

# **A Generalized Framework for Privacy and Security Assessment of Biometric Template Protection**

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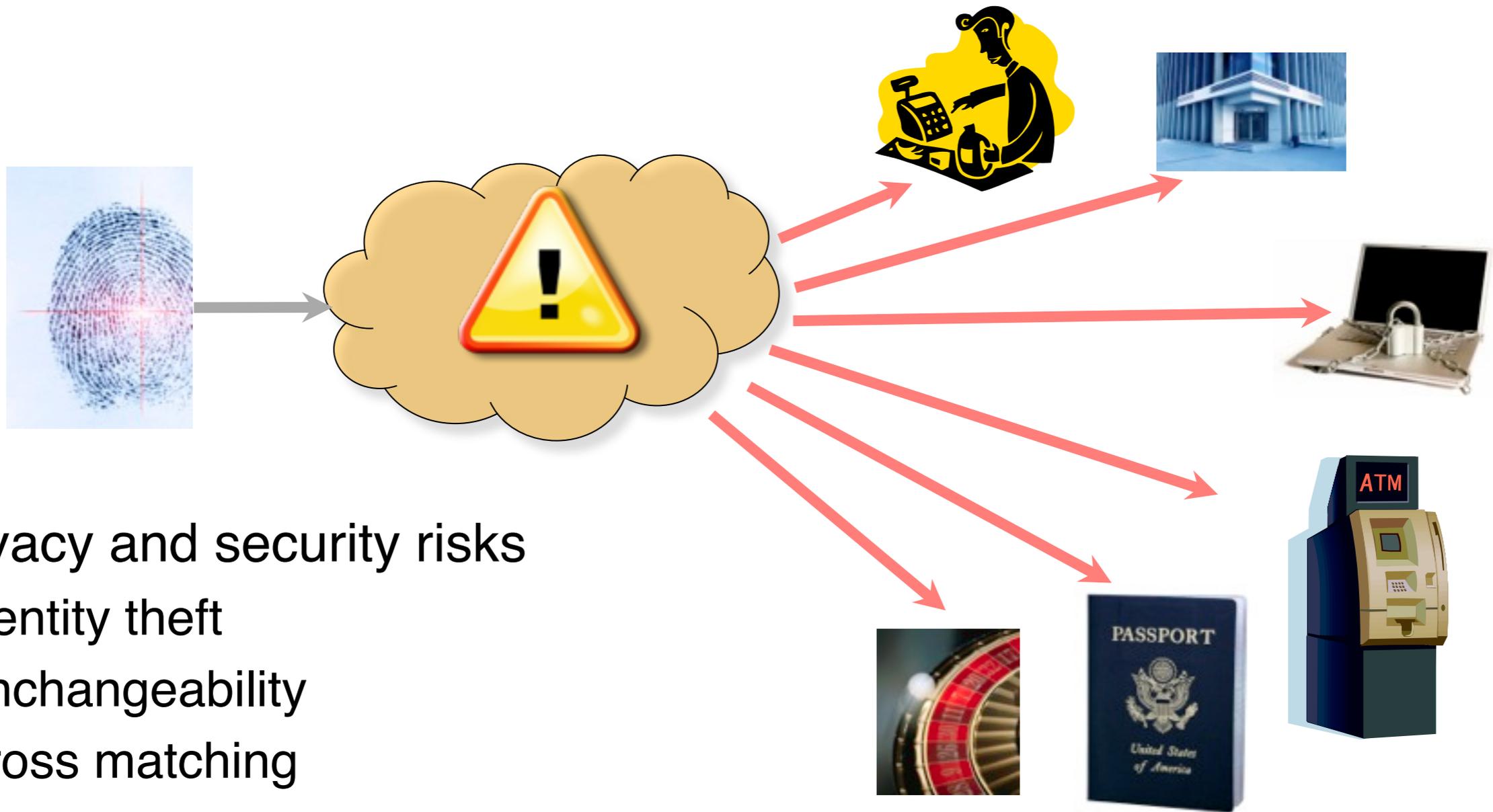
- Biometric template protection
- How to assess biometric template protection  
the systematic evaluation framework
- Assessment of different systems
- Conclusions
- Future work

# Biometric Systems



- Privacy and security risks
  - Identity theft
  - Unchangeability
  - Cross matching
  - Harm of privacy

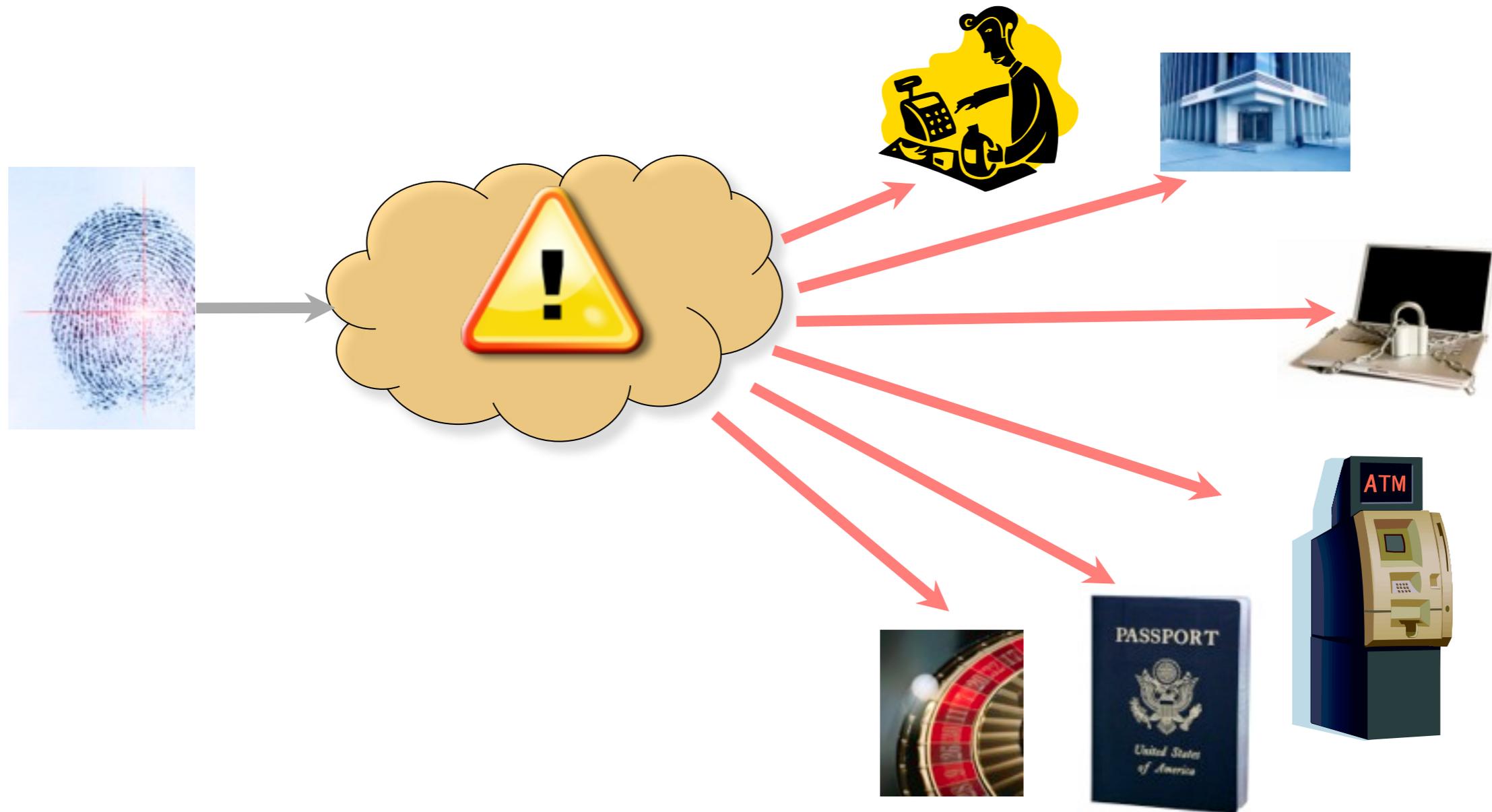
# Biometric Systems



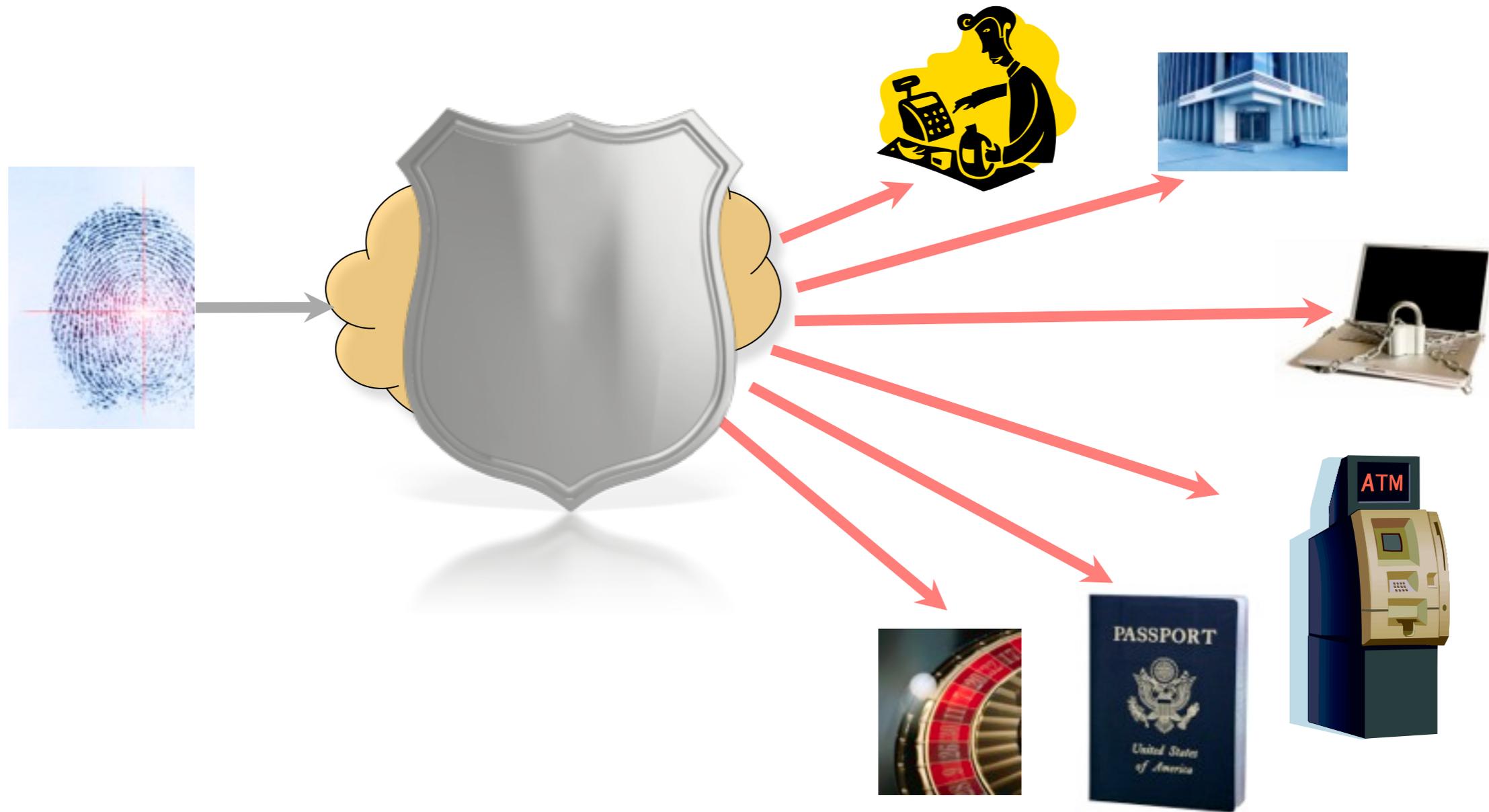
## ■ Privacy and security risks

- Identity theft
- Unchangeability
- Cross matching
- Harm of privacy

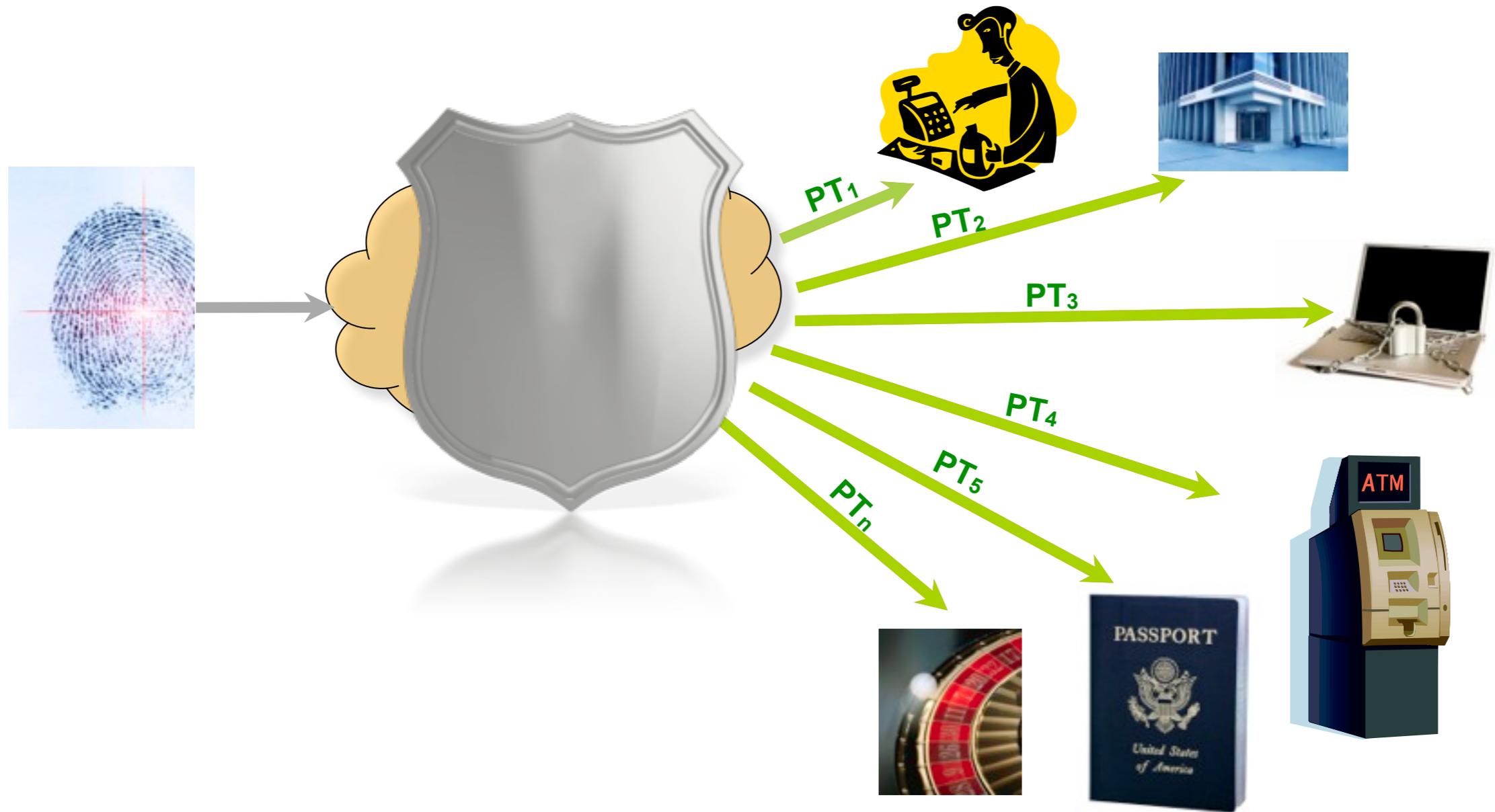
# Biometric Template Protection



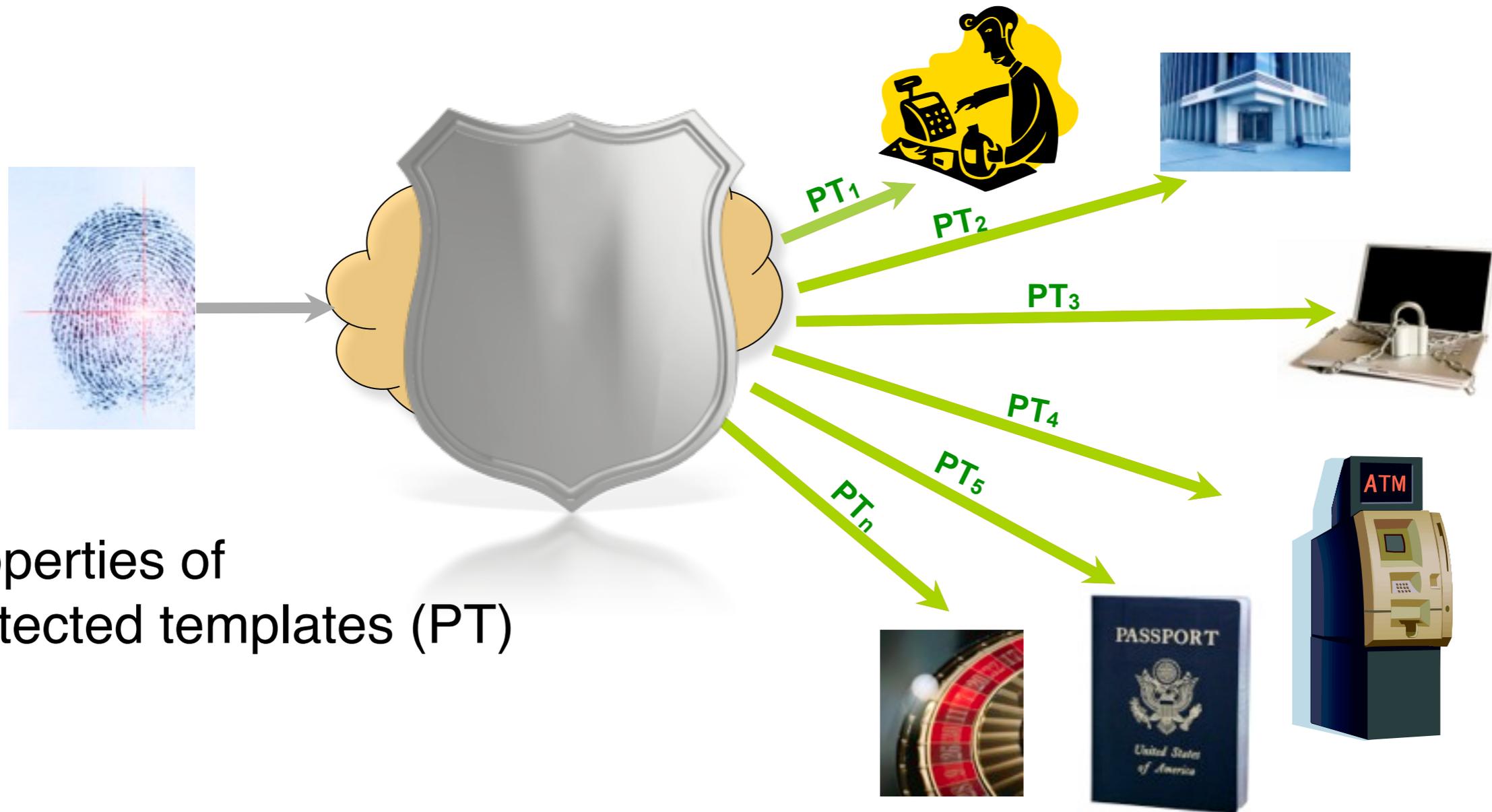
# Biometric Template Protection



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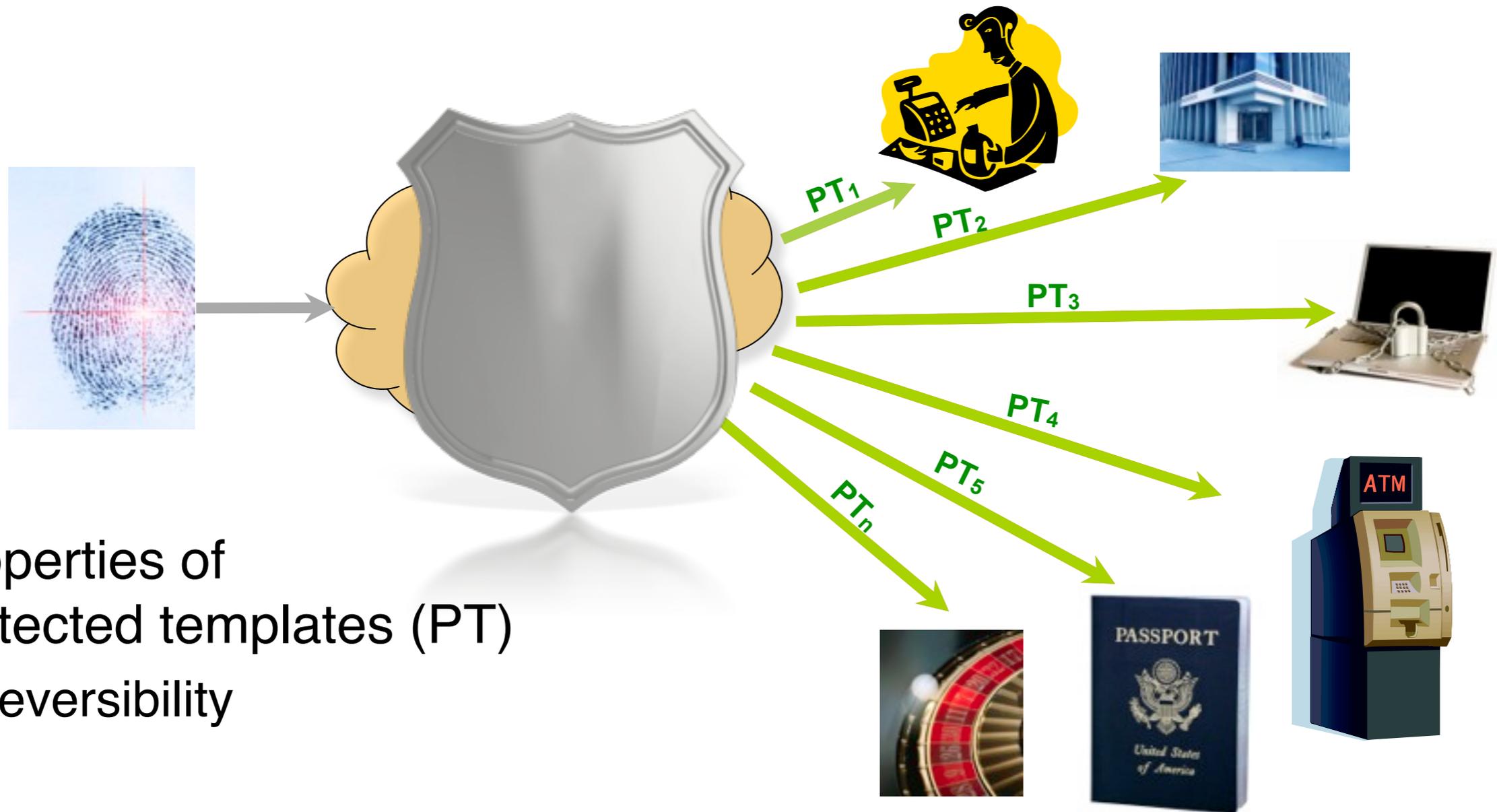


# Biometric Template Protection



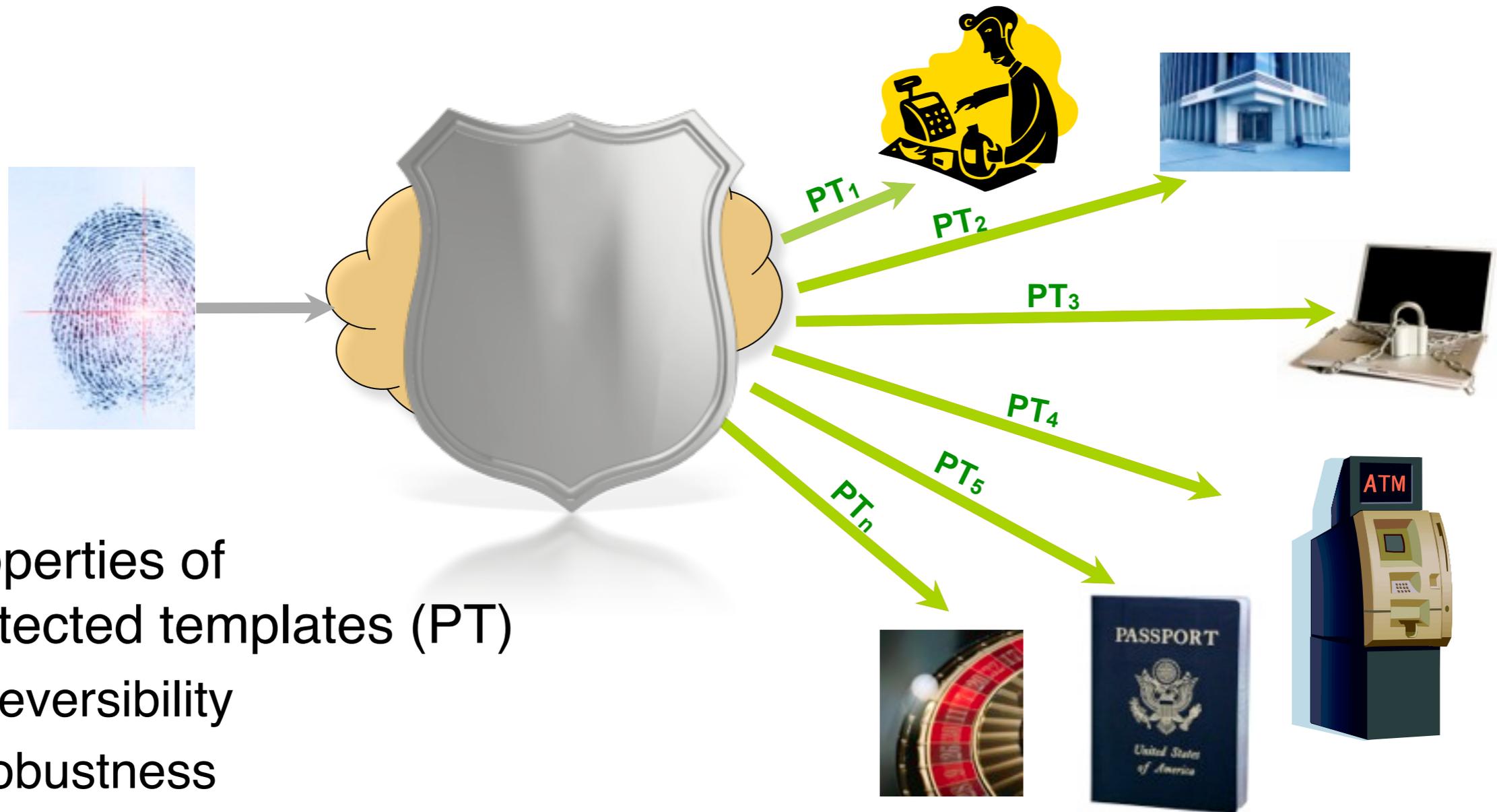
- Properties of protected templates (PT)

# Biometric Template Protection



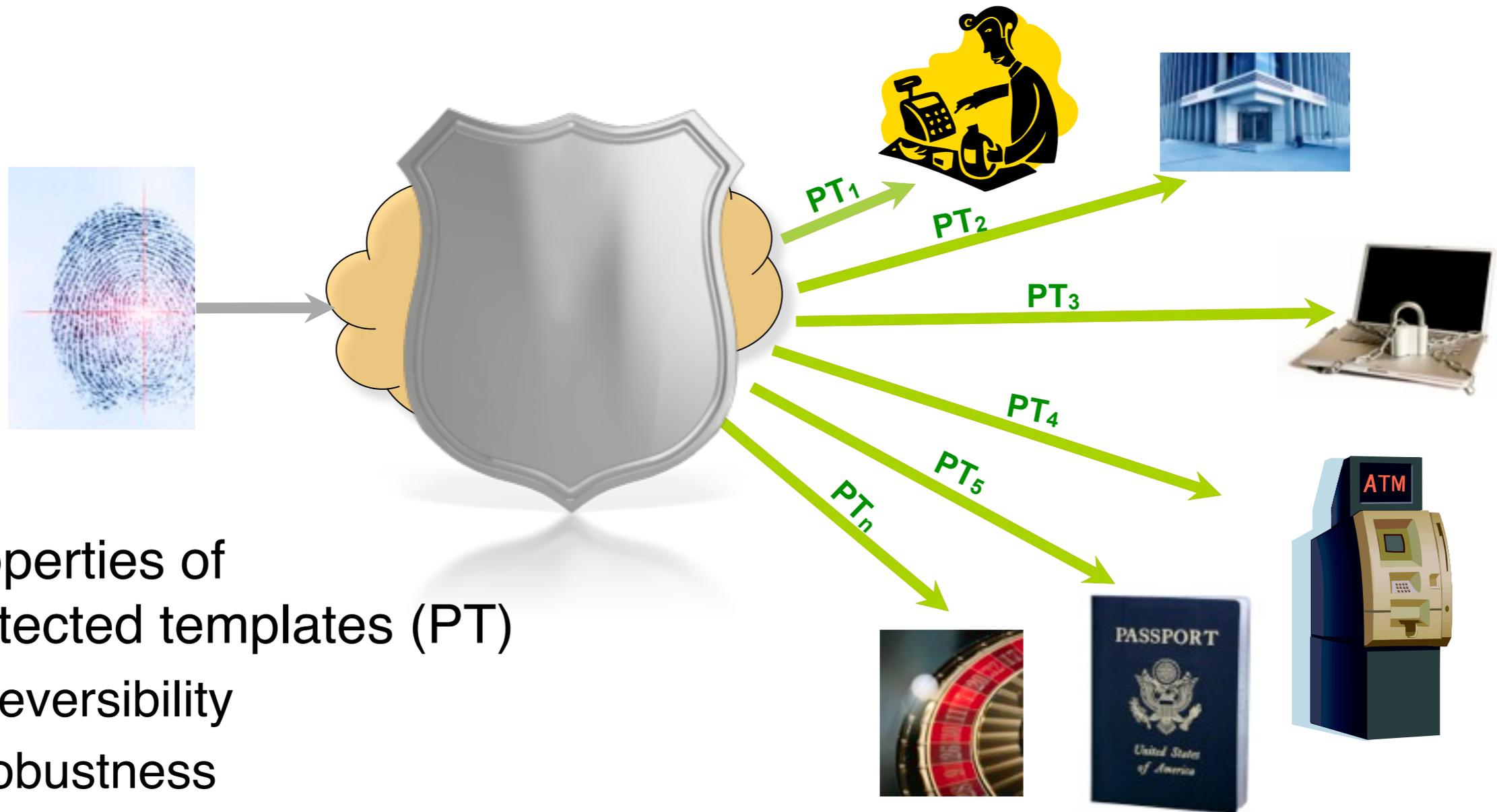
- Properties of protected templates (PT)
  - Irreversibility

# Biometric Template Protection



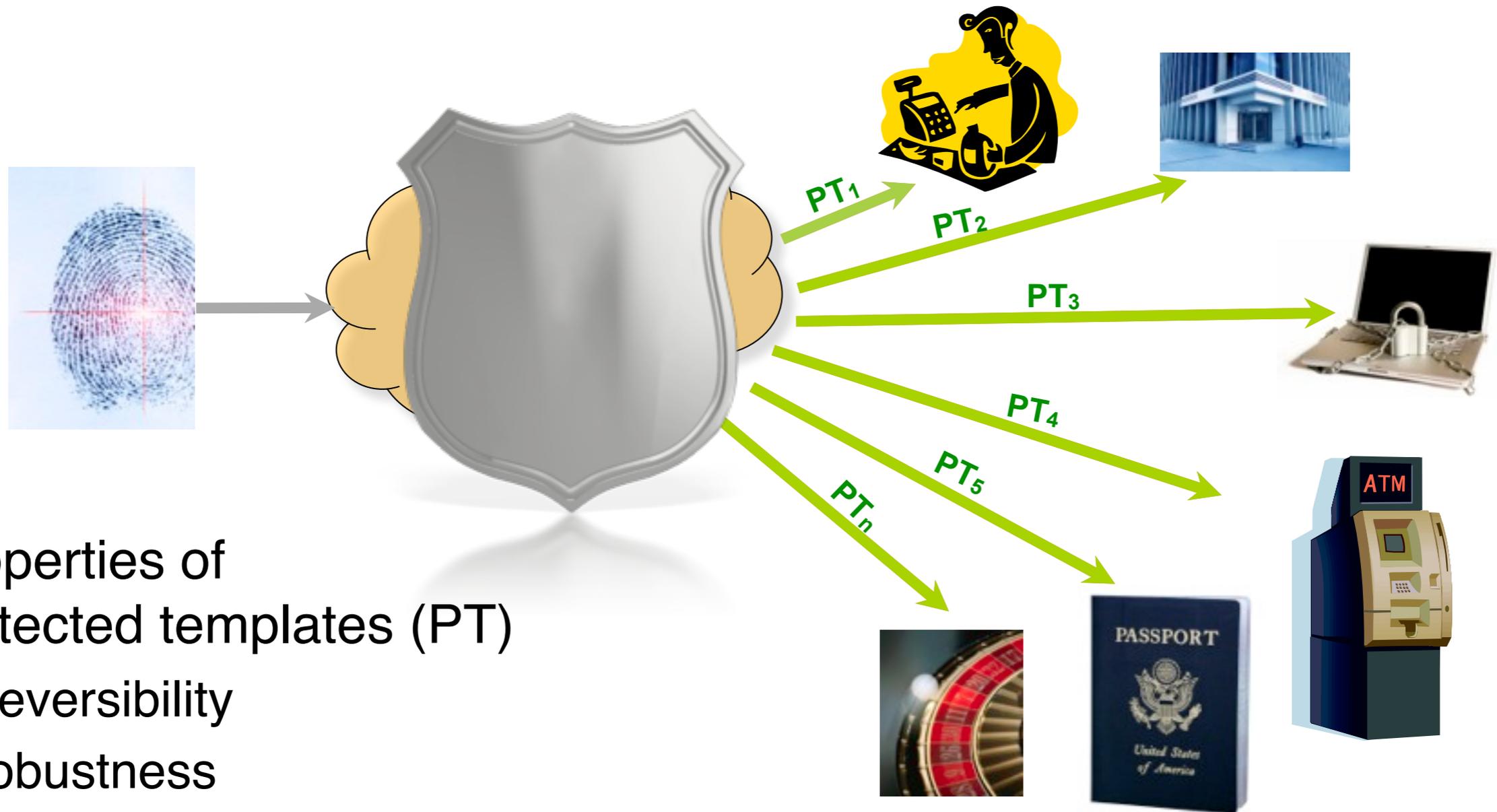
- Properties of protected templates (PT)
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# Biometric Template Protection



- Properties of protected templates (PT)
  - Irreversibility
  - Robustness
  - Diversity

# Biometric Template Protection



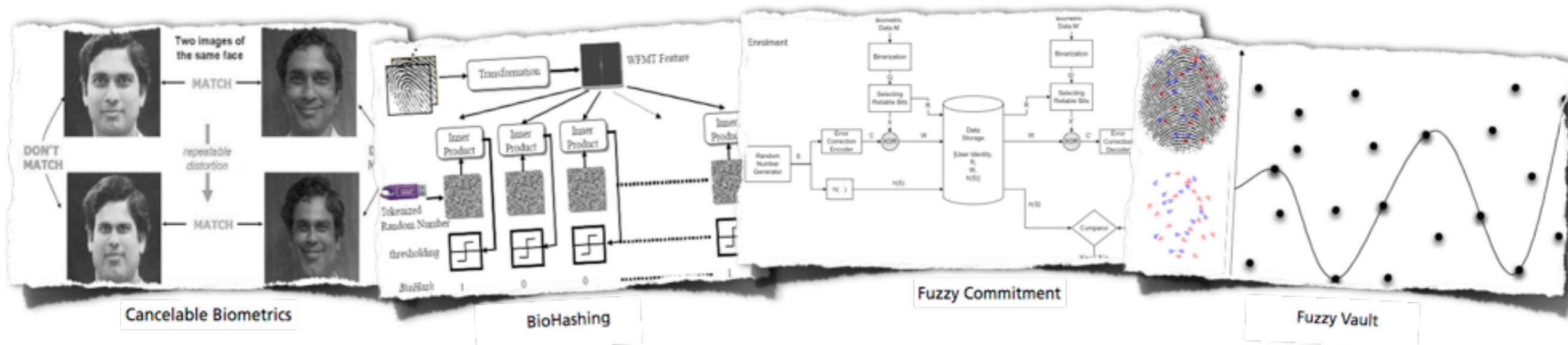
- Properties of protected templates (PT)
  - Irreversibility
  - Robustness
  - Diversity
  - Unlinkability

# State of the Art of Template Protection



- Transformation-based algorithms
  - Biometric salting
    - Biometric encryption [Soutar99, Savvides04, Takaragi07 etc.]
    - Biohashing [Teoh04, Teoh09, Ao09 etc.]
  - Cancelable biometrics [Ratha01, Zuo08, Bolle09 etc.]

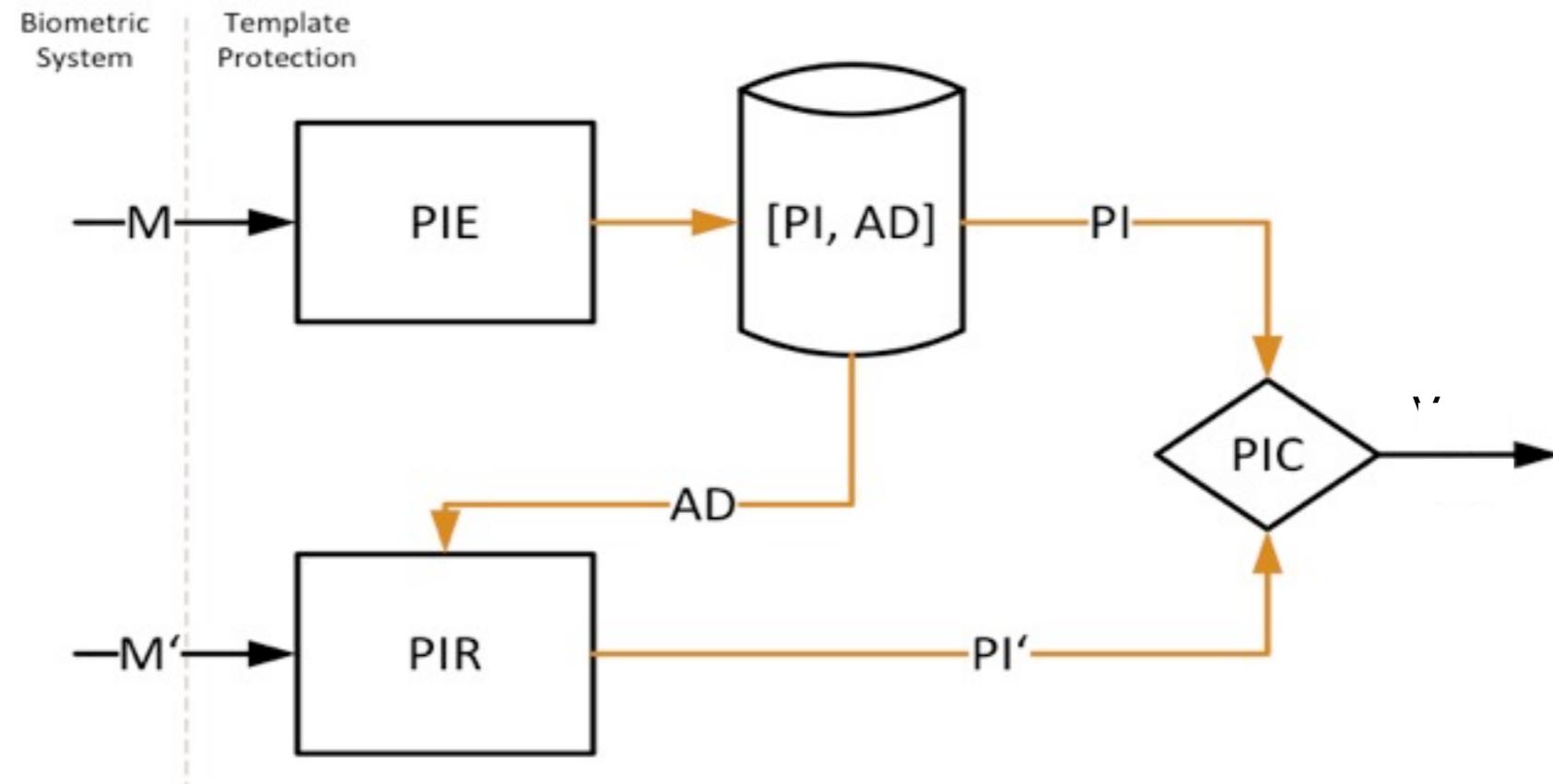
- Biometric cryptosystems
  - Fuzzy extractor [Dodis03]
    - Fuzzy commitment scheme [Juels99]
    - Helper data scheme [Tuyls04]
    - Fuzzy vault scheme [Juels02]
  - Quantization index modulation [Linnartz03, Buhan08]



# Biometric Template Protection



## ISO Architecture\*



- Pseudonymous Identifier Encoder ( $PIE$ ):  $[PI, AD] = PIE(M)$ ,  $M$  is observed biometric data in enrolment
- Pseudonymous Identifier Recorder ( $PIR$ ):  $[PI'] = PIR(M', AD)$ ,  $M'$  is probe biometric data
- Pseudonymous Identifier Comparator ( $PIC$ ):  $v = PIC(PI, PI')$ ,  $v$  is comparison result
- Stored protected template  $[PI, AD]$ , where  $PI$  is pseudonymous identifier and  $AD$  is auxiliary data

\* **ISO/IEC 24745 (2011) Information technology - Security techniques - Biometric Information protection**

# How to Assess Template Protection



- Protection goals - Evaluation criteria
  - Security of  $PI$ : Hardness to find an  $M^*$  (“pre-image” of  $PI$ ), which can pass  $PI$ - verification process
  - Privacy protection ability:
    - Irreversibility: Hardness to find an  $M^*$ , which is very close to the original  $M$
    - Privacy leakage: Information about  $M$  contained in protected templates
  - Unlinkability:
    - Cross matching: Personal identifiable information contained in protected templates
    - Leakage amplification: Additional information about  $M$  or pre-image of  $PI$  gained when combining protected templates of the same subject

# How to Assess Template Protection



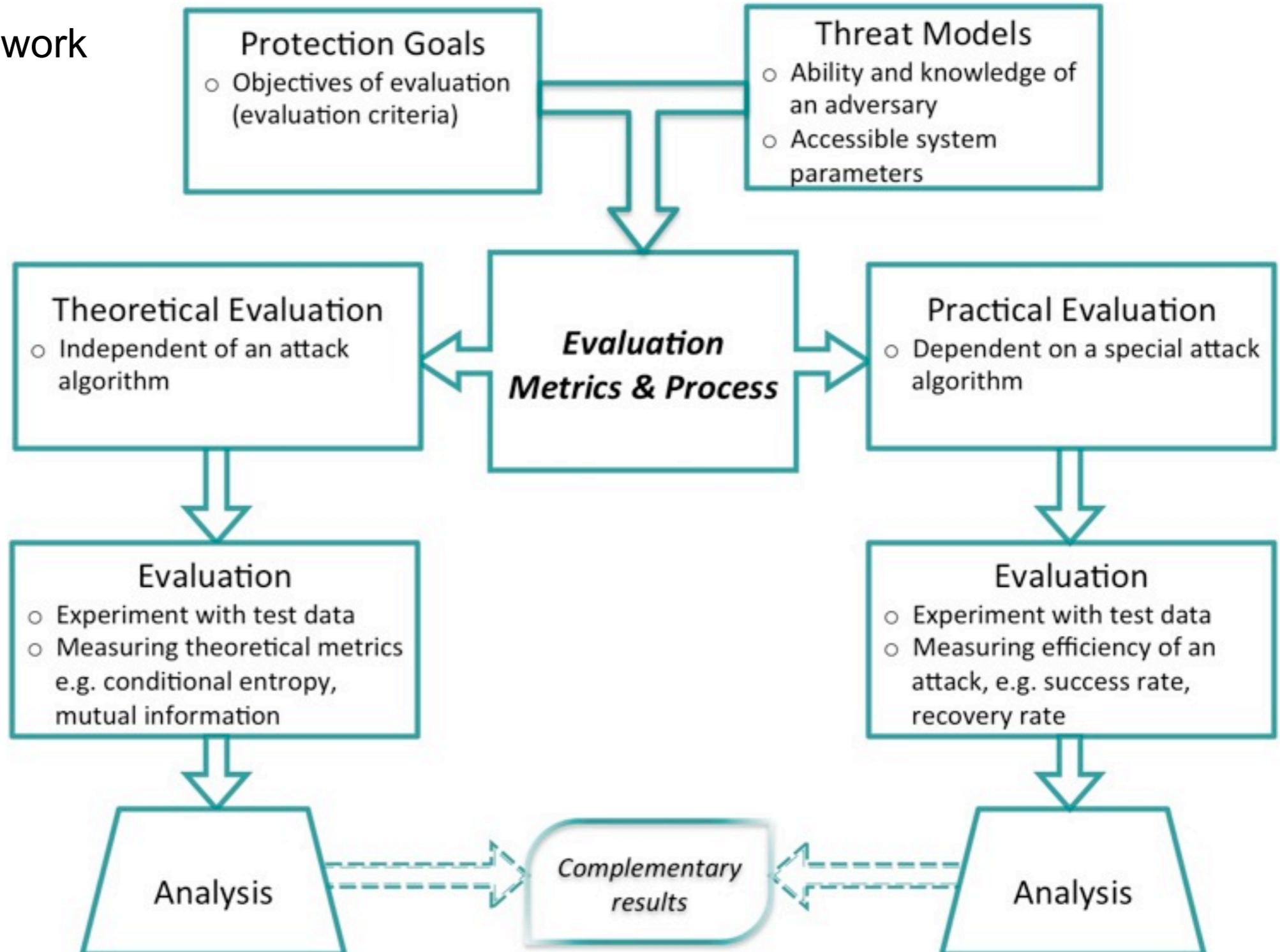
- Threat models - description of an adversary
  - Naive Model: Adversary has no information about the system
  - Advanced Model: Adversary has full knowledge of the algorithm (Kerckhoffs' principle) and properties of biometric data
  - Collision Model: Adversary owns a large amount of biometric data and can exploit inaccuracies of the biometric system
- Distribution of biometric features
  - Important a priori information for an adversary
  - Essential for security and privacy assessment



# How to Assess Template Protection



## Evaluation framework



# How to Assess Template Protection

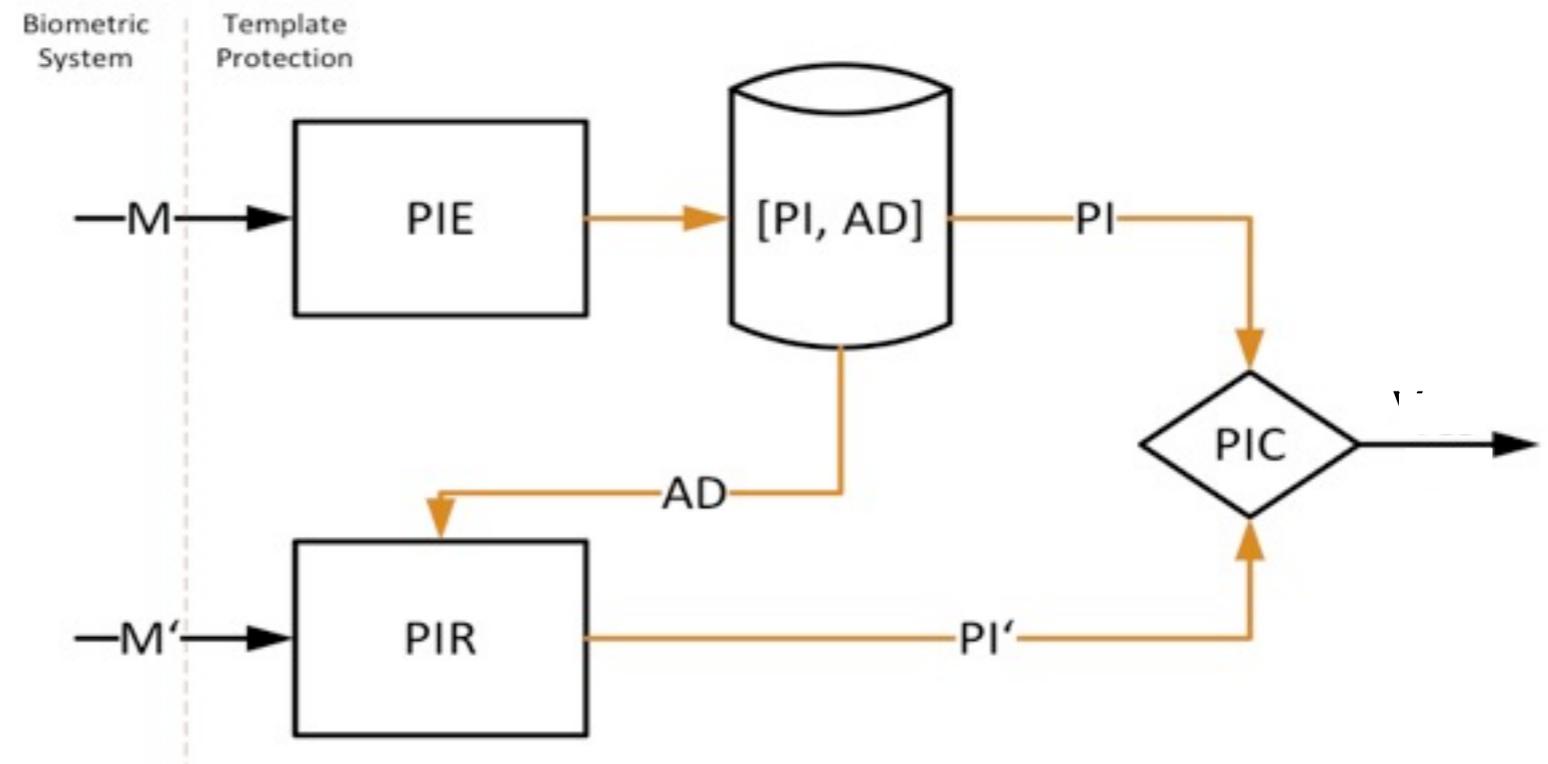


## ■ Definition of security:

- Let  $A(AD, PI)=[M', PI']$  be a reconstruction function, where  $PI'=PIR(M', AD)$ .  $T_A$  is the computational time required in one reconstruction and  $n$  is the average number of reconstructions needed to get a  $[M', PI']$  such that  $PIC(PI, PI')=1$  for a positive authentication result.
- Then, a template protection algorithm is  $(T, \varepsilon)$ -**secure**, if for all  $A$

$$T_A \geq T$$

$$\log_2 n \geq \varepsilon$$



# How to Assess Template Protection



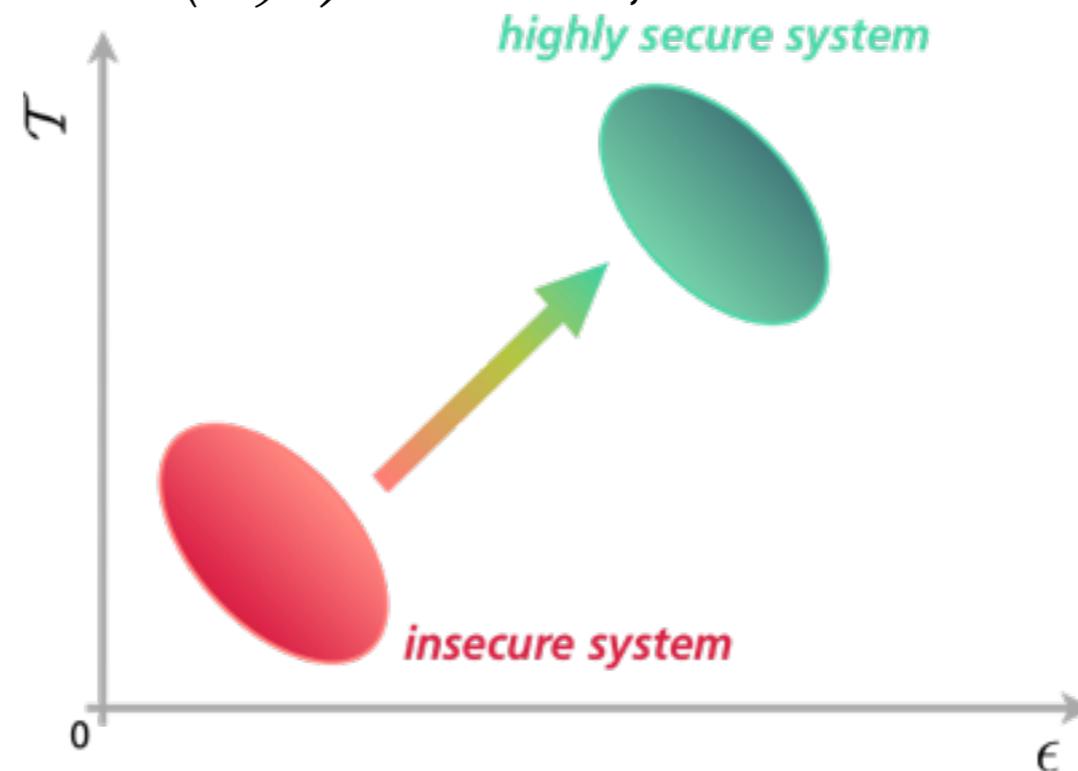
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# How to Assess Template Protection



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- A template protection algorithm is  $(T, \varepsilon)$ - **secure**, if for all  $A$

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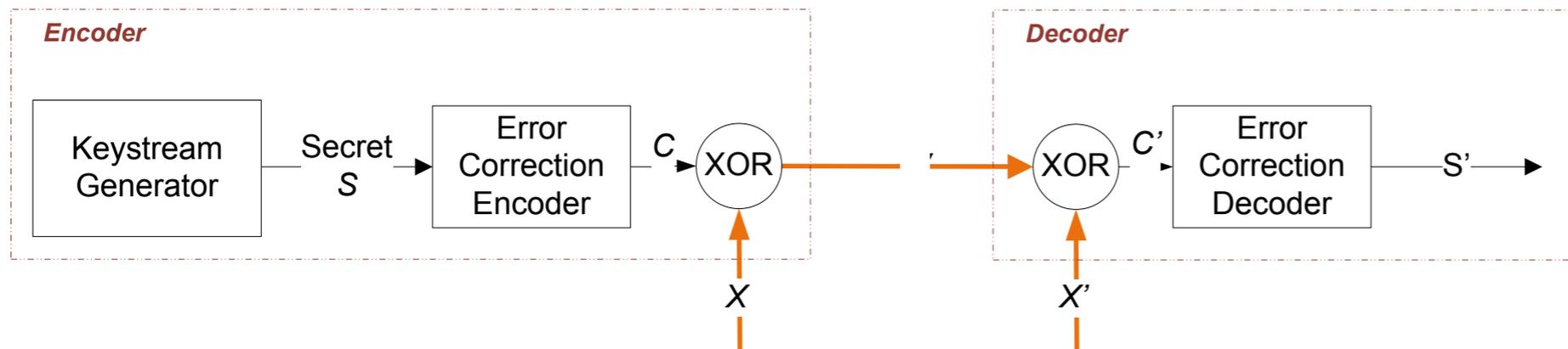
## ■ Definition of privacy:

- Let  $A(AD, PI)=[M', PI']$  be a reconstruction function, where  $PI'=PIR(M', AD)$ .  $T_A$  is the computational time required in one reconstruction; for a given threshold  $t$ ,  $n$  is the average number of reconstructions needed to get a  $[M', PI']$  such that for a distance function  $dist(M, M') < t$
- A template protection algorithm is  $(t, T, \varepsilon)$ - **preserving**, if for all  $A$

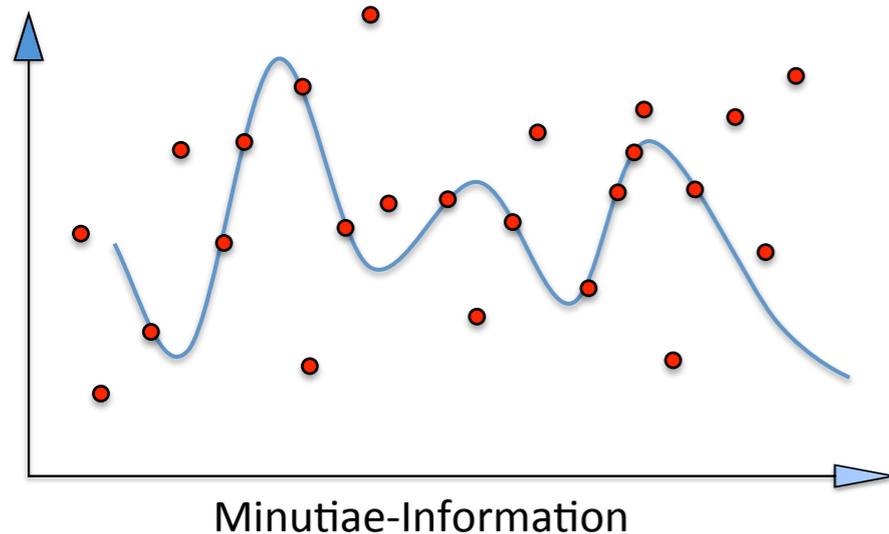
$$T_A \geq T$$

$$\log_2 n \geq \varepsilon$$

- The fuzzy commitment scheme for 3D face recognition
- The fuzzy commitment scheme for iris recognition



- The fuzzy vault algorithm for fingerprint recognition



# Assessment of Different Protected Systems



## ■ Security assessment

System	$L_S$	Naive Model		Advanced Model		Collision Model	Ranking
		$\epsilon=L_S-1$	$T$	$\epsilon$	$T$	$\epsilon=-\log_2(FAR)$ $FAR@FRR$	
<i>3D Face Fuzzy Commitment</i>	71 bit	70	$O(1)$	11.13	$O(1)$	6.48 1.12%@19.97%	
<i>Iris Fuzzy Commitment</i>	72 bit	71	$O(1)$	14.25	$O(1)$	7.41 0.59%@22.74%	
<i>Fingerprint Fuzzy Vault*</i>	128 bit	127	$O(1)$	34.54	$O(n \log^2(n))$	13.29 0.01%@9%	

\* "Fingerprint-Based Fuzzy Vault: Implementation and Performance", Nandakumar, Jain and Pankanti, IEEE Trans. on Info. Forensics and Security, 2007

# Assessment of Different Protected Systems



- Privacy protection ability in the advanced model:
  - High privacy leakage, which can cause cross matching and leakage amplification
  - Irreversibility is measured with the privacy definition for  $t=0$ . It shows computational complexity to retrieve the original biometric features

System	$L_S$	Privacy leakage	Irreversibility	
			$\epsilon$	$T$
<i>3D Face Fuzzy Commitment</i>	71 bit	77.5 bit	74.2 bit	$O(1)$
<i>Iris Fuzzy Commitment</i>	72 bit	4311 bit	14.25 bit	$O(1)$
<i>Fingerprint Fuzzy Vault*</i>	128 bit	892.59 bit	34.54 bit	$O(n \log^2(n))$

\* "Fingerprint-Based Fuzzy Vault: Implementation and Performance", Nandakumar, Jain and Pankanti, IEEE Trans. on Info. Forensics and Security, 2007

# Assessment of Different Protected Systems



- Unlinkability in the advanced model:
  - Cross matching is a serious problem
  - It should be avoided to use any personal identifiable information in the systems
  - Additionally, the privacy leakage is unavoidable in these system due to error tolerance, but it should be minimized

System	Cross matching	Leakage Amplification
<i>3D Face Fuzzy Commitment</i>	 EER=5%	 no feasible attack yet
<i>Iris Fuzzy Commitment</i>	 EER =16.34%	
<i>Fingerprint Fuzzy Vault*</i>	 no assessment in the paper	 no assessment in the paper

\* "Fingerprint-Based Fuzzy Vault: Implementation and Performance", Nandakumar, Jain and Pankanti, IEEE Trans. on Info. Forensics and Security, 2007

# Conclusions



- The framework is useful to detect vulnerabilities of the existing algorithms
- The framework enables rigorous assessment, which is important and necessary for the development of template protection
- All the protection goals need to be taken into account
- Threat models are the important prerequisites. Security and privacy protection ability of a system can be overestimated, if unrealistic assumption is made
- Unique and measurable metrics such as the metrics used in the security and privacy definitions, are necessary for ranking of different algorithms

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## Future Work



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- Universal and constructive criteria, which can guarantee security and privacy performance of template protection
  - An extended evaluation including both security and recognition performance
  - Benchmarking and certification for template protection

# References



- Zhou, Xuebing: “Privacy and Security Assessment of Biometric Template Protection”, PhD thesis, Technische Universität Darmstadt, Germany, 2011
- Zhou, Xuebing; Kuijper, Arjan; Busch, Christoph: Cracking Iris Fuzzy Commitment In: IEEE the International Conference on Biometrics (ICB 12), 2012
- Zhou, Xuebing; Kuijper, Arjan; Veldhuis, Raymond; Busch, Christoph: Quantifying Privacy and Security of Biometric Fuzzy Commitment In: IEEE the International Joint Conference on Biometrics (IJCB 11), 2011



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