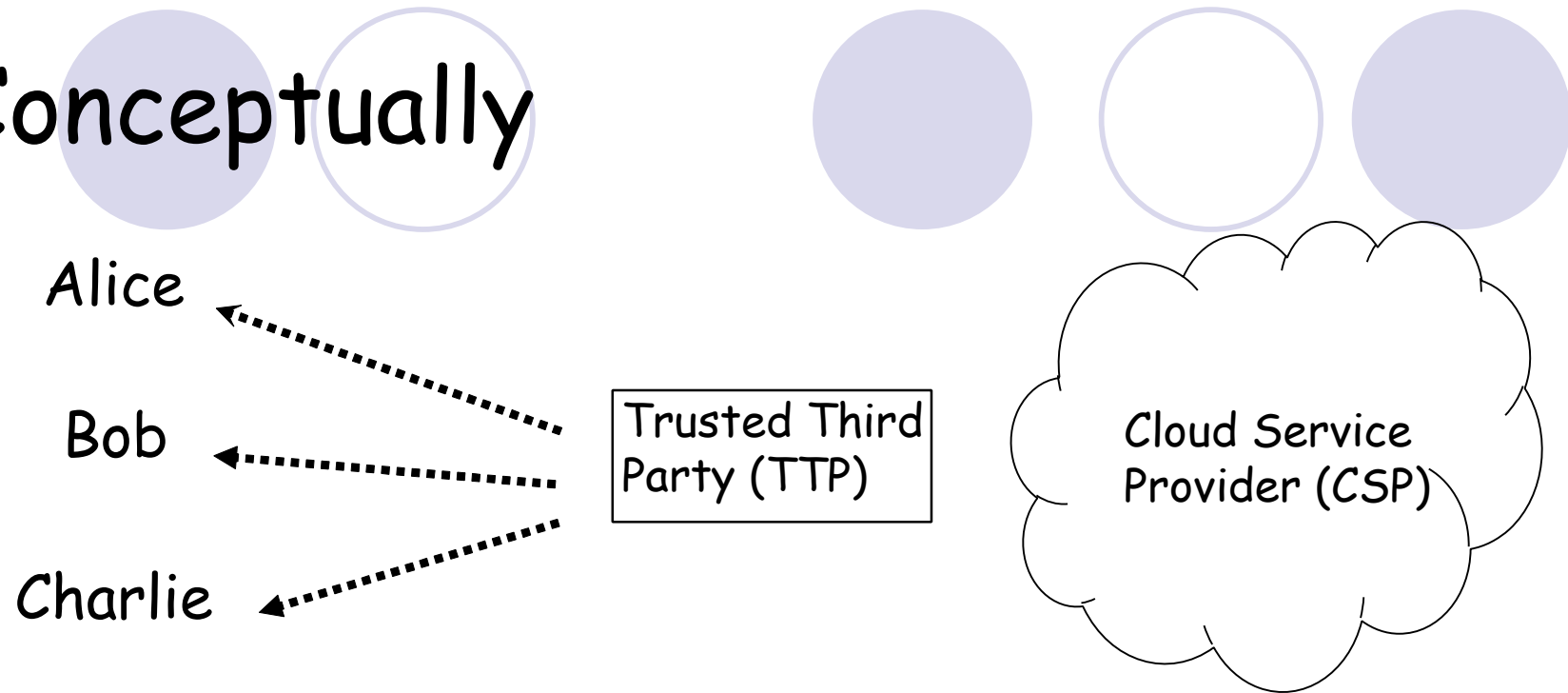
Collision  
Cannot recover



# Size of Return Buffers

- If the user wants to retrieve  $f$  files with failure probability  $p$ , then each file should be thrown  $r$  times into a buffer of size  $2rf$ , s.t.  
 $r = \log(f/p)$ .
- To retrieve  $K$  keywords and  $f$  files with failure probability  $p$ , we should construct two buffers with size  $2K \cdot \log(K/p)$  and  $2f \log(f/p)$ , respectively.

# Conceptually

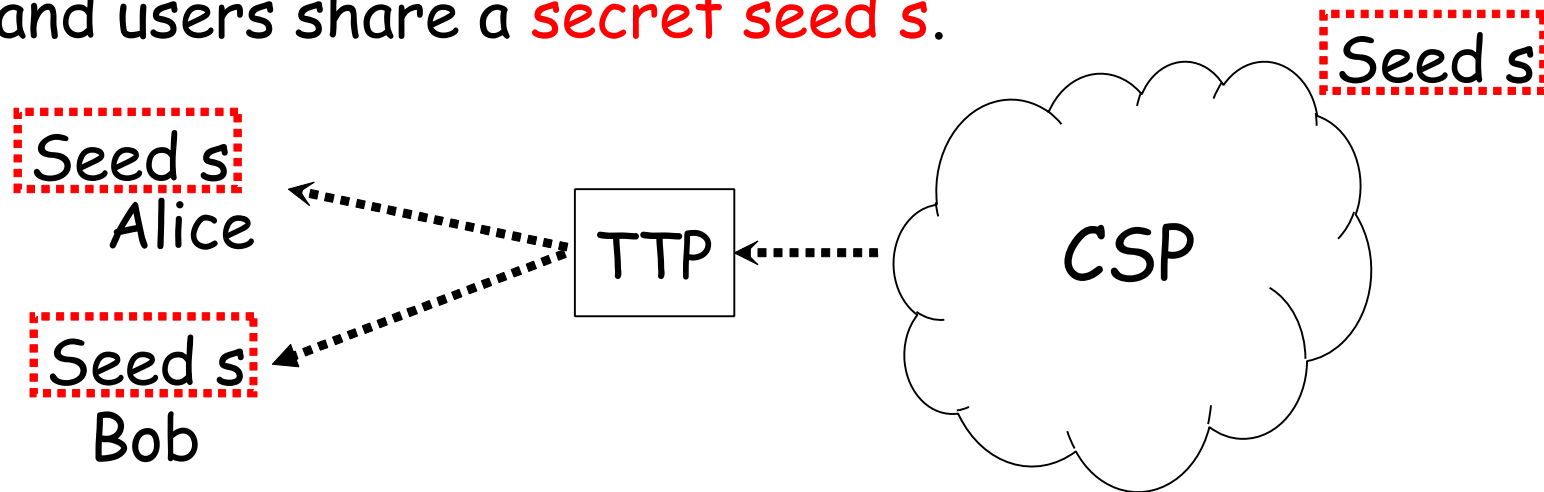


- TTP processes the cloud response and returns answers to users.
  - How to efficiently return answers to users?
  - How to prevent TTP from learning new information?



# TTP Returns Results

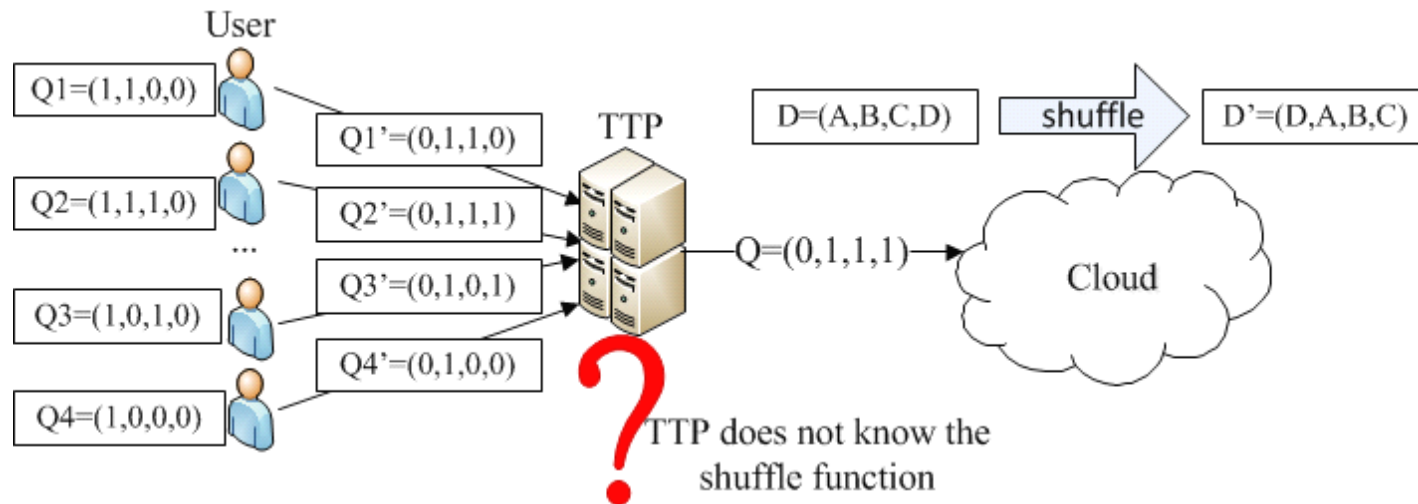
- TTP has to decrypt the file content buffer to return file contents to users.
- To prevent TTP from learning file content, cloud and users share a **secret seed  $s$** .



- Cloud generates random number ( $R$ ) for each file ( $F$ )
- Cloud will XOR each file content:  $|F| \text{ XOR } R$ .
- Users can recover  $|F|$  by computing  $R$  with shared  $s$ .

# Shuffle for Limited Trusted TTP

- Protocol lets each user shuffle their query with a shuffle function to prevent the cloud from learning a users' query.
- The shuffle function is known to users and the cloud, but not the TTP.



### 3. Evaluation: Analytical Study

$d$ : number of query terms,  $t$ : total number of files in cloud, and  $f$ : number of returned files.

- Ignore TTP bandwidth and TTP computation costs.
- $f = t (1 - (1-q)^K)$ , where  $q$  is the probability a keyword appears in a file.

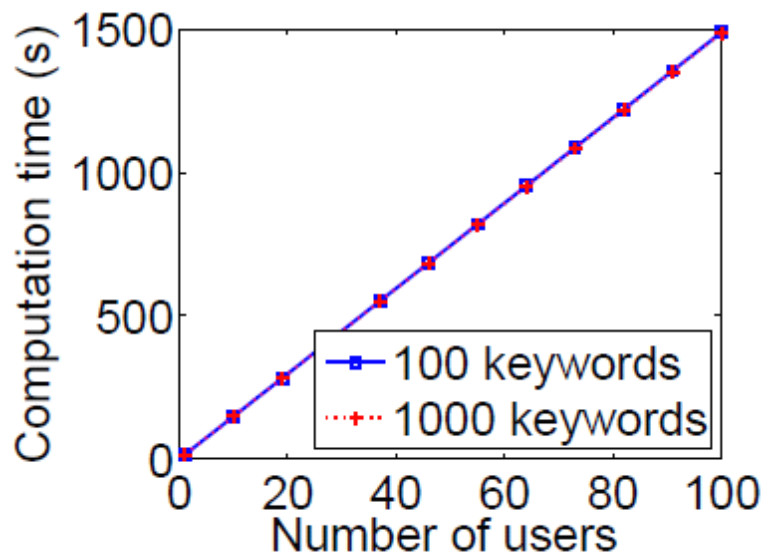
	1 user	n users (previous)	n users (our sol.)
Transmission cost (from users to cloud)	$O(d)$	$O(n * d)$	$O(d)$
Transmission cost (from cloud to users)	$O(f \log (f/p))$	$O(n * f \log (f/p))$	$O(c * f \log (f/p))$ $1 < c \leq n$
Computation cost (within the cloud)	$O(t)$	$O(n * t)$	$O(t)$

The title "Simulation Parameters" is centered at the top of the slide. It is surrounded by five circles of varying shades of light purple. From left to right, the circles are: a solid light purple circle, an outlined light purple circle, a solid light purple circle, an outlined light purple circle, and a solid light purple circle.

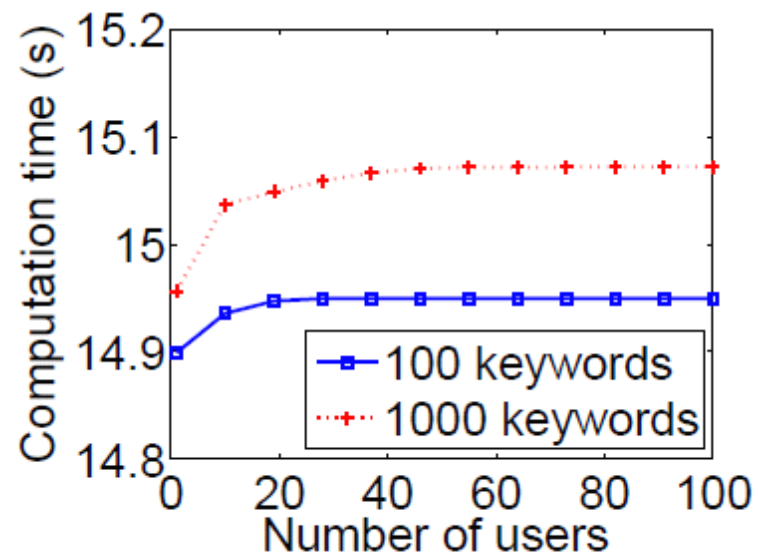
# Simulation Parameters

Notation	Description	Value
$ F $	File content	1KB
$ w $	Keyword content	1KB
$n$	Number of users	1-100
$d$	Number of keywords in the dictionary	100-1,000
$k$	Number of keywords in each query	1-5
$l$	Number of keywords in each file	1-5
$t$	Number of files stored in the cloud	$10^3$
$p$	Failure probability	0.1

# Evaluation Results (I)



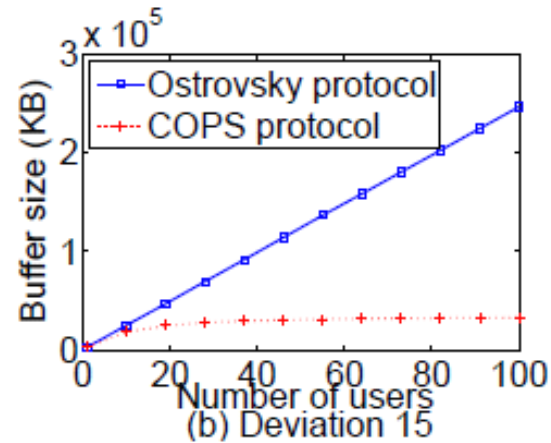
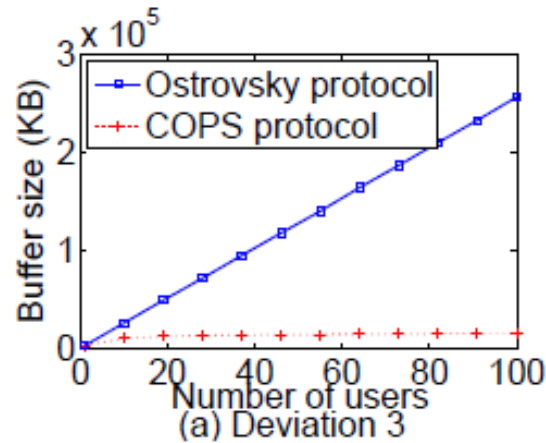
(a) Ostrovsky protocol



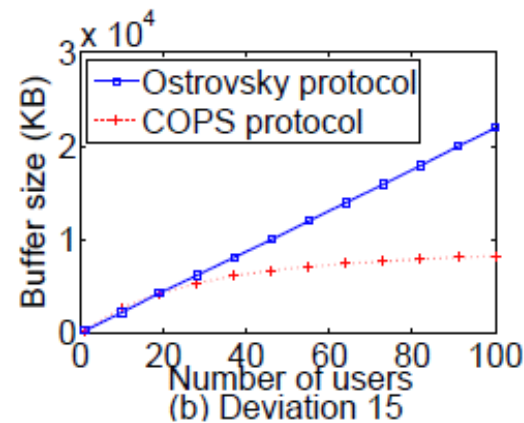
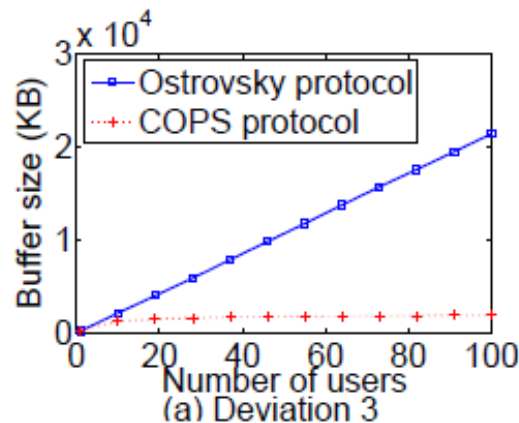
(b) COPS protocol

Dictionary contains 100-1,000 keywords.  
Each file contains 1-5 keywords  
With 1024-bit keys, multiplications and exponentiations  
take 6.3 $\mu$ s and 14.7 ms

# Evaluation Results (II)

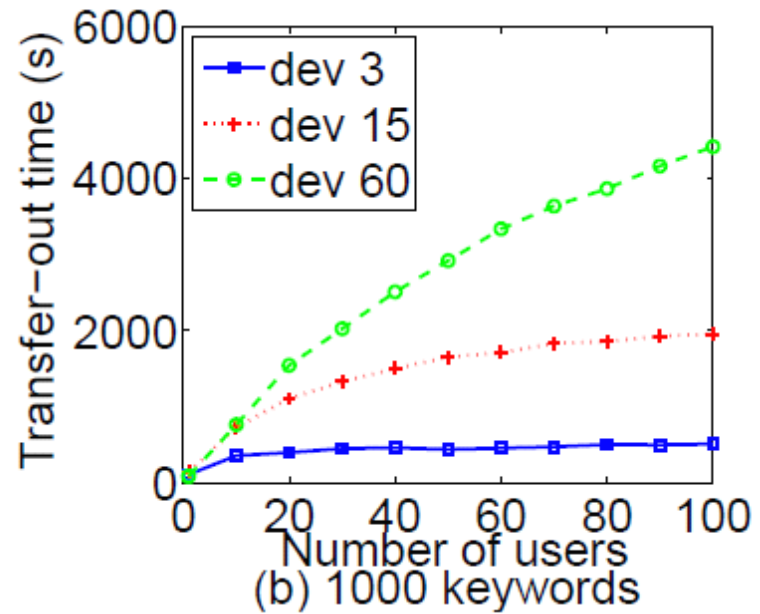
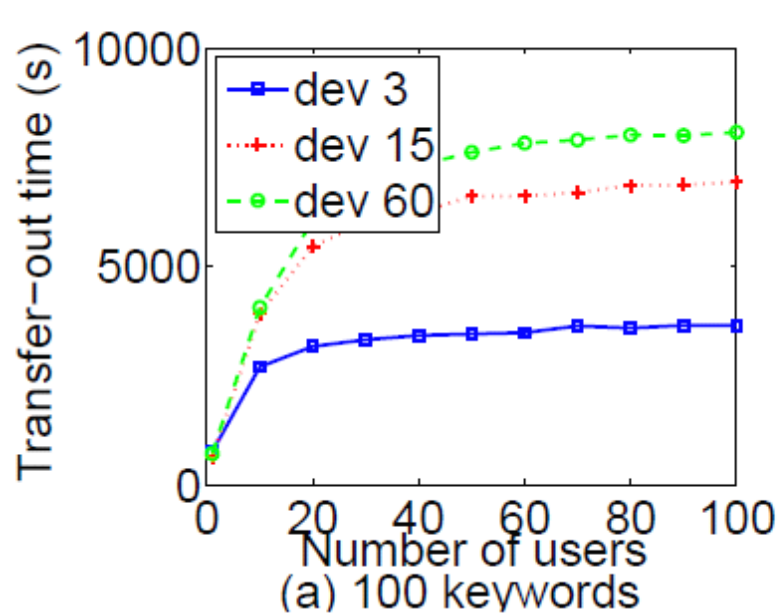


Dictionary contains *100* keywords. Keyword distribution follows normal distribution, with different deviations (dev). The higher the dev, the less common the keywords are among users.



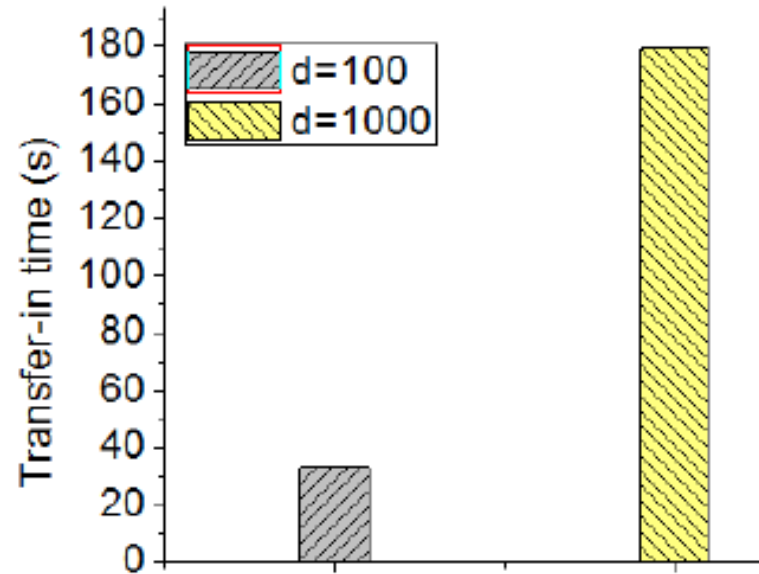
Dictionary contains *1,000* keywords.

# Evaluation results (III)



Transfer-out a buffer from the cloud to the TTP

# Evaluation results (IV)



Transfer-in a dictionary from the TTP  
to the cloud



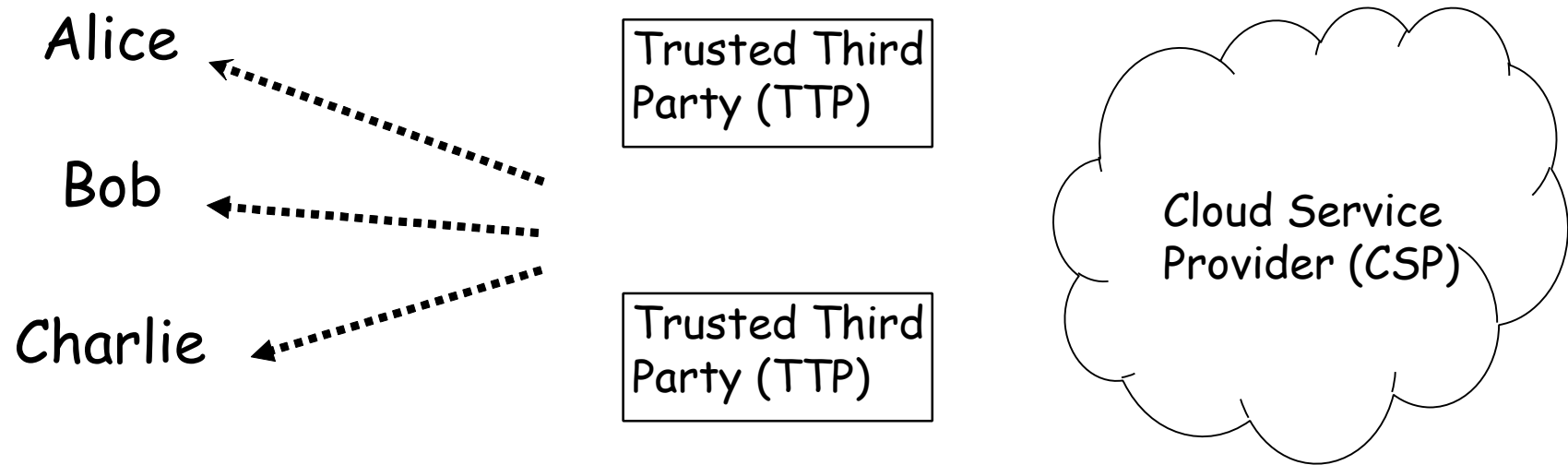
## 4. Extensions



- Ranked Queries: differential service
  - Cloud returns a certain percentage of matched files for a given rank.
  - Rank privacy: cloud provides differential query service without knowing which level of service is chosen by the user.
  - Mask matrix: allows the cloud to filter out a certain percentage of matched files.

# Extensions (Cont'd)

- Multiple TTPs: resolve bottleneck at TTP



# Extensions (Cont'd)

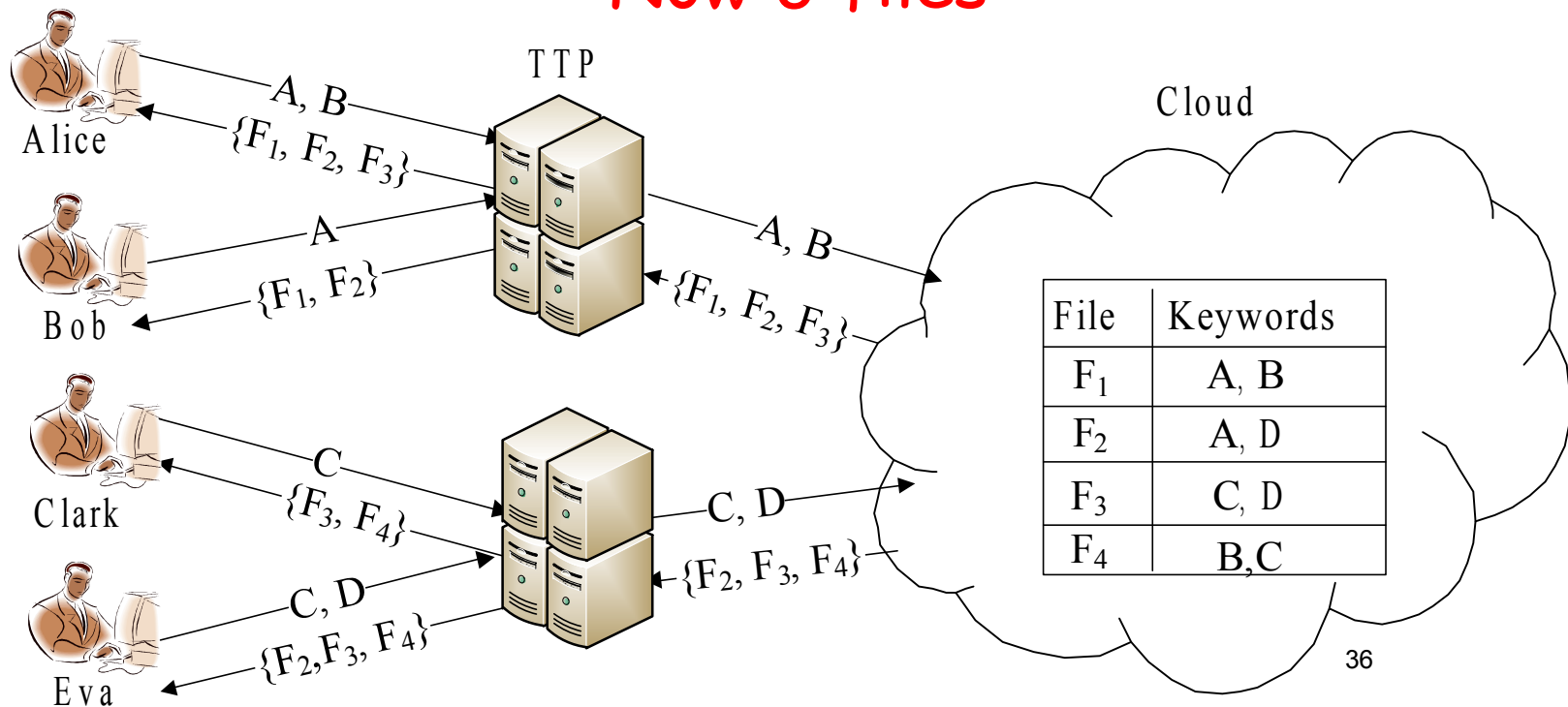


- Cost Efficiency
  - For a given group #, group users with overlapping keywords to minimize # of 1s in each group have the same size.
- Load Balancing
  - For a given  $U$ , create a minimum # of groups such that 1s in each group are bounded by  $U$ .
- Robustness
  - For a given  $K$ , use one of the grouping criteria in such a way that each query appears in at least  $K$  different groups.

# 4. Multiple TTPs: Grouping

- If Alice and Clark are in a group, and Bob and Eva are in another group, the cloud needs to return **8** files.

Now 6 files



# Problem formulation

- Classifying  $n$  users into  $k$  groups, so that the number of keywords in  $k$  combined queries, i.e., **the total number of 1s**, is minimized.
- Basic idea: **K-Mean-based Dynamic Grouping**
- Choose  $k$  queries as the **seeds**, and classify the queries that are closest to the seed into a group.

# K-Mean-based Dynamic Grouping

$Q_1 = \langle 11100000 \rangle$	$Q_5 = \langle 00000111 \rangle$
$Q_2 = \langle 11000000 \rangle$	$Q_6 = \langle 00000011 \rangle$
$Q_3 = \langle 11000000 \rangle$	$Q_7 = \langle 00000011 \rangle$
$Q_4 = \langle 00010000 \rangle$	$Q_8 = \langle 00001000 \rangle$

P1: Random

P4: Random Robust

**KMDG: P2**

- Balance group size

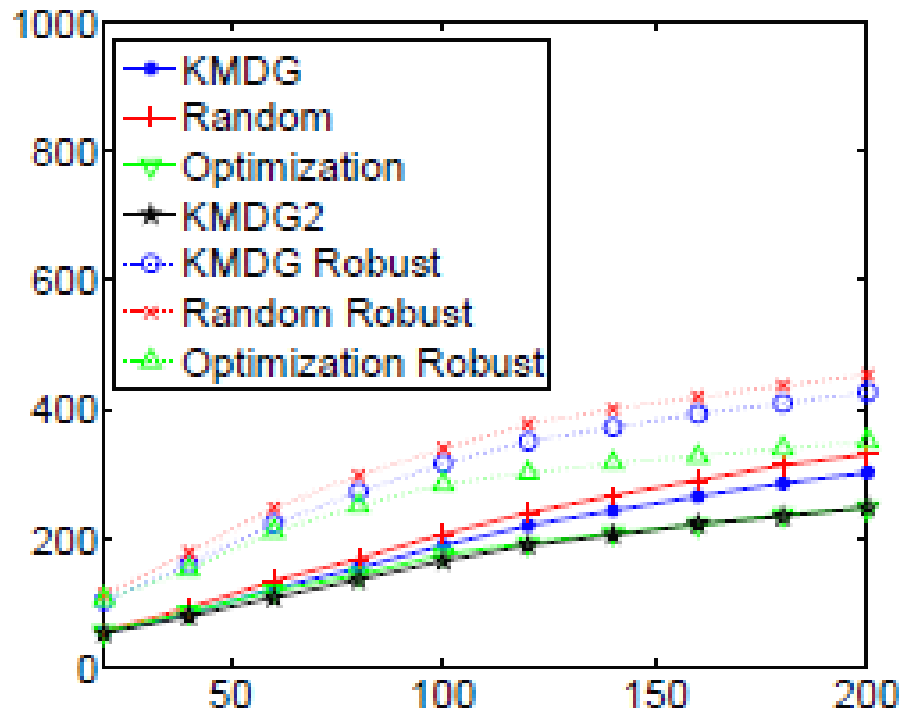
**KMDG2: P3**

- Balance # of 1s

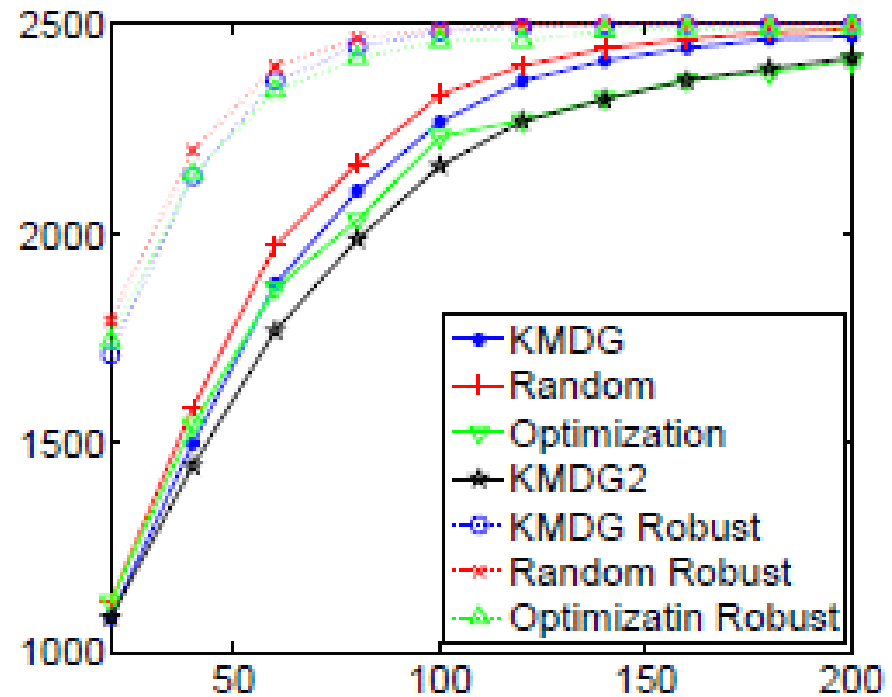
**KMDG Robust: P5**

	$\mathcal{E}_1$	$\mathcal{E}_2$	$\mathcal{E}_3$	$\mathcal{E}_4$																																
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# Experiment results



The total number of 1



Bandwidth (MB)

X axis: number of users  
 K=5 and dictionary size 100

# 5. Future Trends and Challenges

Increasing popularity of **multicloud** environments.

- How do we select which cloud should perform a particular task?

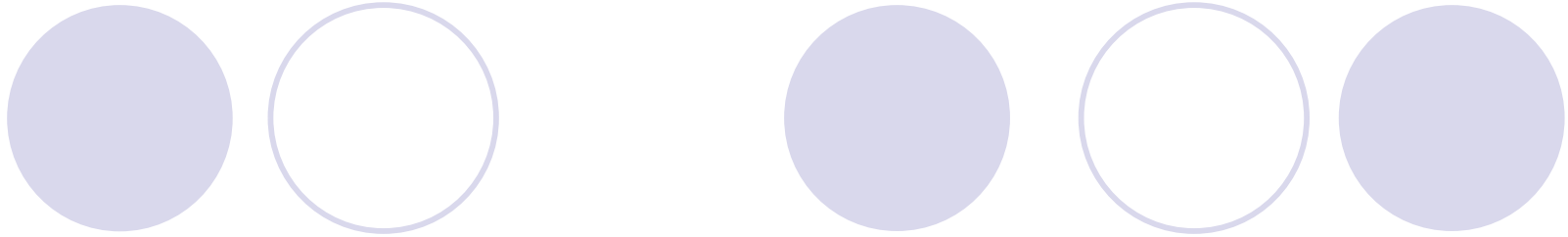
Convergence of **mobile and cloud computing**.

- Increase functionality of smartphones by outsourcing data and computation to the cloud.

Viable **cost/price model**.

- Workable model between CSP and users.





Thank you

My Research Team

Qin Liu

Dr. Chiu C. Tan

