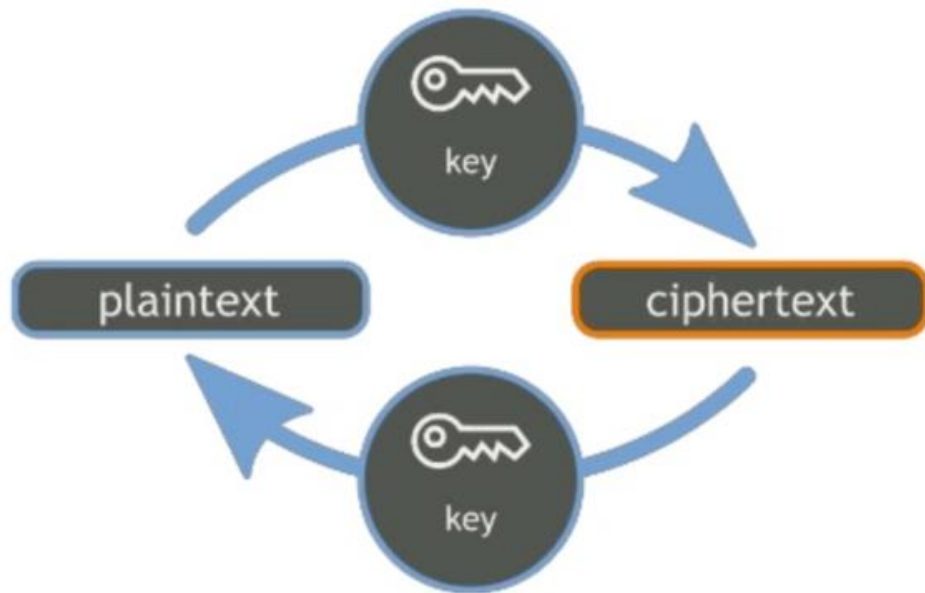


CSE 539
Applied Cryptography
Fall 2024

Ni Trieu (ASU)

Recap: What is Cryptography?

- Cryptography is more than just hiding information (i.e., encryption)
- Cryptography is math
- Crypto definition
 - Idea: compare 2 probability distributions



One-time Pad:

- $Enc(k, m) = k \oplus m$
- $Dec(k, c) = k \oplus c$
- $Dec(k, Enc(k, m)) = m$

Lec 2

- ~~Greetings~~
- ~~Syllabus~~
- ~~What Cryptography is~~
- What “Applied” Cryptography is
 - Why cryptography is good for the world?

“Applied” Cryptography

3. Advanced/applied cryptography (10 lectures):

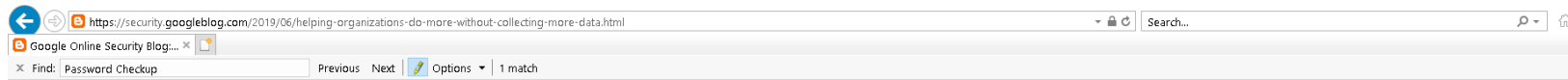
- Multi-party secure computation (2)
- Homomorphic encryption (2)
- Zero-knowledge proof/blockchain (2)
- Privacy-preserving machine learning (2 lectures)
- Private database query (1 lecture)
- Other practical problems (1 lecture)

4. Final project presentations (8 lectures)

- Secure Password Checkup
- Privacy Preserving Machine Learning

Secure Password Checkup

Credit by Google Security Blog



Password Checkup, a Chrome extension that helps users detect if a username and password they enter on a website has been compromised.

Hi there

you@example.com

check your password
against more than
500 million
previously exposed in
data breaches

To continue, first verify it's you

Enter your password

.....|

Checking...

Forgot p

KT

Hi there

you@example.com

verify that your
password has n't
been exposed

To continue, first verify it's you

Enter your password

.....|

This password was not found in
past breaches.

Forgot p

KT

Google Password Checkup



Password Checkup extension

Offered by: google.com

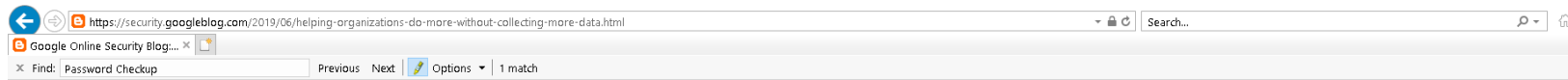


Password Checker

Offered by: David Hunt

Secure Password Checkup

Credit by Google Security Blog



Password Checkup, a Chrome extension that helps users detect if a username and password they enter on a website has been compromised.

Username:

This is the name that will be shown with your messages. You may use any name you wish. Once set, this cannot be changed.

Email:

check prospective passwords when you are creating new accounts...

Password:

Confirm Password:

Gender:

Booking.com Account

Sign in

Enter your Booking.com password for **ninitriethi@gmail.com**.

Booking.com password

.....

Google Password Checkup




Password Checkup extension

Offered by: google.com



Password Checker

Offered by: David Hunt



Change your password

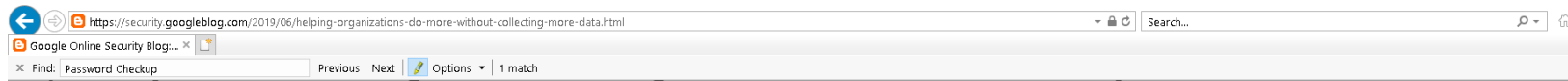
The Password Checkup extension detected that your password for **account.booking.com** is no longer safe due to a data breach.

You should change your password now.

[Learn more](#) | [Send feedback](#)

Secure Password Checkup

Credit by Google Security Blog



Password Checkup, a Chrome extension that helps users detect if a username and password they enter on a website has been compromised.

Google Password Checkup



Login



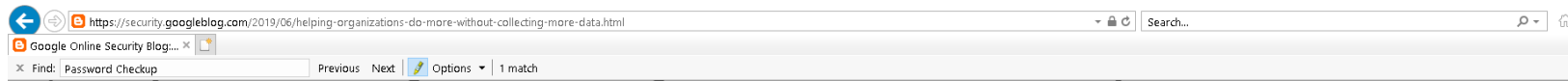
4 billion login's credential Google knows to be unsafe

Compare...



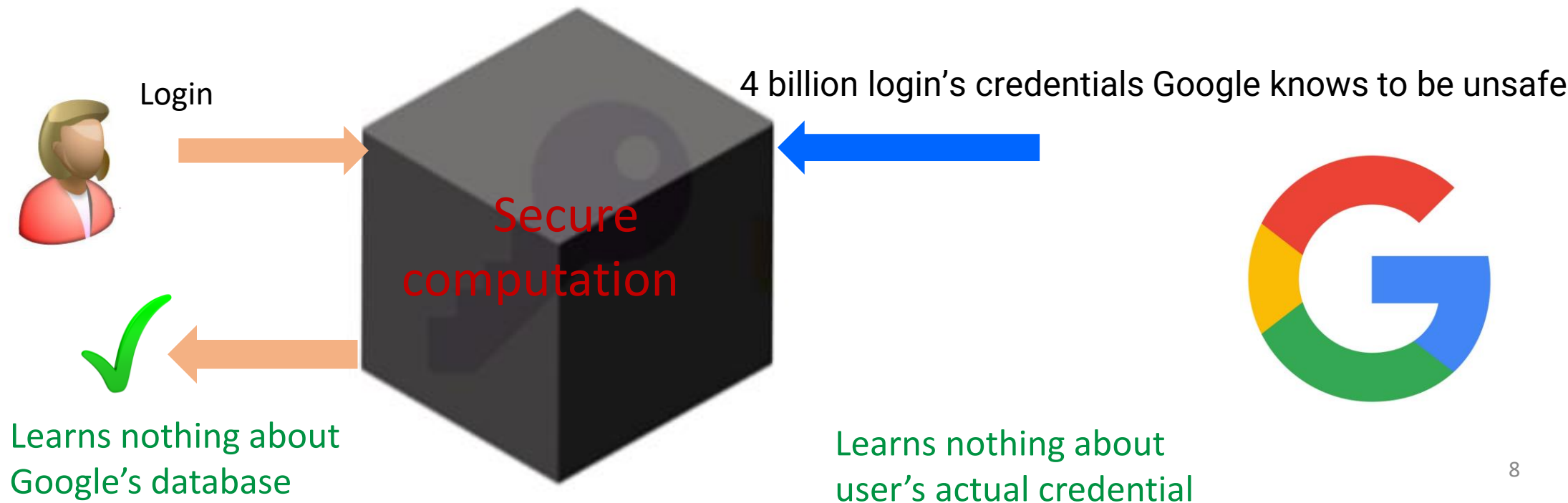
Secure Password Checkup

Credit by Google Security Blog



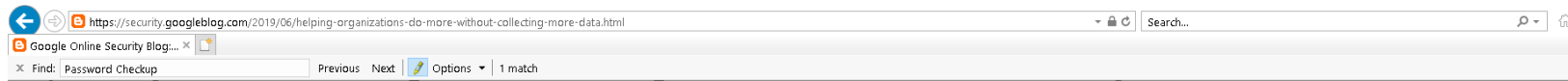
Password Checkup, a Chrome extension that helps users detect if a username and password they enter on a website has been compromised.

Google Password Checkup



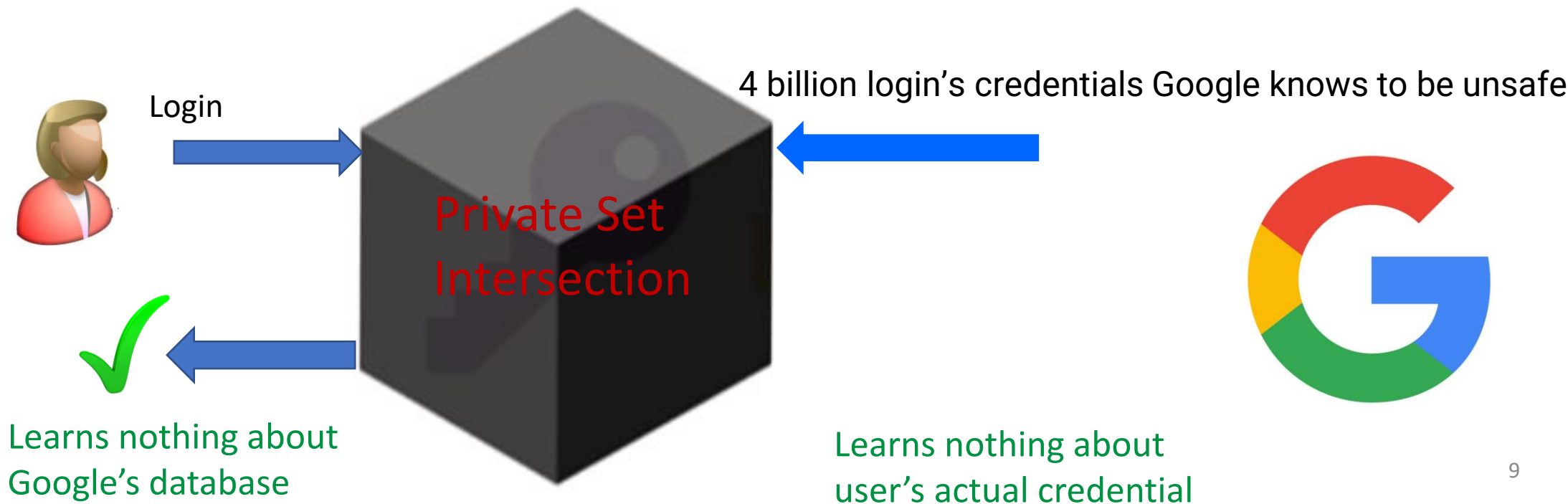
Secure Password Checkup

Credit by Google Security Blog



Password Checkup, a Chrome extension that helps users detect if a username and password they enter on a website has been compromised. It relies on a cryptographic protocol known as **private set intersection (PSI)** to match your login's credentials against an encrypted database of over 4 billion credentials Google knows to be unsafe. At the same time, it ensures that no one – including Google – ever learns your actual credentials.

Google Password Checkup



“Applied” Cryptography

3. Advanced/applied cryptography (10 lectures):

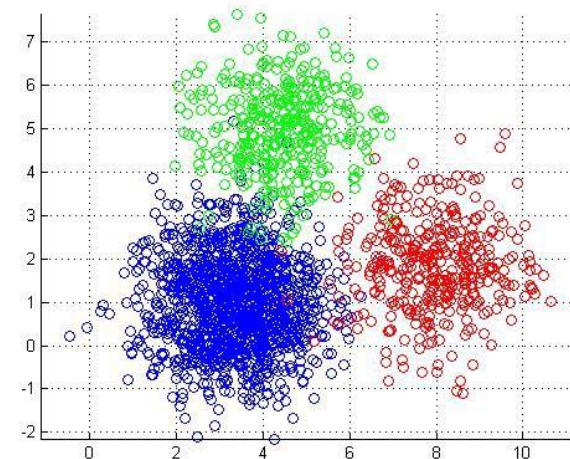
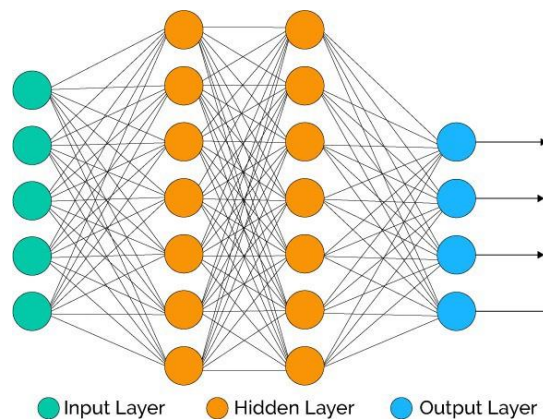
- Multi-party secure computation (2)
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- Privacy-preserving machine learning (2 lectures)
- Private database query (1 lecture)
- Other practical problems (1 lecture)

4. Final project presentations (8 lectures)

- ~~Secure Password Checkup~~
- Privacy Preserving Machine Learning

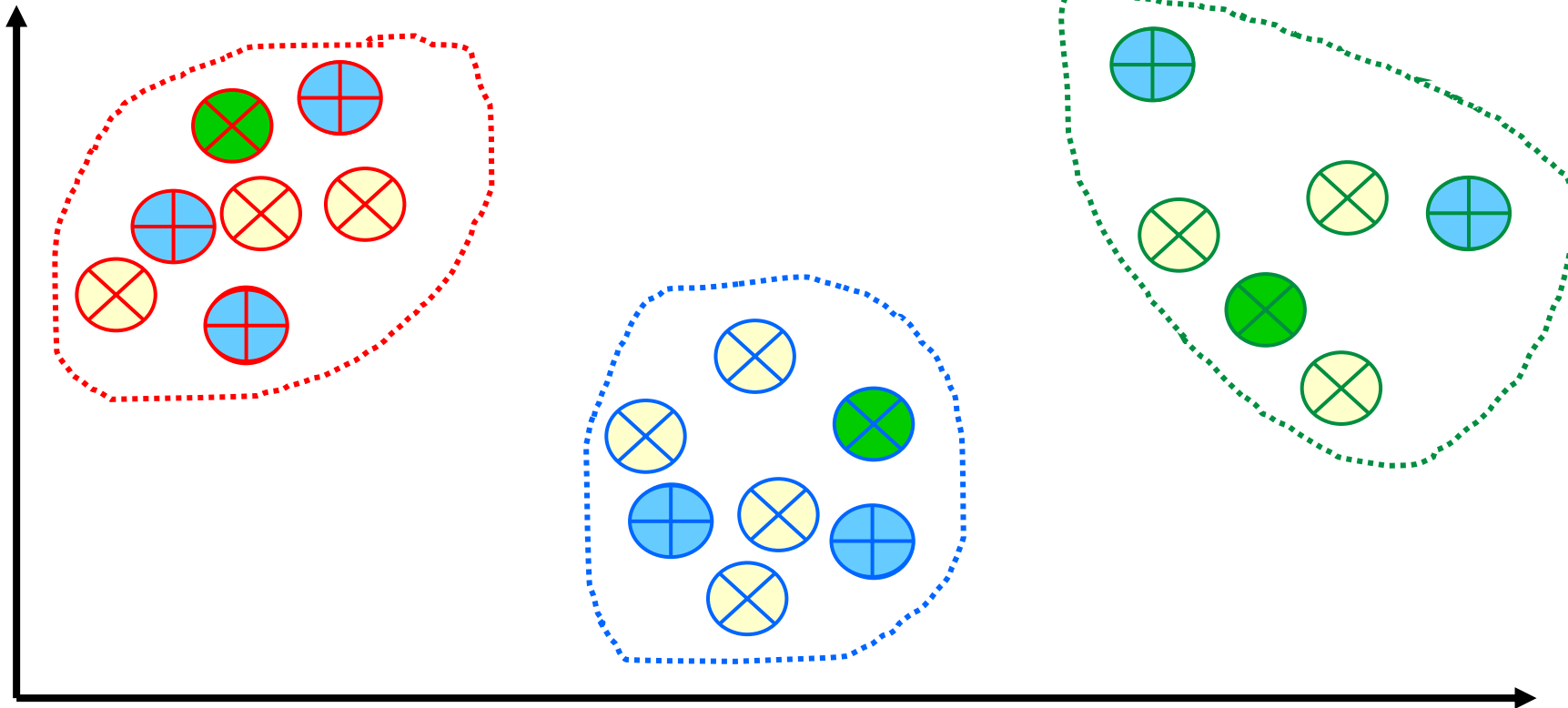
What is Machine Learning (ML)?

- “Machine learning (ML) is the study of computer algorithms that improve automatically through experience. It is seen as a subset of artificial intelligence. Machine learning algorithms build a model based on sample data, known as "training data", in order to make predictions or decisions without being explicitly programmed to do so.” (source: https://en.wikipedia.org/wiki/Machine_learning)



Why need Secure Computation for ML?

- ML is data hungry
- Data comes from different sources
- E.g. Fraud Detection
- Privacy concern



Privacy Preserving ML Model



Trans. records

Batch Reference Number 9809970041 on 4/10/2012				
136	\$14.38	SALE	VISA	4313*****9029
160	\$16.21	SALE	VISA	4764*****6518
\$30.59		Batch Total		
Batch Reference Number 9809970040 on 4/10/2012				
85	\$5.81	SALE	VISA	4117*****6429
160	\$16.99	SALE	VISA	4266*****0764
208	\$6.99	SALE	VISA	4734*****6228
237	\$7.47	SALE	MC	5262*****3045
\$37.26		Batch Total		
Batch Reference Number 9809970037 on 4/10/2012				
35	\$9.60	SALE	VISA	4029*****4160
70	\$4.99	SALE	VISA	4147*****6199
160	\$4.78	SALE	MC	5262*****2319
177	\$91.42	SALE	MC	5410*****9928



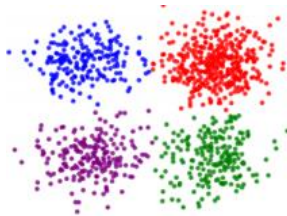
Server



Training



Model



Batch Reference Number 9809970041 on 4/10/2012				
136	\$14.38	SALE	VISA	4313*****9029
160	\$16.21	SALE	VISA	4764*****6518
\$30.59		Batch Total		
Batch Reference Number 9809970040 on 4/10/2012				
85	\$5.81	SALE	VISA	4117*****6429
160	\$16.99	SALE	VISA	4266*****0764
208	\$6.99	SALE	VISA	4734*****6228
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\$37.26		Batch Total		
Batch Reference Number 9809970037 on 4/10/2012				
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70	\$4.99	SALE	VISA	4147*****6199
160	\$4.78	SALE	MC	5262*****2319
177	\$91.42	SALE	MC	5410*****9928



Batch Reference Number 9809970041 on 4/10/2012				
136	\$14.38	SALE	VISA	4313*****9029
160	\$16.21	SALE	VISA	4764*****6518
\$30.59		Batch Total		
Batch Reference Number 9809970040 on 4/10/2012				
85	\$5.81	SALE	VISA	4117*****6429
160	\$16.99	SALE	VISA	4266*****0764
208	\$6.99	SALE	VISA	4734*****6228
237	\$7.47	SALE	MC	5262*****3045
\$37.26		Batch Total		
Batch Reference Number 9809970037 on 4/10/2012				
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70	\$4.99	SALE	VISA	4147*****6199
160	\$4.78	SALE	MC	5262*****2319
177	\$91.42	SALE	MC	5410*****9928

Privacy Preserving ML Model

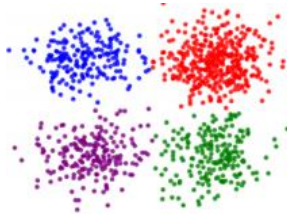


Trans. records

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208	\$6.99	SALE	VISA	4734*****6228
237	\$7.47	SALE	MC	5262*****3045
\$37.26		Batch Total		
Batch Reference Number 9809970037 on 4/10/2012				
35	\$9.60	SALE	VISA	4029*****4160
70	\$4.99	SALE	VISA	4147*****6199
160	\$4.78	SALE	MC	5262*****2319
177	\$91.42	SALE	MC	5419*****9928



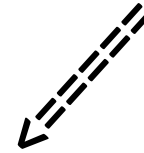
Model



Server



Training



Batch Reference Number 9809970041 on 4/10/2012				
136	\$14.38	SALE	VISA	4313*****9029
160	\$16.21	SALE	VISA	4744*****6518
\$30.59		Batch Total		
Batch Reference Number 9809970040 on 4/10/2012				
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208	\$6.99	SALE	VISA	4734*****6228
237	\$7.47	SALE	MC	5262*****3045
\$37.26		Batch Total		
Batch Reference Number 9809970037 on 4/10/2012				
35	\$9.60	SALE	VISA	4029*****4160
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160	\$4.78	SALE	MC	5262*****2319
177	\$91.42	SALE	MC	5419*****9928



Batch Reference Number 9809970041 on 4/10/2012				
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160	\$16.21	SALE	VISA	4744*****6518
\$30.59		Batch Total		
Batch Reference Number 9809970040 on 4/10/2012				
85	\$5.81	SALE	VISA	4117*****6429
160	\$16.99	SALE	VISA	4266*****0764
208	\$6.99	SALE	VISA	4734*****6228
237	\$7.47	SALE	MC	5262*****3045
\$37.26		Batch Total		
Batch Reference Number 9809970037 on 4/10/2012				
35	\$9.60	SALE	VISA	4029*****4160
70	\$4.99	SALE	VISA	4147*****6199
160	\$4.78	SALE	MC	5262*****2319
177	\$91.42	SALE	MC	5419*****9928

What if the server is malicious?

Privacy Preserving ML Model



Trans. records

Batch Reference Number	9098070041	on	4/17/2012
128	\$4.58	SALE	VISA 4022*****9029
160	\$16.21	SALE	VISA 4744*****6518
Batch Total \$20.79			
Batch Reference Number	9098070040	on	4/17/2012
83	\$9.81	SALE	VISA 4117*****429
160	\$16.99	SALE	VISA 4266*****0764
208	\$6.99	SALE	VISA 4794*****0228
227	\$7.47	SALE	MC 5262*****0945
Batch Total \$49.26			
Batch Reference Number	9098070047	on	4/17/2012
72	\$9.00	SALE	VISA 4022*****1100
79	\$4.99	SALE	VISA 4147*****0199
160	\$4.78	SALE	MC 5262*****2319
177	\$95.43	SALE	MC 5410*****0928

$Enc(k,m)$
=====>

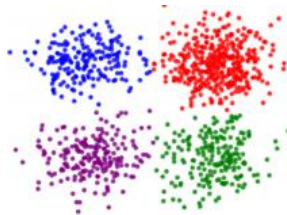


Training on encr.

Server



Model

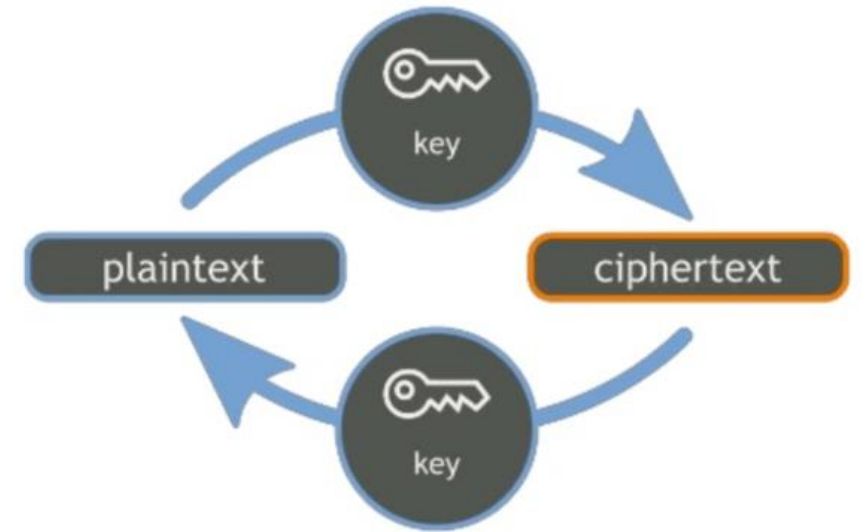


$Dec(k,c)$
=====<



Encrypted model

- $Enc(k, m) = c$
- $Dec(k, c) = m$
- $f(Enc(k, m)) = Enc(k, f(m))$



Privacy Preserving ML Model

Bank of America.



Trans. records

Batch Reference Number	9098070041	on	4/17/2012
128	\$4.58	SALE	VISA 4022*****9029
160	\$16.21	SALE	VISA 4744*****5018
Batch Total \$20.79			
Batch Reference Number	9098070040	on	4/17/2012
85	\$9.81	SALE	VISA 4117*****4295
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227	\$7.47	SALE	MC 5262*****3945
Batch Total \$53.26			
Batch Reference Number	9098070007	on	4/17/2012
72	\$9.00	SALE	VISA 4022*****1100
79	\$4.99	SALE	VISA 4147*****0199
160	\$4.78	SALE	MC 5262*****2319
177	\$95.43	SALE	MC 5409*****0928

$Enc(k,m)$
=====>

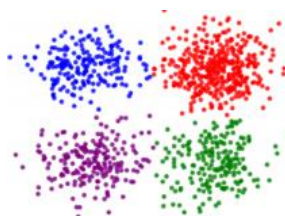


Training on encr.

Server



Model



$Dec(k,c)$
=====<



Encrypted model

Expensive solution because of 1) training on encrypted data
2) requiring different keys

Privacy Preserving ML Model

Bank of America



usbank

Trans. records

Batch Reference Number 98091070041 on 4/19/2012				
136	\$14.38	SALE	VISA	4313*****9029
160	\$18.23	SALE	VISA	4744*****9018
Batch Total				
85	\$36.59			
Batch Reference Number 9809130040 on 4/19/2012				
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237	\$7.47	SALE	MC	5262*****3945
Batch Total				
489	\$37.26			
Batch Reference Number 98080797007 on 4/19/2012				
35	\$9.60	SALE	VISA	4029*****4160
79	\$4.99	SALE	VISA	4141*****7639
160	\$4.78	SALE	MC	5262*****2319
177	\$91.42	SALE	MC	5419*****9008

=



+



server



server



Two-party secure computation

model

