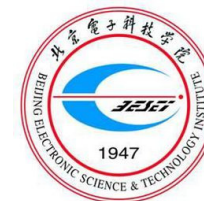


# APDM2017 (IJCAI2017 workshop36)



## Privacy Preserving Face Retrieval in the Cloud for Mobile Users

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<http://kislab.besti.edu.cn/victory/>



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官方微信



# Outline

1

**Motivation**

2

**Related Work**

3

**Privacy Preserving Face Retrieval**

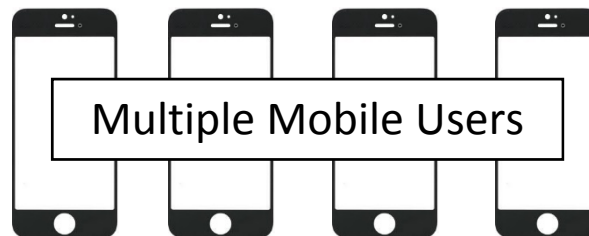
4

**Experimental Results**

5

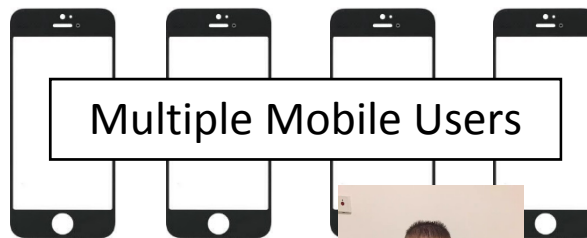
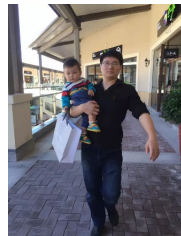
**Conclusion and Discussion**

# Motivation

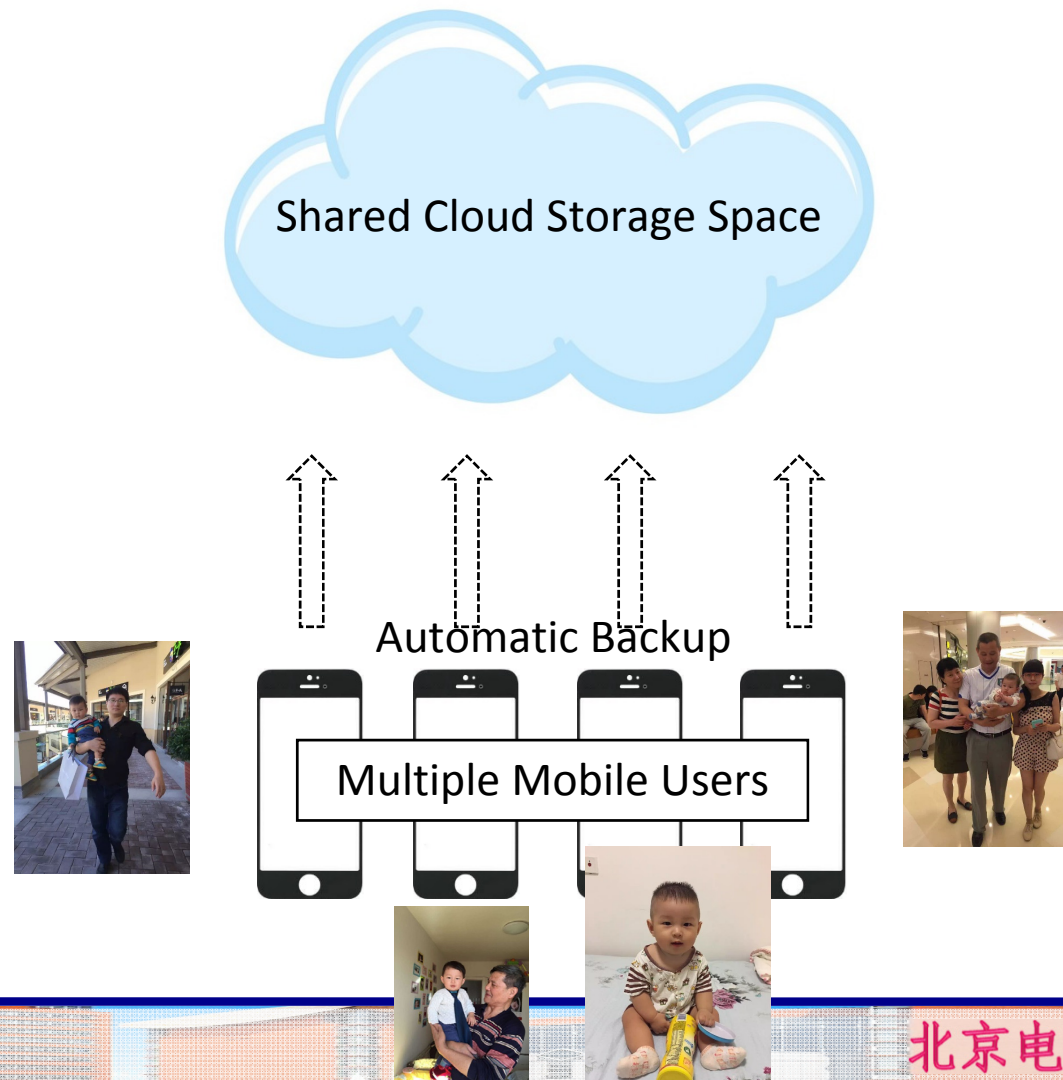


# Motivation

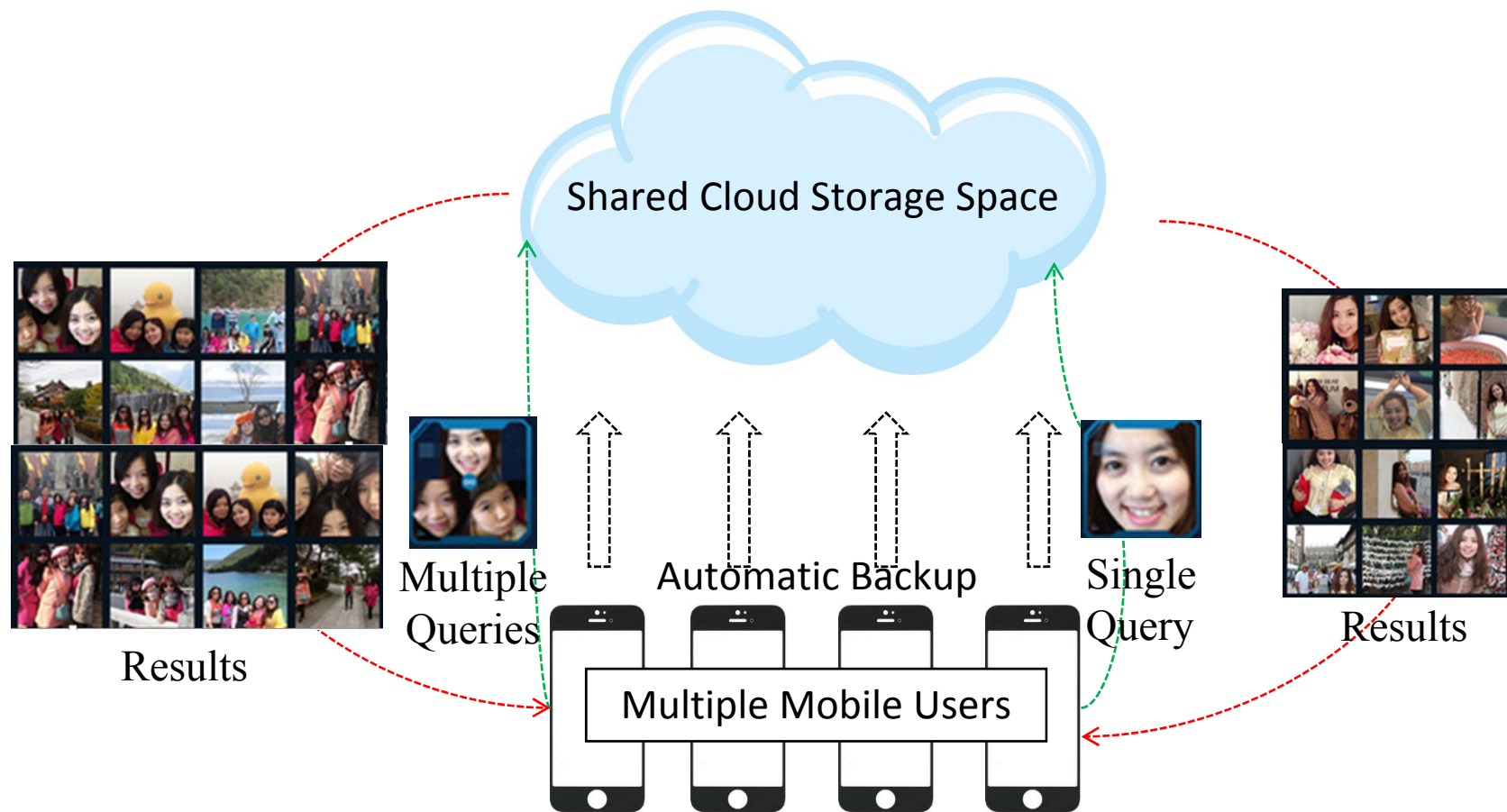
Shared Cloud Storage Space



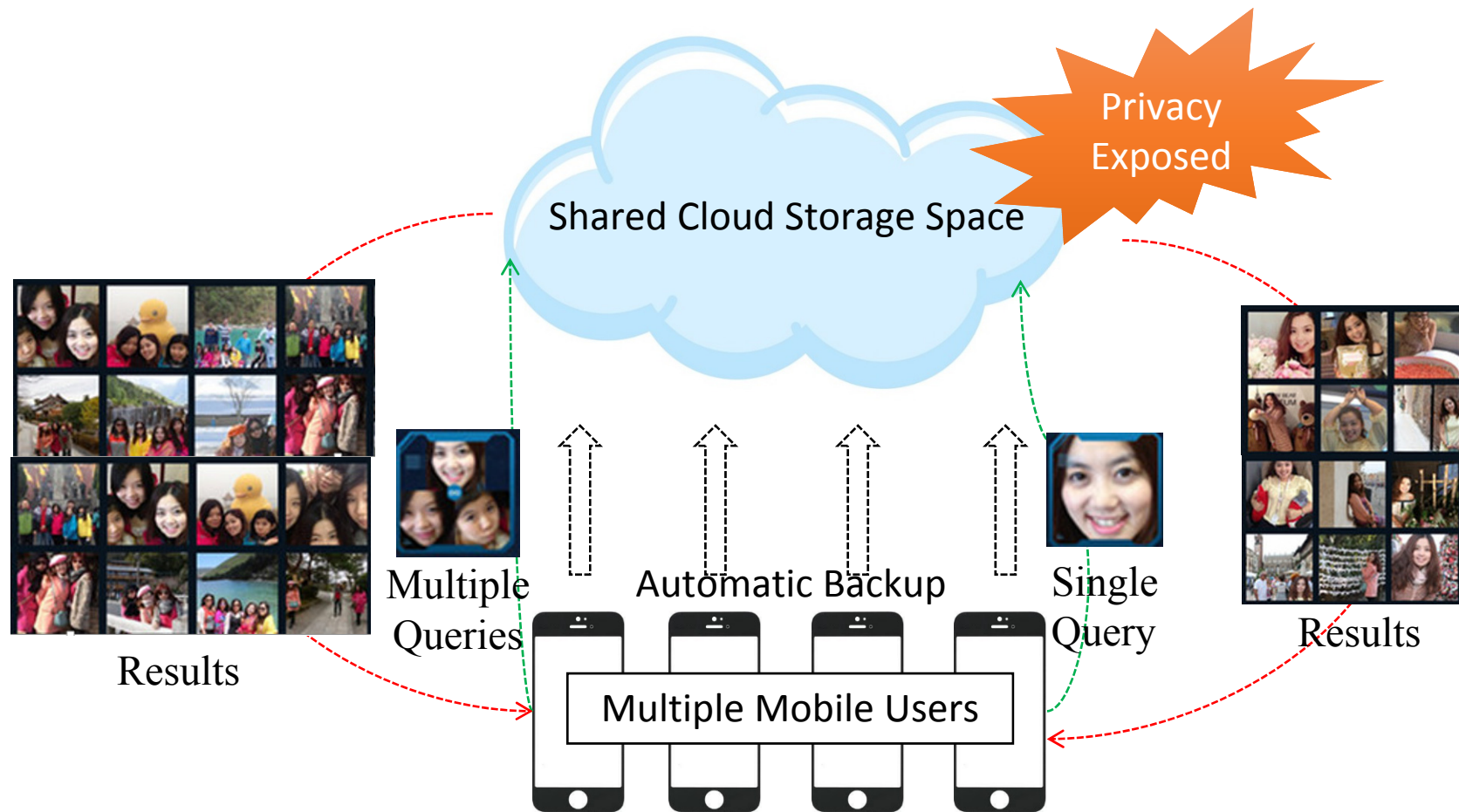
# Motivation



# Motivation



# Motivation



# Outline

1

**Motivation**

2

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**Privacy Preserving Face Retrieval**

4

**Experimental Results**

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**Conclusion and Discussion**



## Related Work

- **First Blind Vision: Secure Face Detection** [Avidan and Butman, 2006] [Jin et al., 2017]
- **Secure Face Identification (SCiFI)** [Osadchy et al., 2010]
- **Secure CBIR** [Shashank et al., 2008] [Fanti et al., 2013]
- **Secure Video Surveillance** [Upmanyu et al., 2009][Sohn et al., 2010] [Chu et al., 2014] [Jin et al., 2015; 2016a; 2016b]
- **Secure Machine Learning** [Bost et al., 2015]

# Outline

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**Privacy Preserving Face Retrieval**

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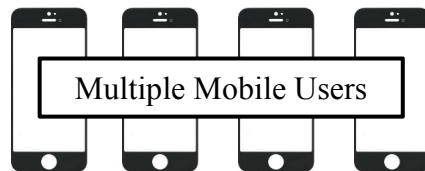
**Experimental Results**

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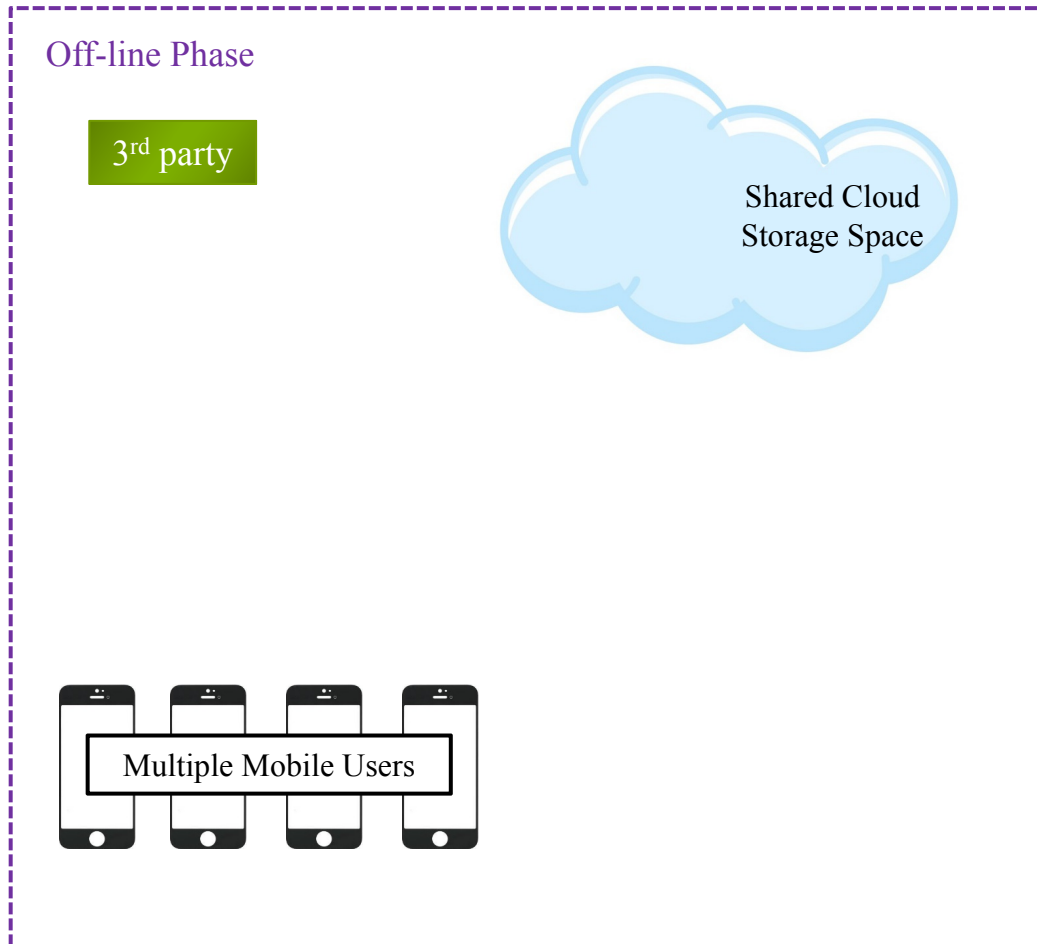
**Conclusion and Discussion**

# Privacy Preserving Face Retrieval Protocol

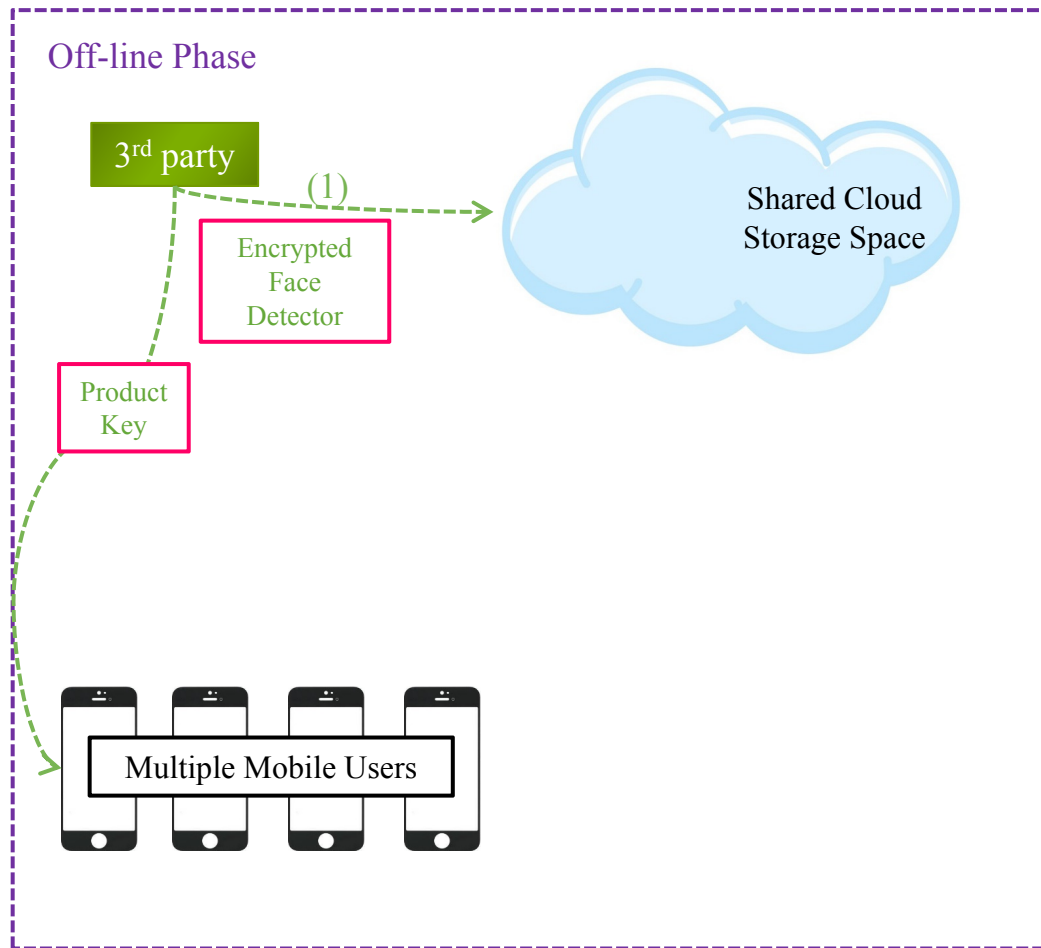
3<sup>rd</sup> party



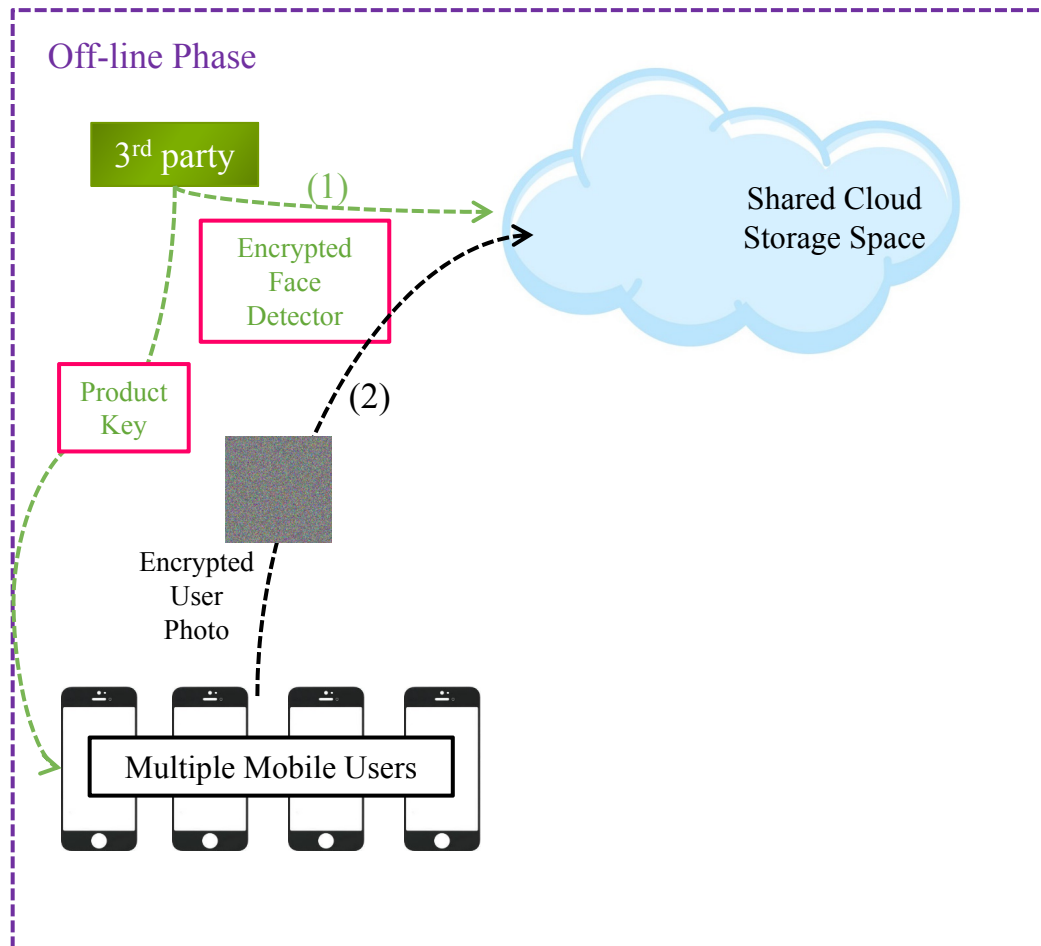
# Privacy Preserving Face Retrieval Protocol



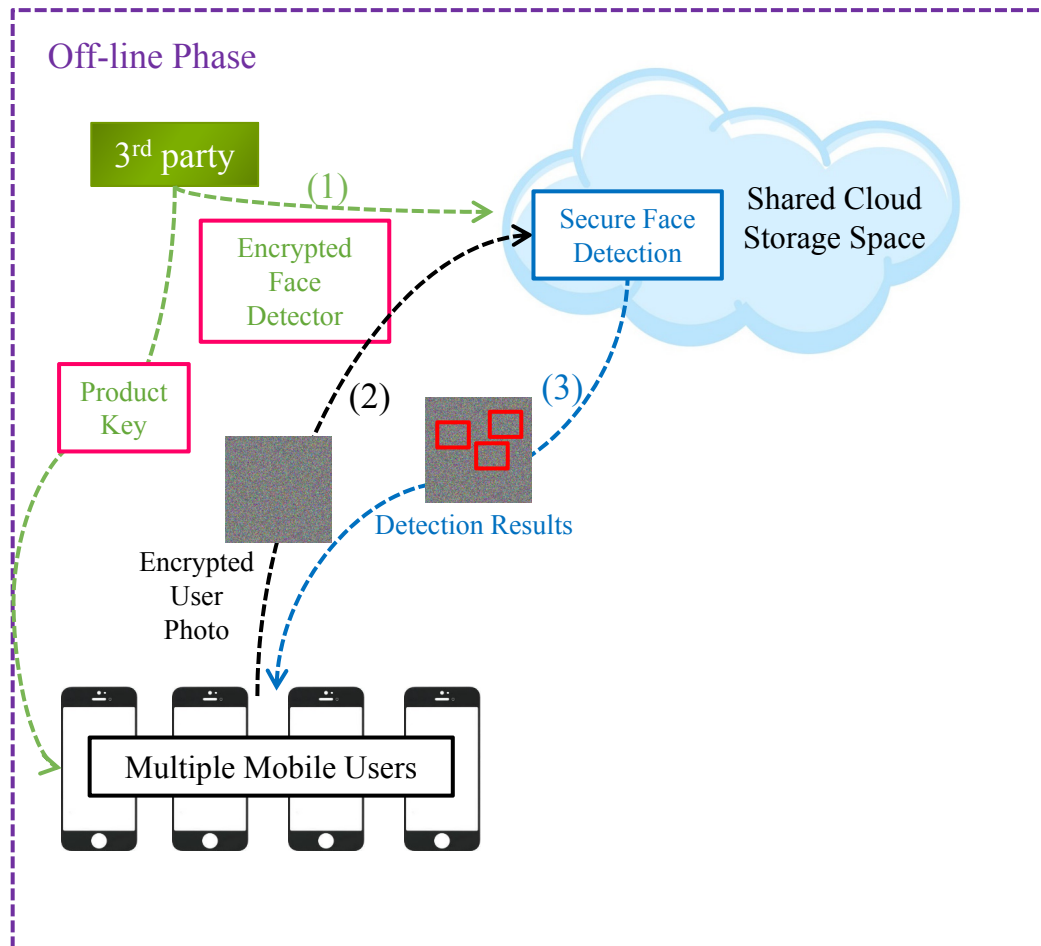
# Privacy Preserving Face Retrieval Protocol



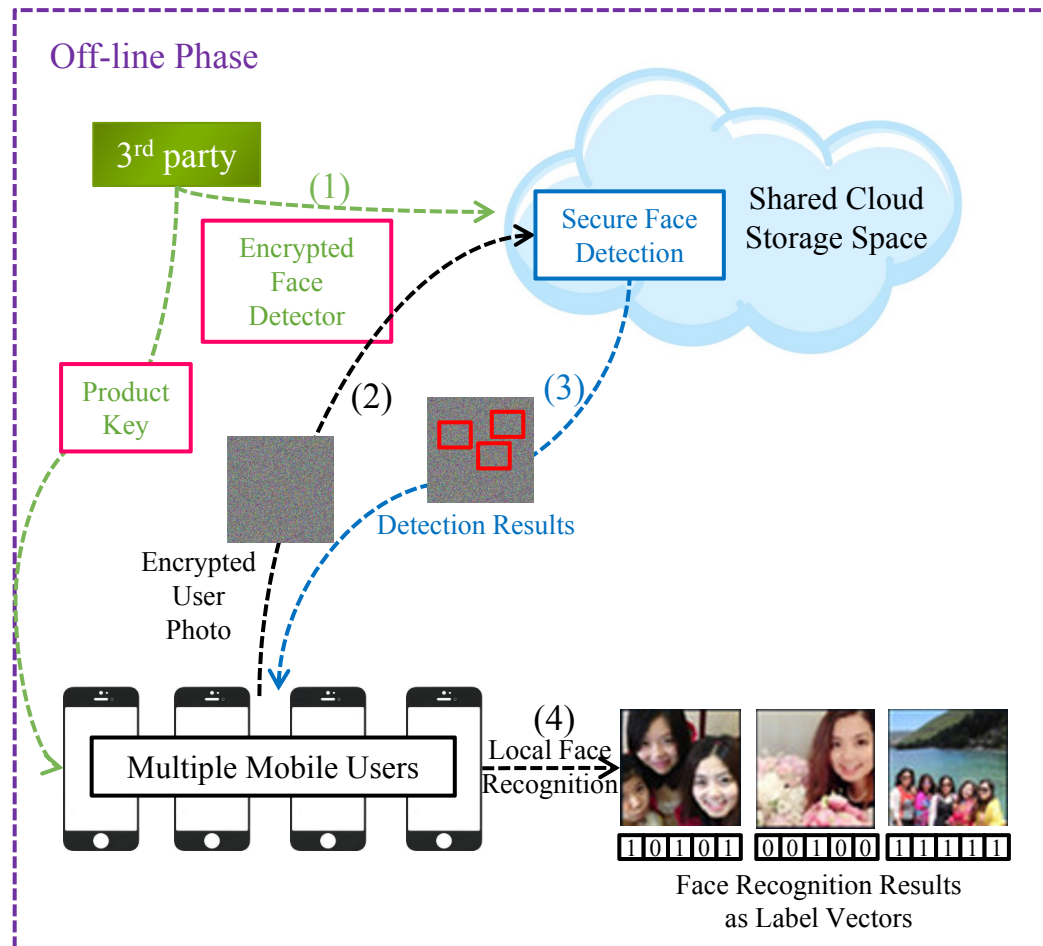
# Privacy Preserving Face Retrieval Protocol



# Privacy Preserving Face Retrieval Protocol

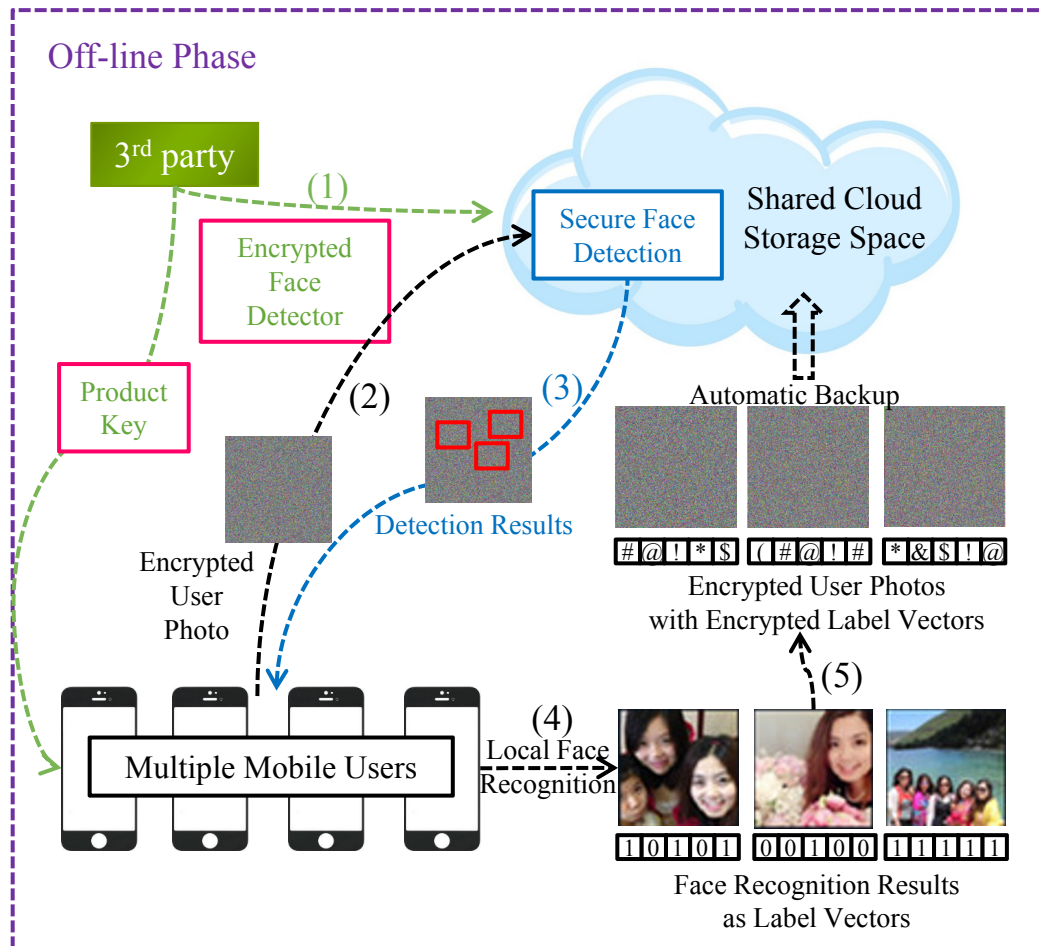


# Privacy Preserving Face Retrieval Protocol

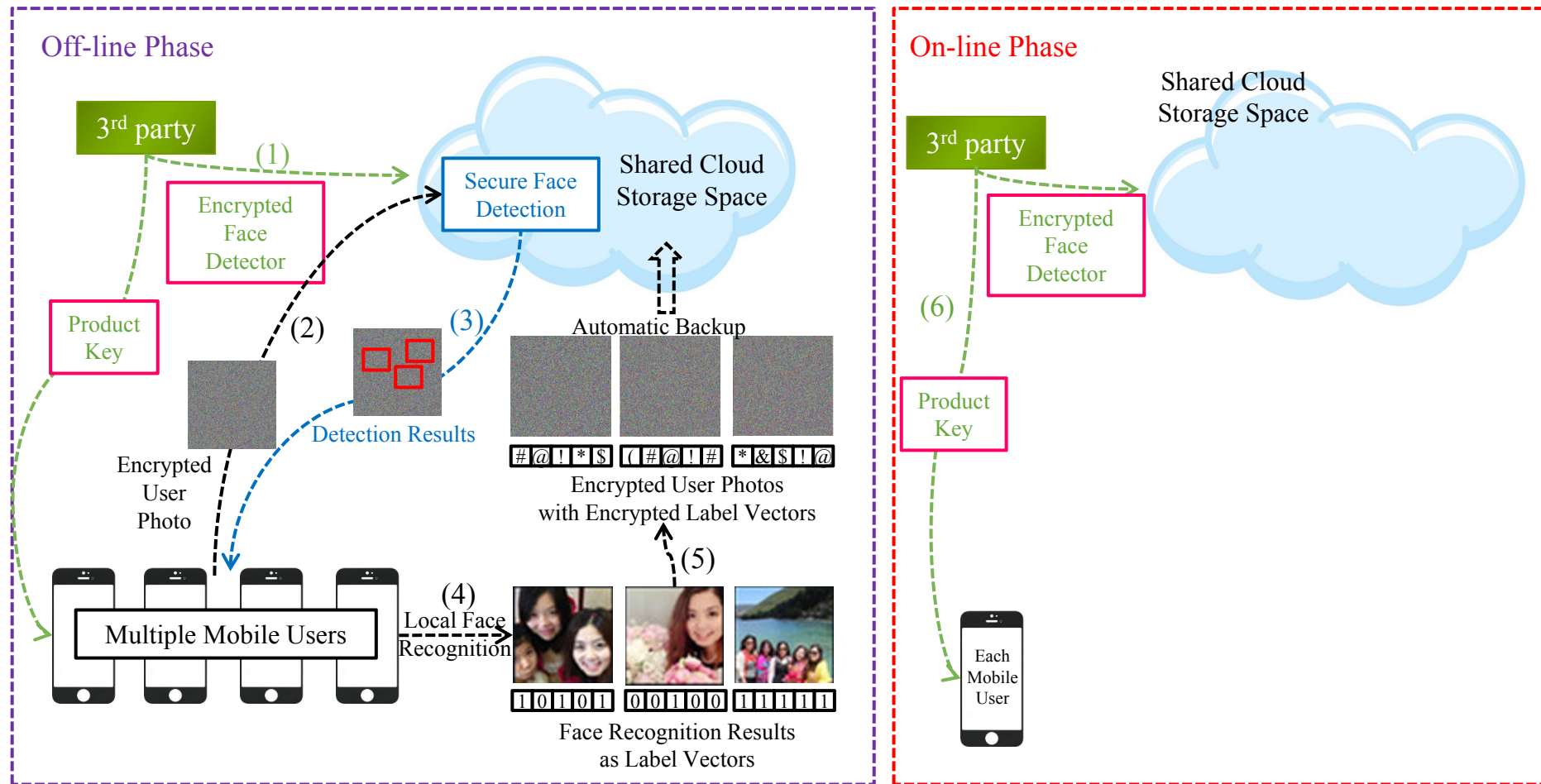




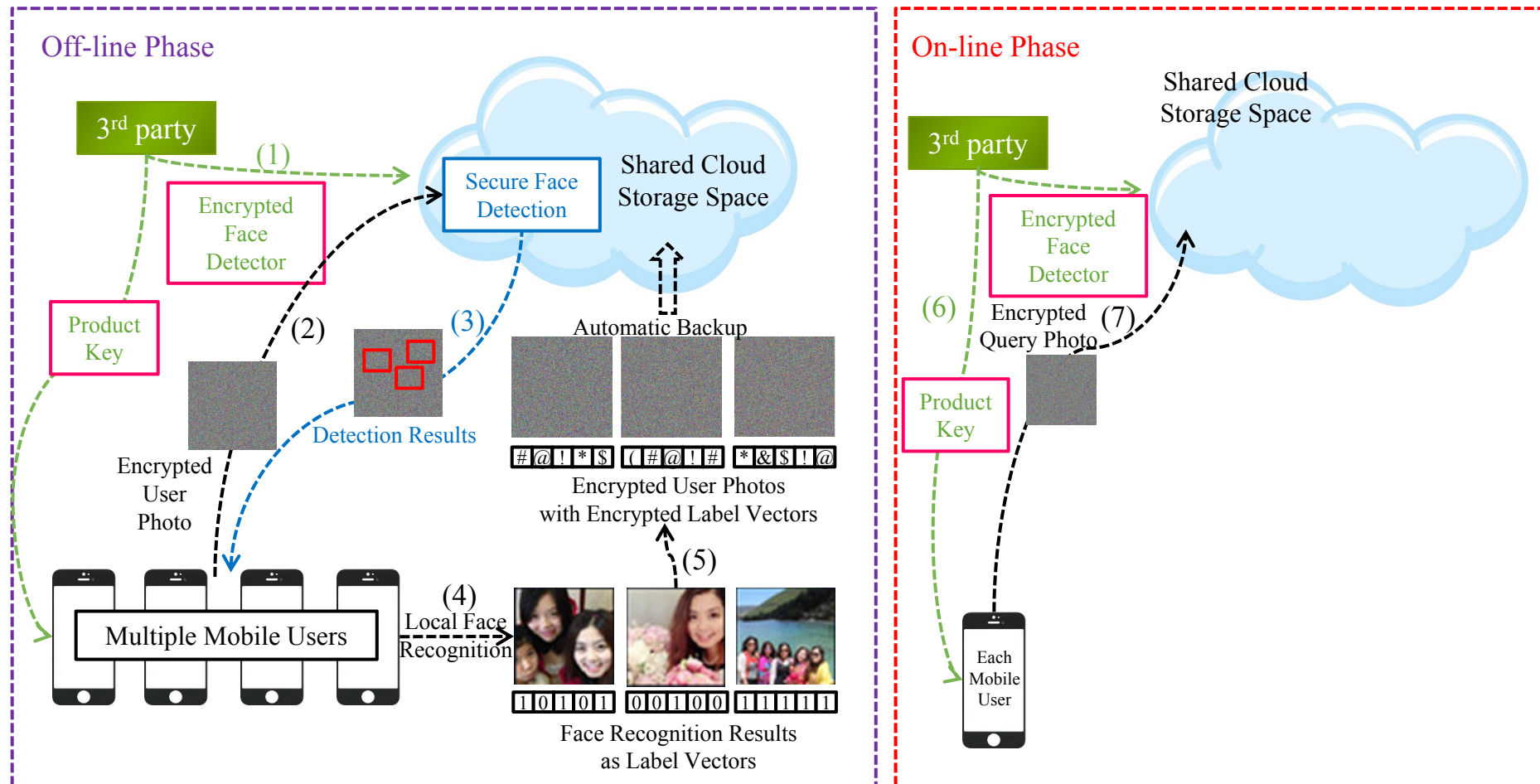
# Privacy Preserving Face Retrieval Protocol



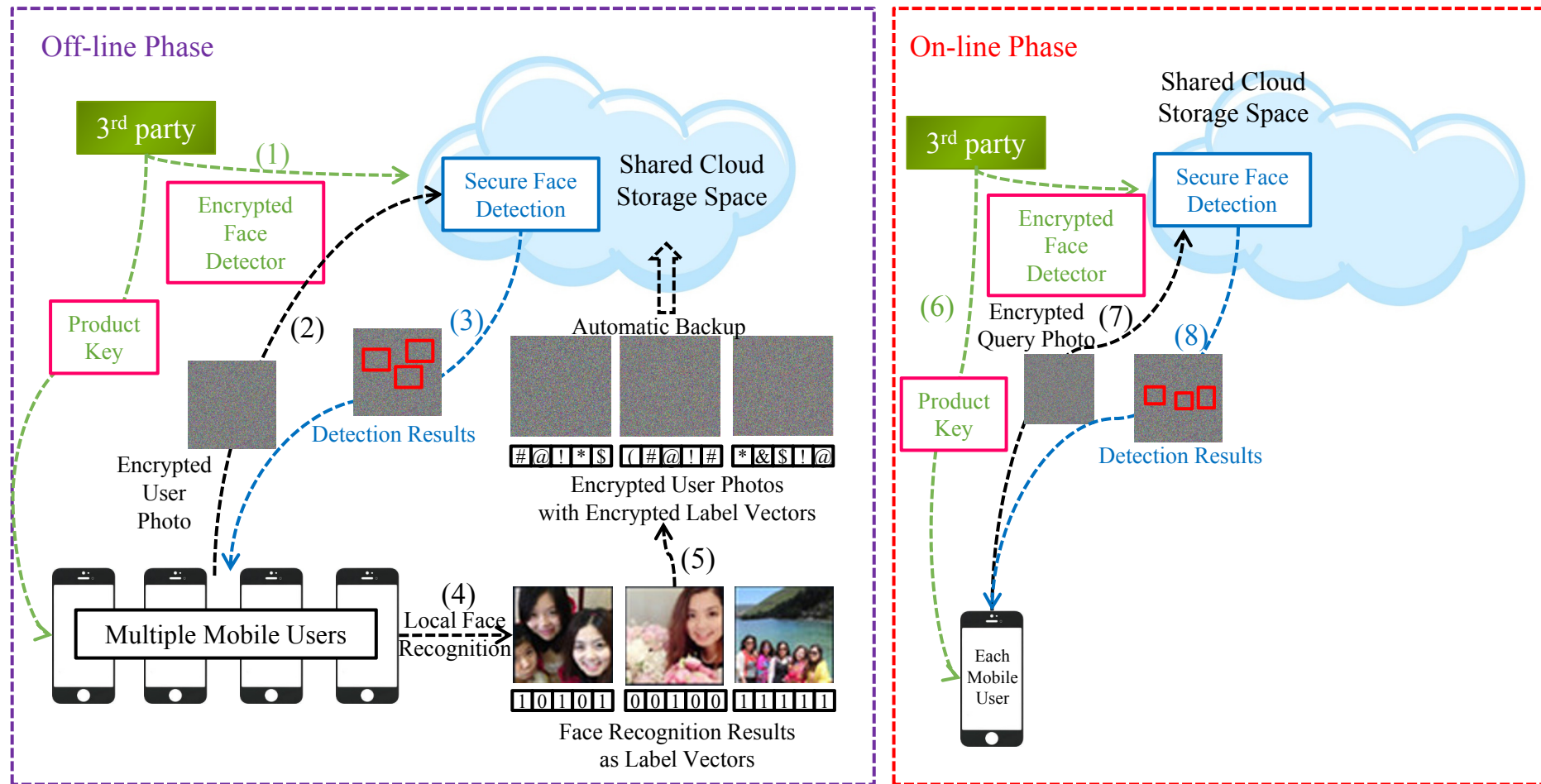
# Privacy Preserving Face Retrieval Protocol



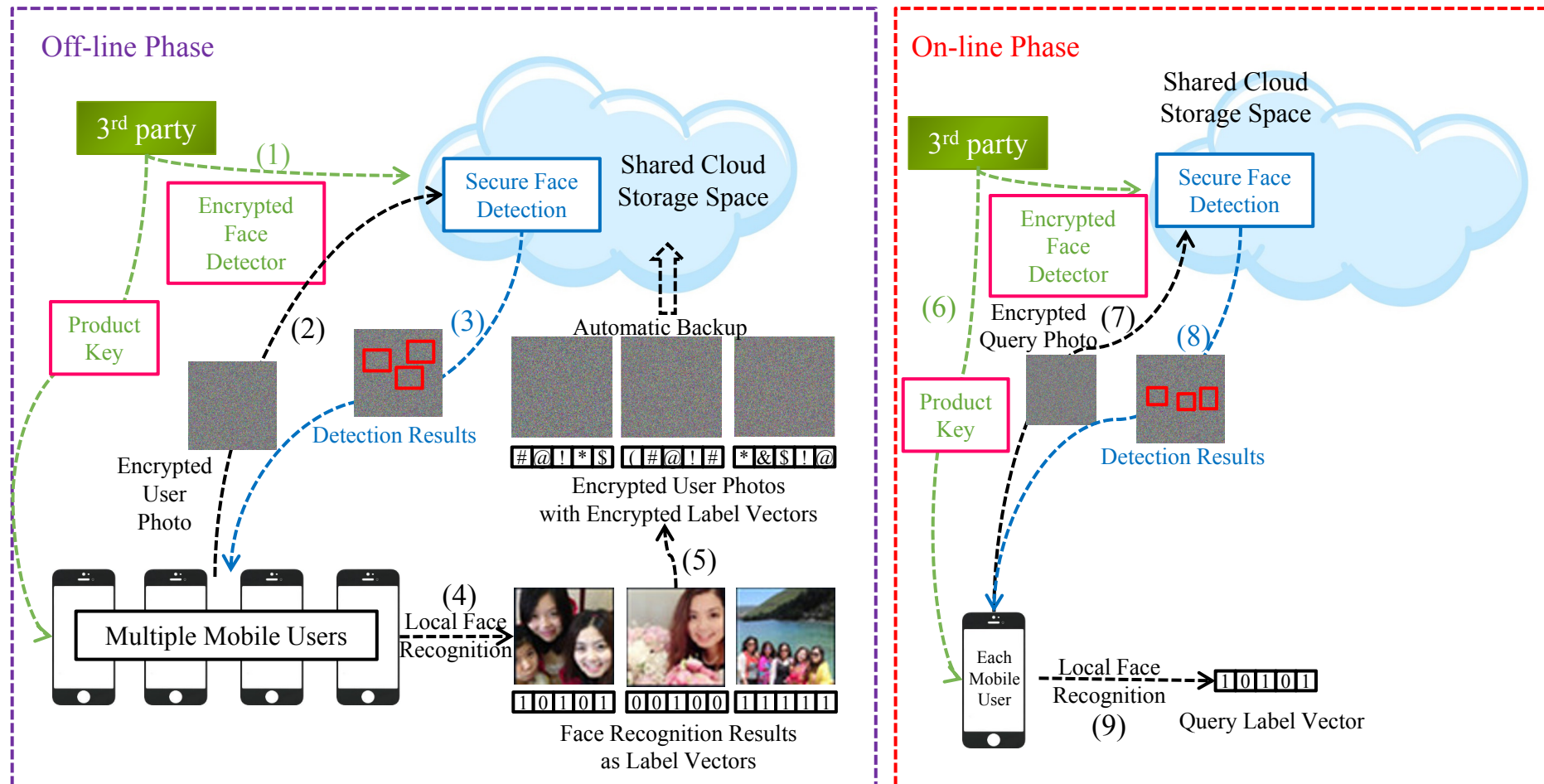
# Privacy Preserving Face Retrieval Protocol



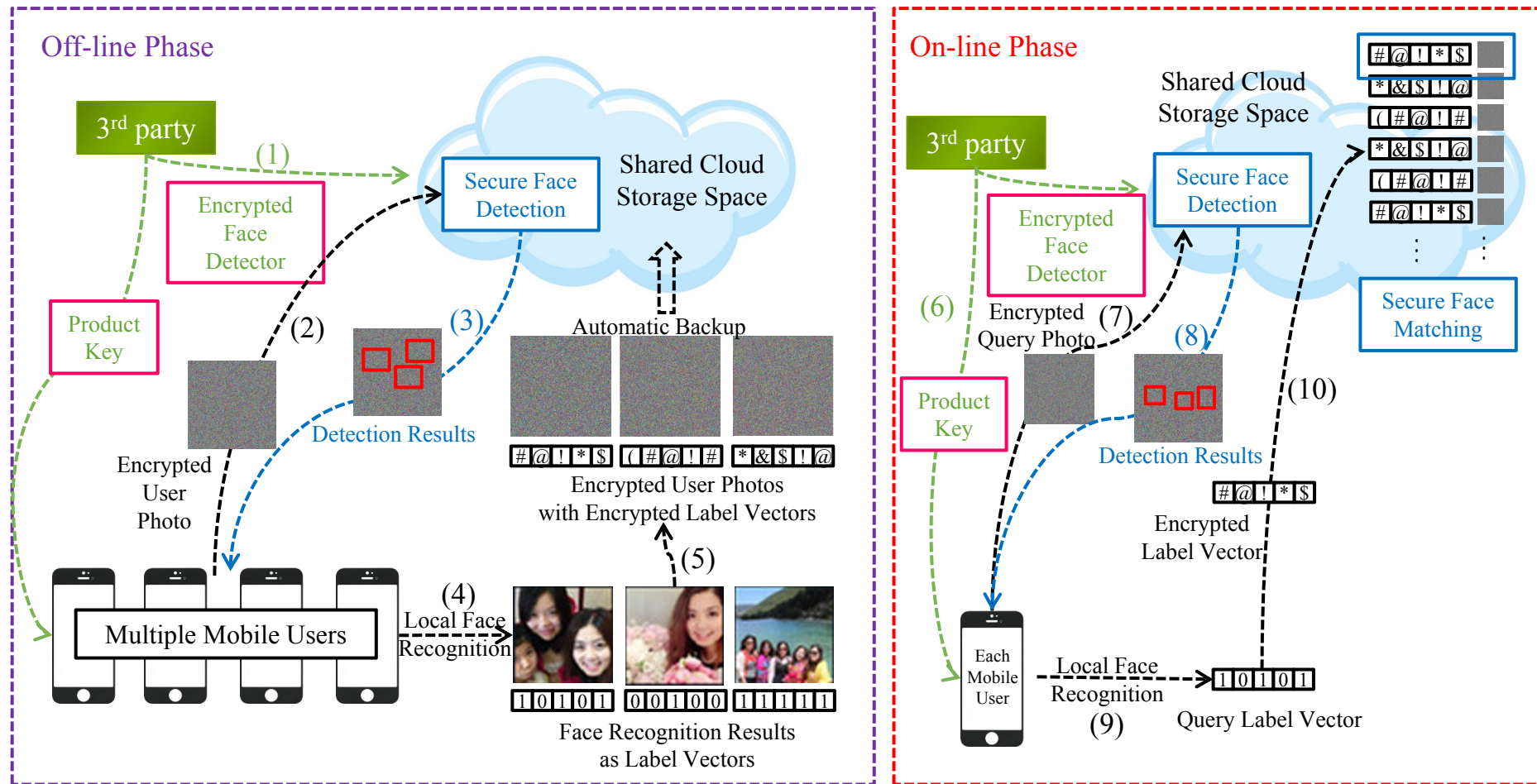
# Privacy Preserving Face Retrieval Protocol



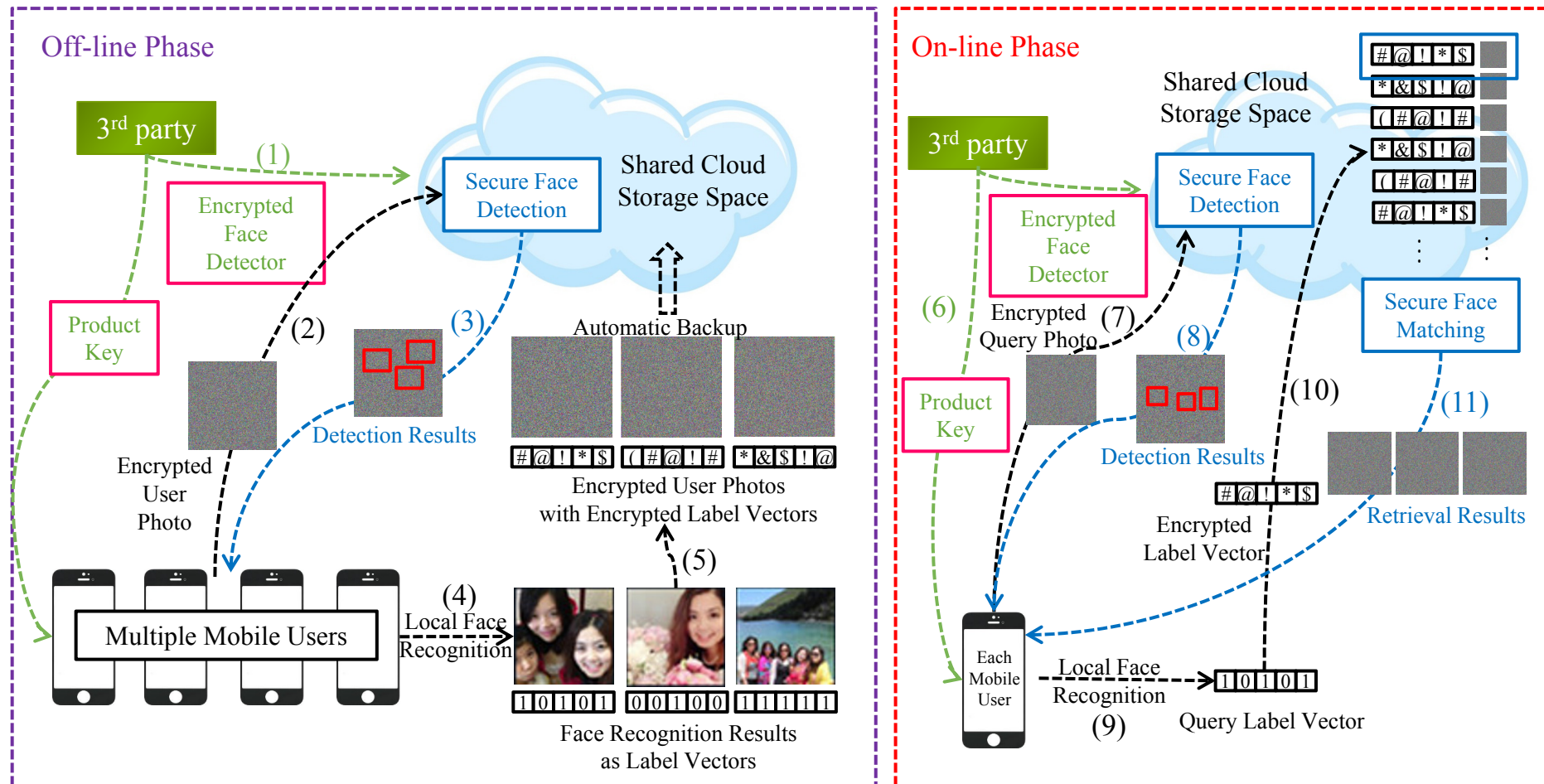
# Privacy Preserving Face Retrieval Protocol



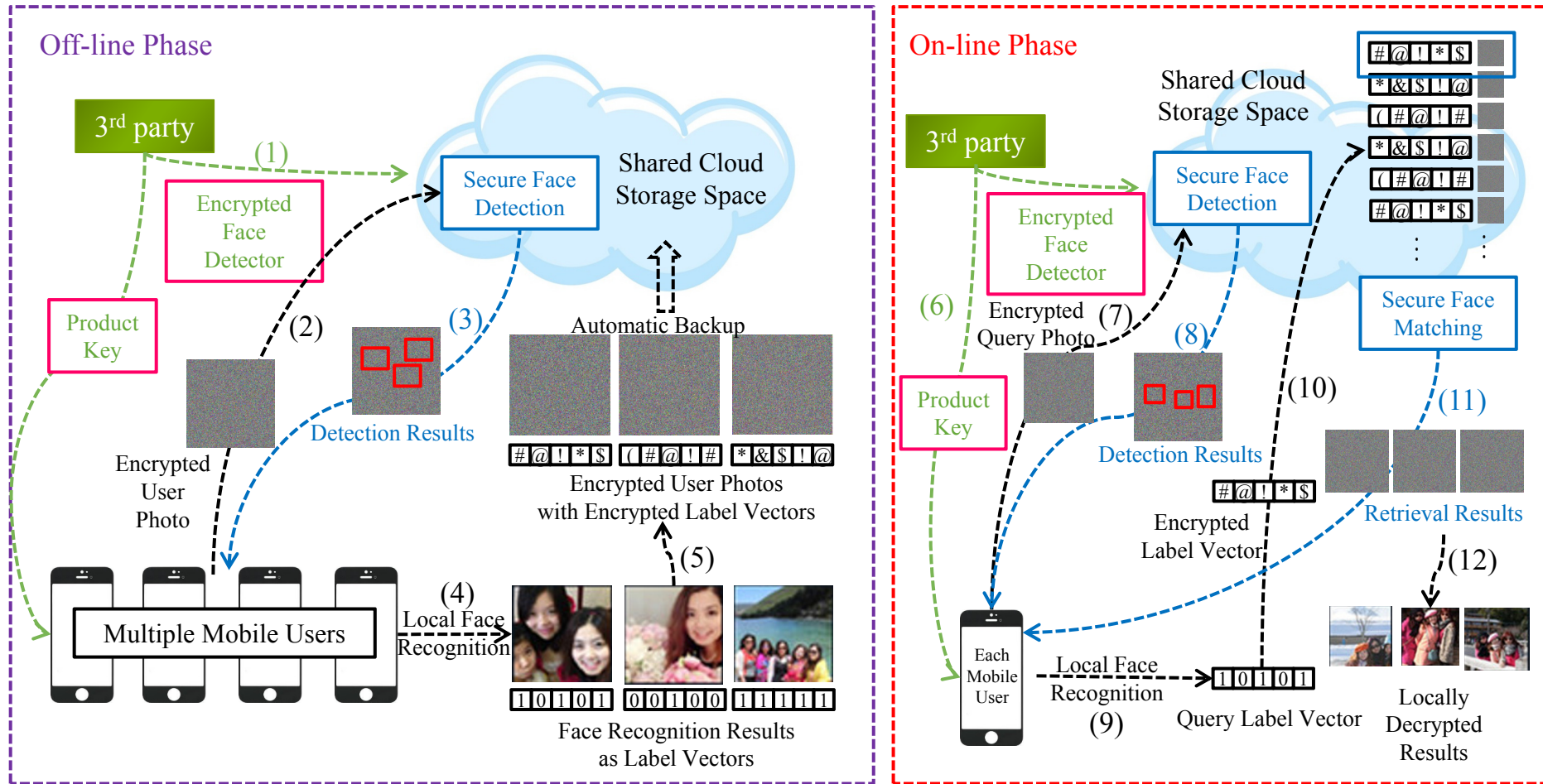
# Privacy Preserving Face Retrieval Protocol



# Privacy Preserving Face Retrieval Protocol



# Privacy Preserving Face Retrieval Protocol





# Privacy Preserving Face Retrieval Protocol

- Face Detection
- Face Recognition and Label Vector
- Face Label Matching

**Traditional  
Face Retrieval**

# Privacy Preserving Face Retrieval Protocol

- Face Detection
- Face Recognition and Label Vector
- Face Label Matching

**Traditional  
Face Retrieval**

**Weak Classifier**

**Viola & Jones  
Face Detector**

$$h_n(x) = \begin{cases} \alpha_n & \text{if } x^T y_n > \theta_t \\ \beta_n & \text{otherwise} \end{cases}$$

**Inner  
Production**

**Strong Classifier**

$$H(\mathbf{x}) = \text{sign}\left(\sum_{n=1}^N h_n(\mathbf{x})\right)$$

[Viola and Jones, 2004] Paul A. Viola and Michael J. Jones. Robust real-time face detection. International Journal of Computer Vision, 57(2):137–154, 2004.

# Privacy Preserving Face Retrieval Protocol

- Face Detection
- Face Recognition and Label Vector
- Face Label Matching

**Traditional  
Face Retrieval**

Number of  
persons in the  
query photo:

**3**



$$\left( \begin{bmatrix} 0 & 0 & 1 & 1 & 1 \\ 1 & 1 & 0 & 1 & 1 \end{bmatrix} \cdot \begin{bmatrix} 1 & 1 & 0 & 1 & 1 \end{bmatrix} \right)$$

=1 (NOT Matching)



$$\left( \begin{bmatrix} 0 & 0 & 1 & 1 & 1 \\ 0 & 0 & 1 & 1 & 1 \end{bmatrix} \cdot \begin{bmatrix} 0 & 0 & 1 & 1 & 1 \end{bmatrix} \right)$$

=3 (Matching)

**Inner Production**

# Privacy Preserving Face Retrieval Protocol

- Face Detection
- Face Recognition and Label Vector
- Face Label Matching



**Traditional  
Face Retrieval**

+

**Secure Inner Production**

||

- **Secure** Face Detection
- Face Recognition and Label Vector
- **Secure** Face Label Matching



**Privacy Preserving  
Face Retrieval**

# Privacy Preserving Face Retrieval Protocol

## Secure Inner Production

3<sup>rd</sup> party  
detector

$\mathbf{y}$ 

2	4	6	8	0
---	---	---	---	---

Dimension:  $m$

$\mathbf{w}$ 

8	6	4	0	2
---	---	---	---	---

Dimension:  $m$

User  
image

$$(\mathbf{y} \cdot \mathbf{x}) = \mathbf{y}^T \mathbf{w} = 64$$

# Privacy Preserving Face Retrieval Protocol

## Secure Inner Production

3<sup>rd</sup> party  
detector

$y$ 

2	4	6	8	0
---	---	---	---	---

Dimension:  $m$

$w$ 

8	6	4	0	2
---	---	---	---	---

Dimension:  $m$

User  
image

$$(y \cdot x) = y^T w = 64$$

Keys:  $(M_1, M_2, S)$

$m * m$  invertible matrix

1	0	0	1	0
---	---	---	---	---

random binary vector

Dimension:  $m$

# Privacy Preserving Face Retrieval Protocol

## Secure Inner Production

3<sup>rd</sup> party  
detector  $y$ 

2	4	6	8	0
---	---	---	---	---

  
Dimension:  $m$

$w$ 

8	6	4	0	2
---	---	---	---	---

 User  
image  
Dimension:  $m$

$$(y \cdot x) = y^T w = 64$$

Keys:  $(M_1, M_2, S)$

$$S_i = 1: y'_i = y''_i = y_i$$

$$S_i = 0: y'_i = \left(\frac{1}{2}\right)y_i + r$$

$$y''_i = \left(\frac{1}{2}\right)y_i - r$$

$$S_i = 1: w'_i = w''_i = w_i$$

$$S_i = 0: w'_i = \left(\frac{1}{2}\right)w_i + r$$

$$w''_i = \left(\frac{1}{2}\right)w_i - r$$

$y$ 

2	4	6	8	0
---	---	---	---	---

$S$ 

1	0	0	1	0
---	---	---	---	---

2	2	3	8	0
---	---	---	---	---

 $y'$   
 $r$   $r$   $r$

2	2	3	8	0
---	---	---	---	---

 $y''$

$w'$ 

8	3	2	0	1
---	---	---	---	---

  
 $r$   $r$   $r$

$w''$ 

8	3	2	0	1
---	---	---	---	---

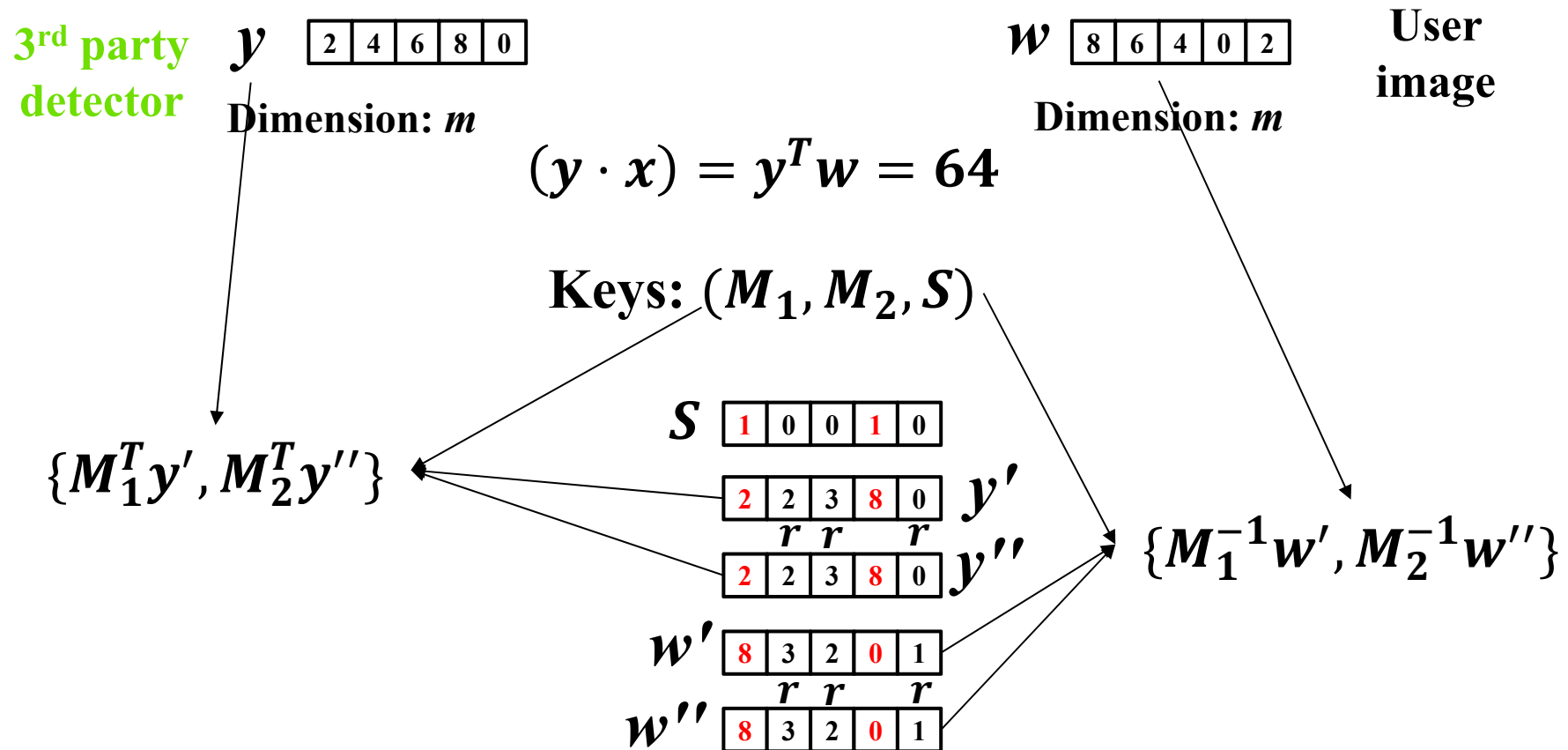
8	6	4	0	2
---	---	---	---	---

 $w$

$r$  is a random number

# Privacy Preserving Face Retrieval Protocol

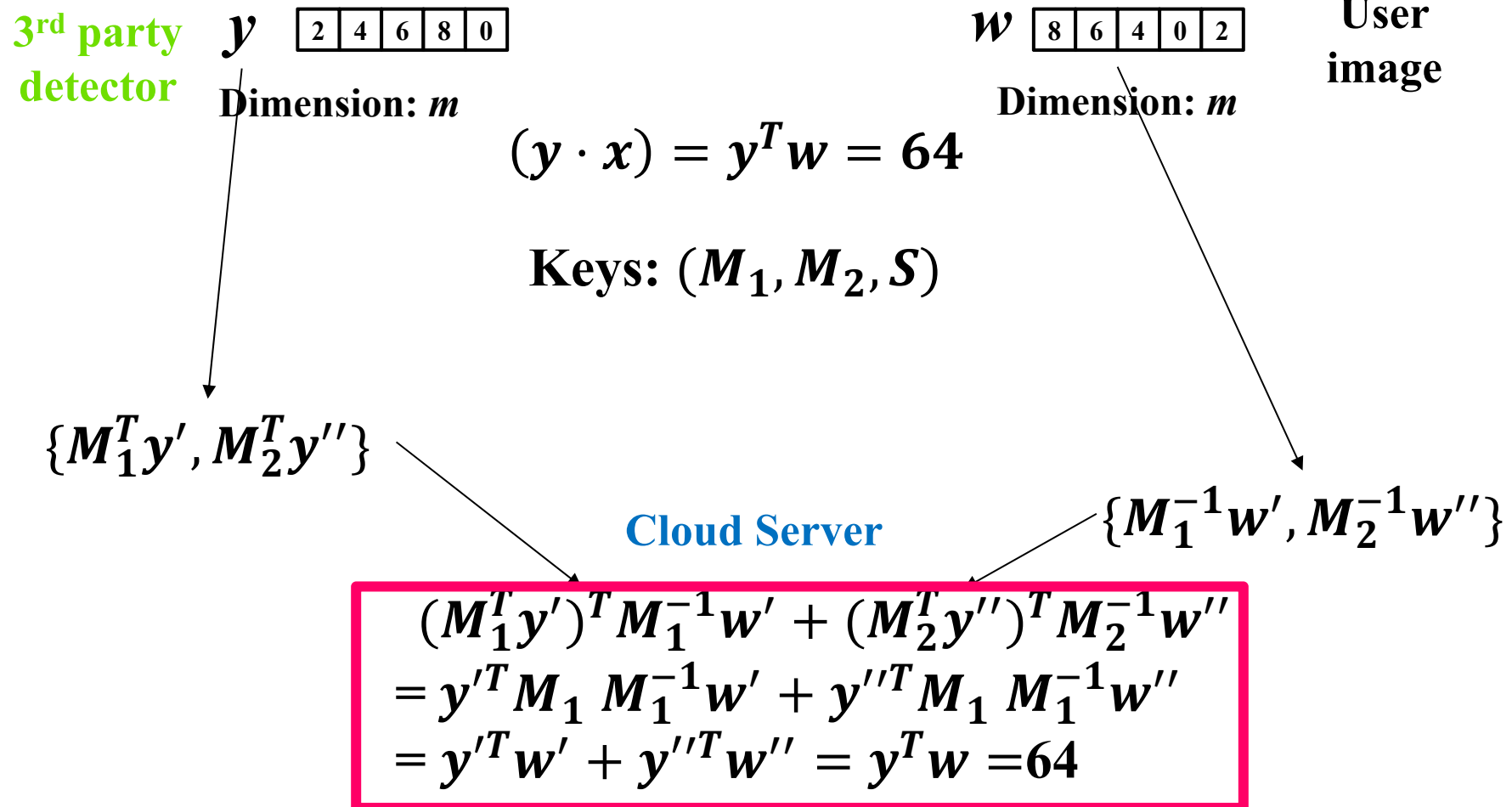
## Secure Inner Production





# Privacy Preserving Face Retrieval Protocol

## Secure Inner Production



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1

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**Privacy Preserving Face Retrieval**

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**Experimental Results**

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**Conclusion and Discussion**

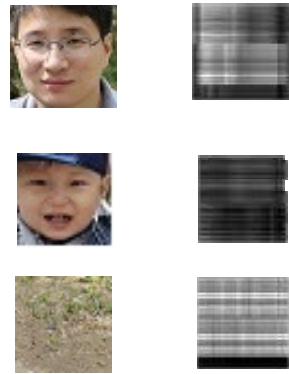
## The Experimental Setup

- A family of **5** members
- **4** mobile phones
- **100** photos are used to build our dictionary for face recognition
- **1000** photos in the cloud for retrieval

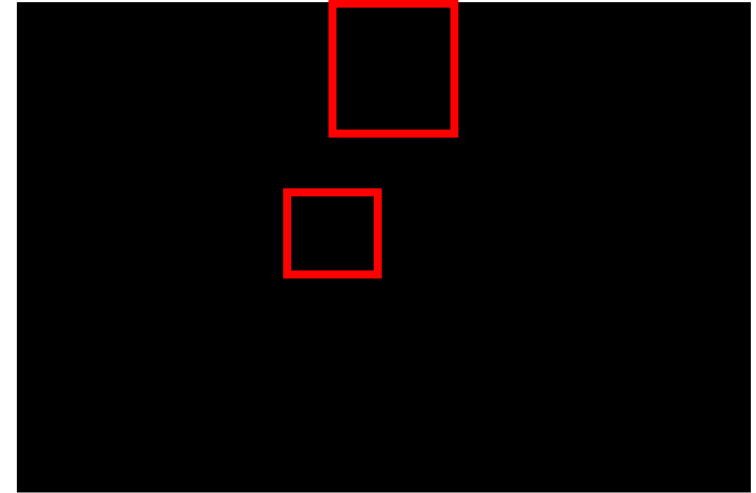
# The Secure Face Detection



User Photo



Sample Detection Windows    Encrypted Detection Windows



Detection Results in Encrypted Photo

# The Local Face Recognition Results



10001



111011



001110



001111



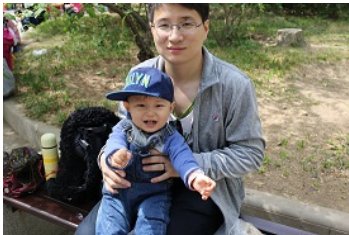
00101



00001

[Wright et al., 2009] John Wright, Allen Y. Yang, Arvind Ganesh, Shankar S. Sastry, and Yi Ma. Robust face recognition via sparse representation. *IEEE Trans. Pattern Anal. Mach. Intell.*, 31(2):210–227, 2009.

# The Face Label Matching Results



Query Photos



Parts of the Retrieval Results

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# Conclusion and Discussion

- **The first work that addresses the private face retrieval in a shared cloud server by a group of persons.**
- **We propose a novel protocol to preserve the privacy of the cloud users' photos and the parameters of the commercial face detector simultaneously in such mobile cloud scenarios.**
- **Both the storage security and the computation security are taken into consideration in one protocol.**
- **The protocol is designed for a real world application.**

Paper arXiv:

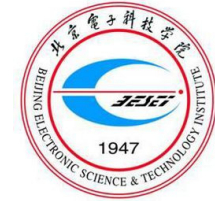
<https://arxiv.org/abs/1708.02872>

Paper download:

<http://jinxin.me/downloads/papers/025-APDM2017/APDM2017-IJCAI2017Workshop.pdf>



# APDM2017 (IJCAI2017 workshop36)



## Thanks!

Xin Jin<sup>1</sup>, Chenggen Song<sup>1</sup>, Shiming Ge<sup>2,\*</sup>

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