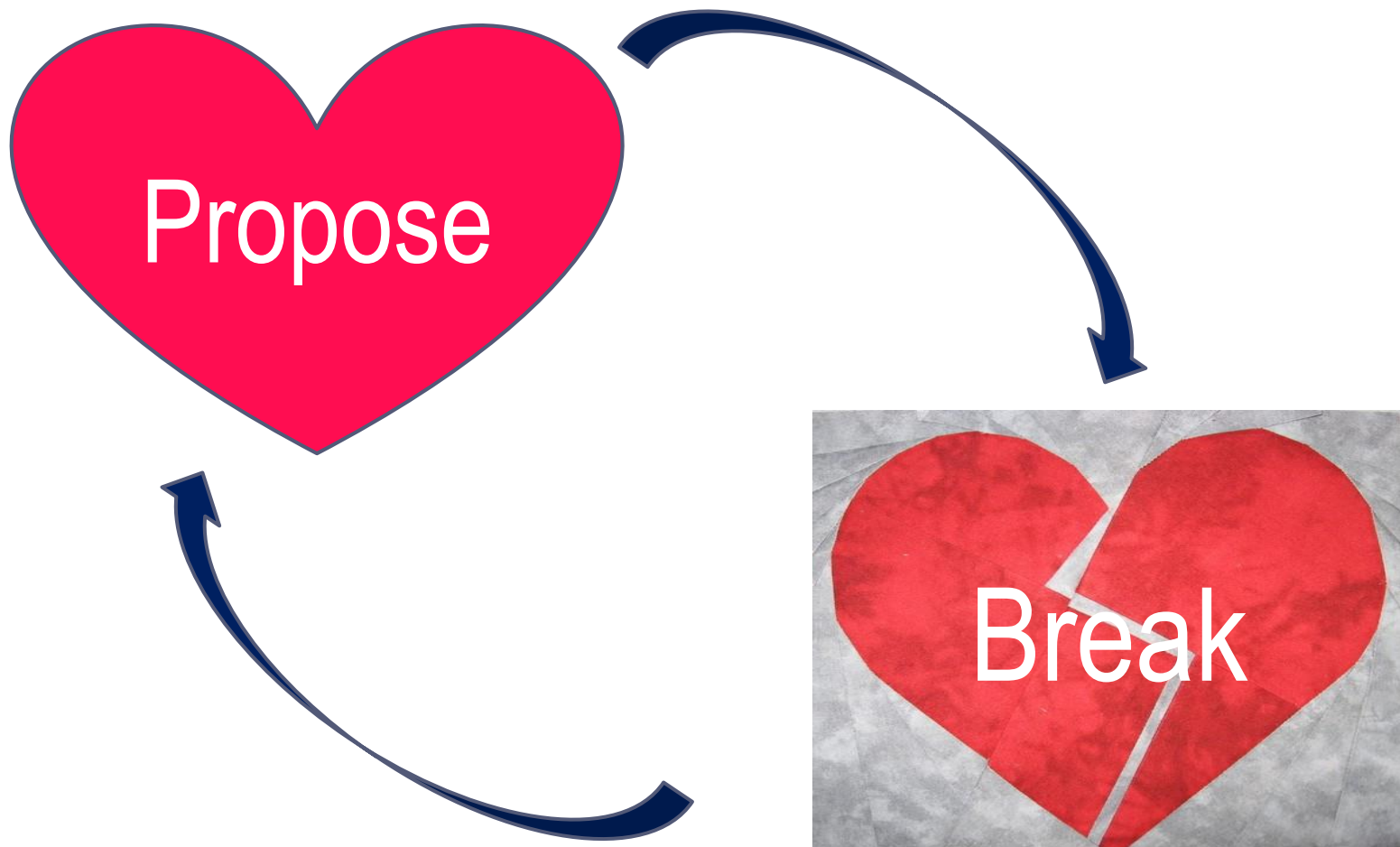


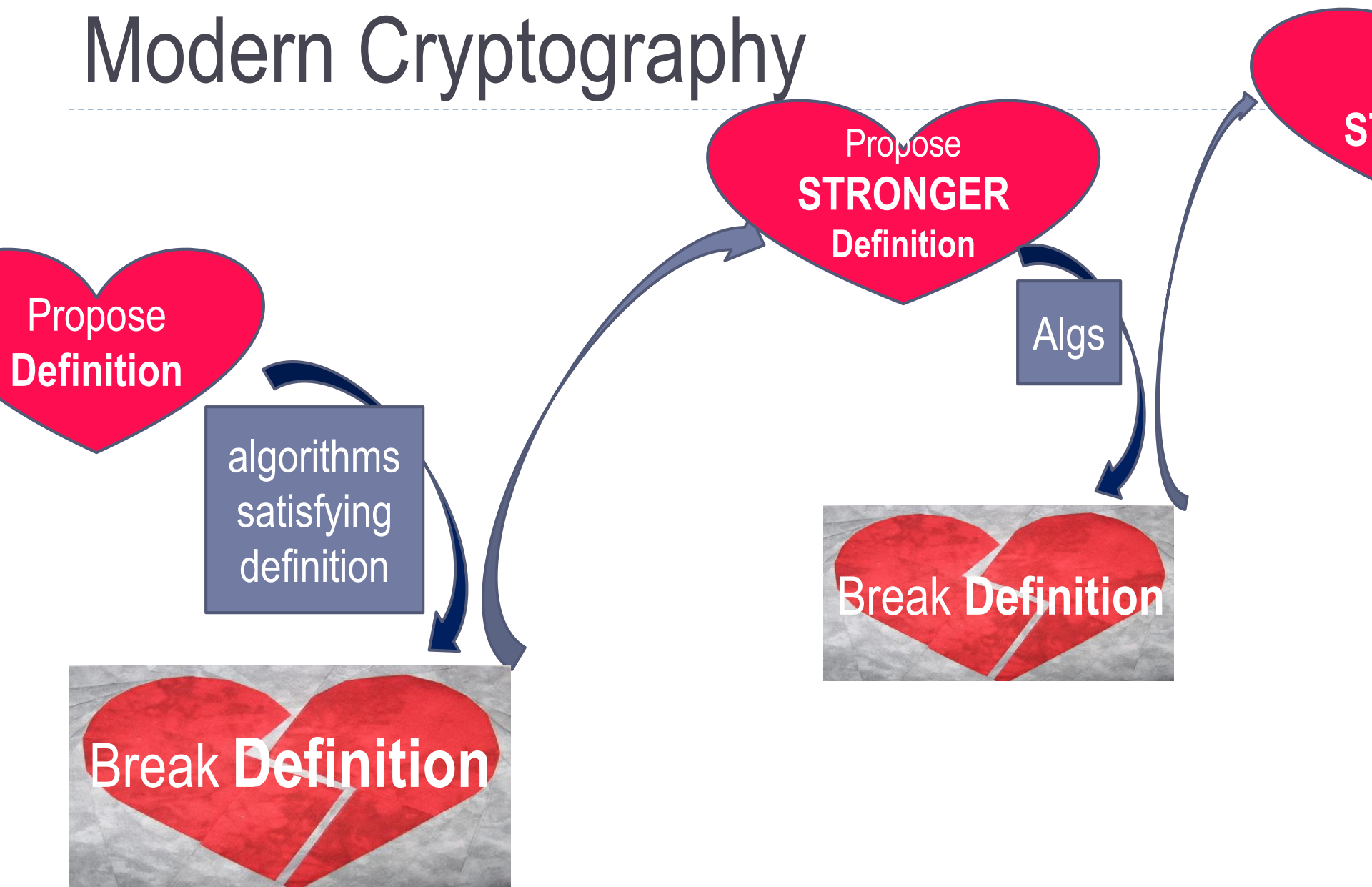
Discussant: The Secret Life of I.J. Good

Cynthia Dwork, Harvard University

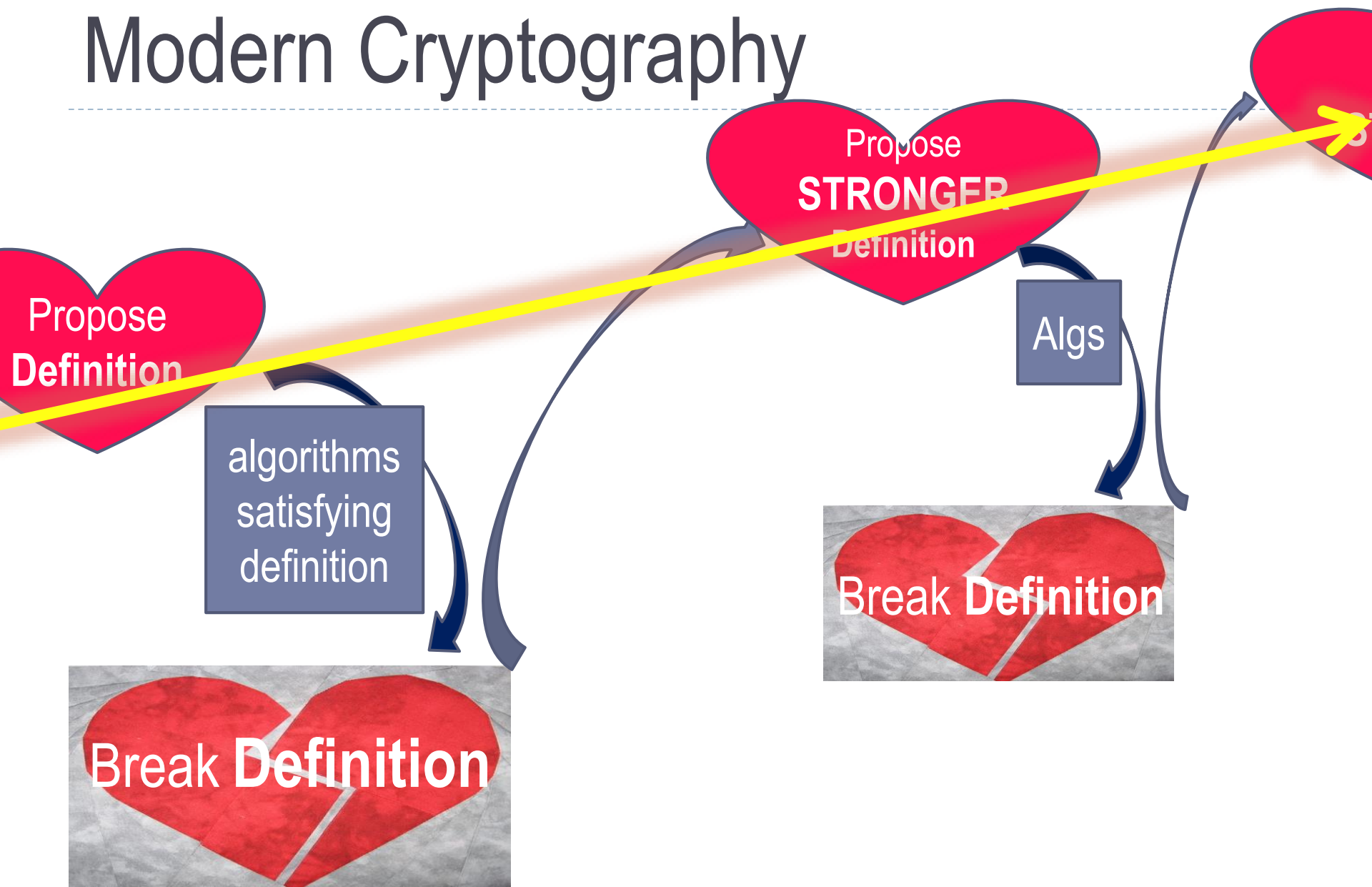
Pre-Modern Cryptography



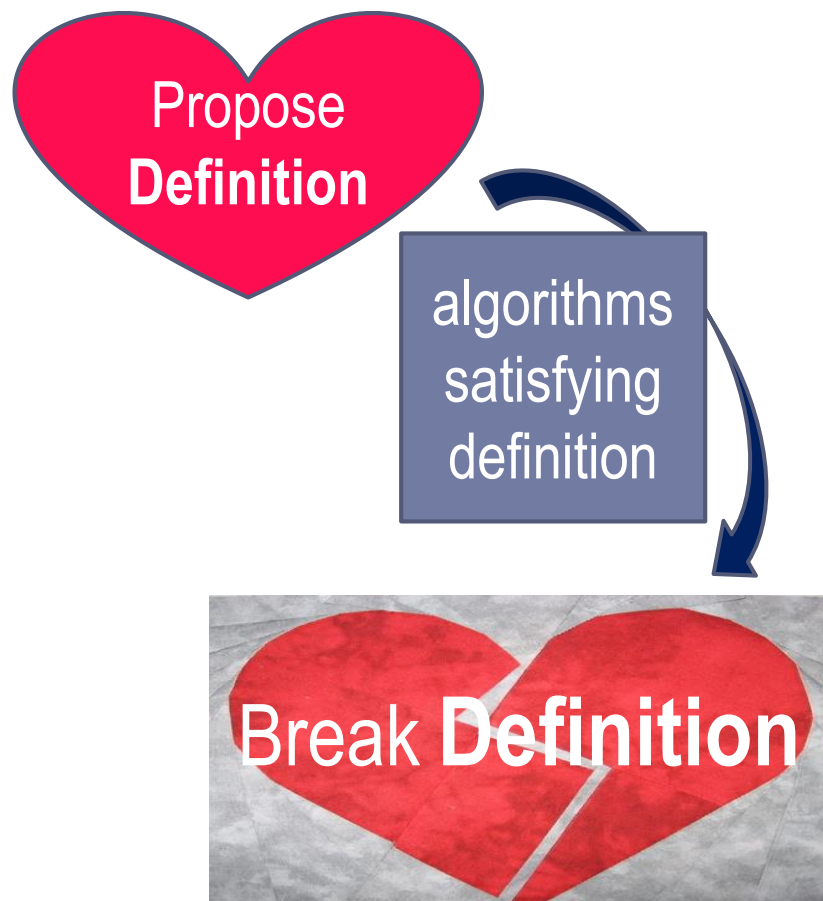
Modern Cryptography



Modern Cryptography



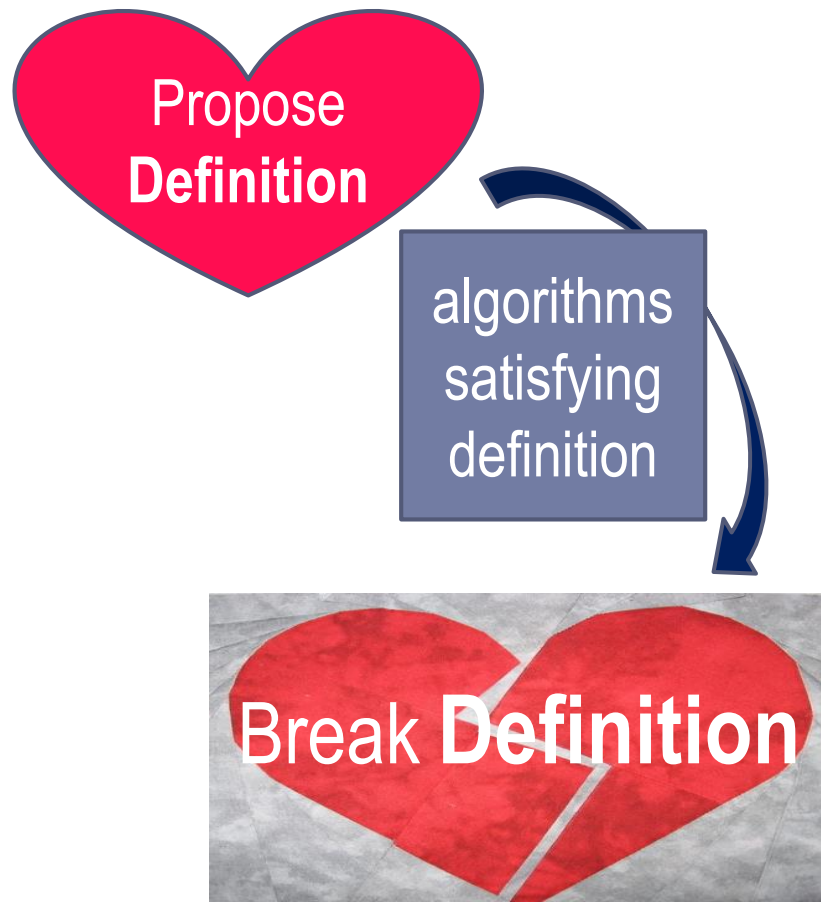
Security for an Encryption Scheme



- ▶ What is the goal of the adversary?
- ▶ What are the resources available to the adversary?



Resources



- ▶ What is the goal of the adversary?
- ▶ What are the resources available to the adversary?
 - ▶ Adversary runs in polynomial time (in a security parameter κ)
 - ▶ Can have arbitrary auxiliary information
 - ▶ For today: adversary is a passive eavesdropper (ie, no chosen ciphertext attacks)

Goal 1: Distinguishing from Random



Propose
Definition

algorithms
satisfying
definition

- ▶ What is the goal of the adversary?
 - ▶ Adversary chooses message m . Attempts to distinguish encryptions of m from encryptions of random strings of the same length.



Goal 2: Distinguishing Two Messages



algorithms
satisfying
definition

- ▶ What is the goal of the adversary?
 - ▶ Adversary chooses messages m_0, m_1 of the same length. Attempts to distinguish encryptions of m_0 from encryptions of m_1 .

Goal 3: Semantic Security



algorithms
satisfying
definition

- ▶ What is the goal of the adversary?
 - ▶ Adversary chooses a distribution D on messages and function f .
 - ▶ Adversary tries to guess $f(m)$, where $m \sim D$
 - ▶ ... better than it could do without access to the ciphertext
- ▶ All three goals are equivalent

Formalizing Semantic Security

- ▶ $\{(KeyGen_{\kappa}, Enc_{\kappa}, Dec_{\kappa})\}_{\kappa=1, \dots}$
- ▶ Everything runs in time polynomial in κ ; all lengths are $\text{poly}(\kappa)$
 - ▶ $KeyGen_{\kappa}$ produces key(s). If public-key system, A receives E .
 - ▶ $A(E)$ chooses a distribution D on messages and arbitrary function f
 - ▶ $m \sim D$ is chosen and the ciphertext α is presented to A .
 - ▶ A is given length of m and arbitrary auxiliary information: $z = (z(m), |m|)$.
 - ▶ $A(E, \alpha, z)$ outputs guess of $f(m)$.
- ▶ $\forall A \exists S$ such that $\forall \text{poly } p$:

$$|\Pr[A(E, \alpha, z) \text{ guesses } f(m)] - \Pr[S(E, z) \text{ guesses } f(m)]| \leq 1/p(\kappa)$$

Probabilities taken over everything



Formalizing Semantic Security

- ▶ $\{(KeyGen_{\kappa}, Enc_{\kappa}, Dec_{\kappa})\}_{\kappa=1, \dots}$
- ▶ Everything runs in time polynomial in κ ; all lengths are $\text{poly}(\kappa)$
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“The ciphertext effectively leaks no information about m ”

Algorithms



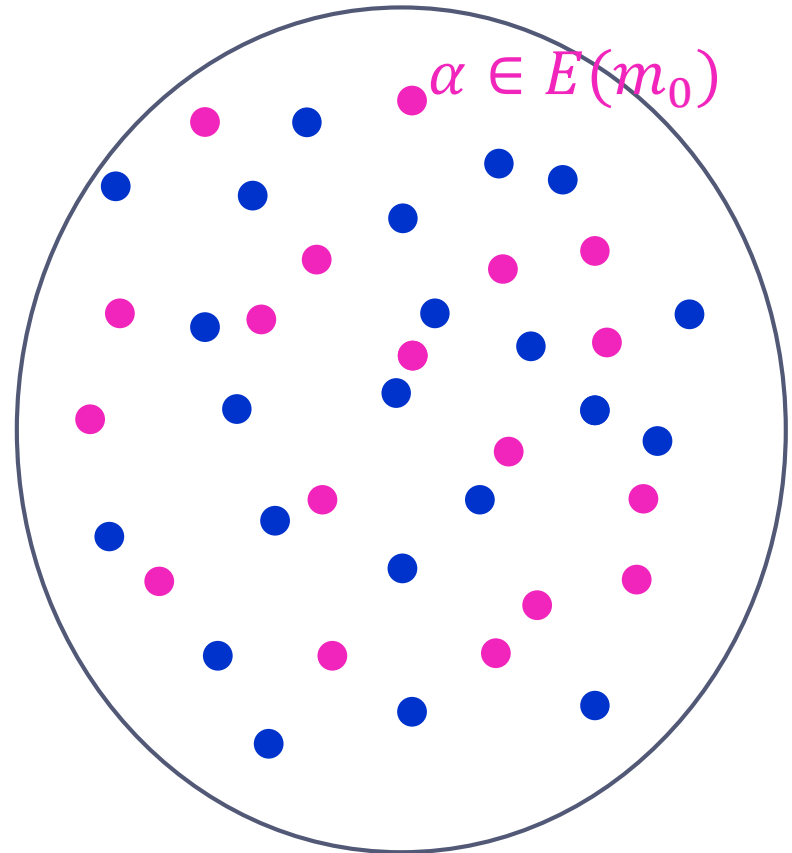
algorithms
satisfying
definition

- ▶ Base an algorithm on a hard* problem
 - ▶ Prove that any efficient adversary achieving its goal can be converted into an efficient algorithm to solve the hard problem (showing that the problem is not hard after all)
- ▶ Examples: quadratic residuosity, factoring, finding discrete logarithms, finding a short basis for a lattice, learning with errors



Infinite Bayes Factor

- ▶ $\frac{\Pr[\alpha|m_0]}{\Pr[\alpha|m_1]} = \infty$
- ▶ Can enumerate all blue
- ▶ Can enumerate all pink
- ▶ Without knowledge of the decryption key: Cannot efficiently determine color of point without efficiently solving the underlying mathematical problem



Randomness

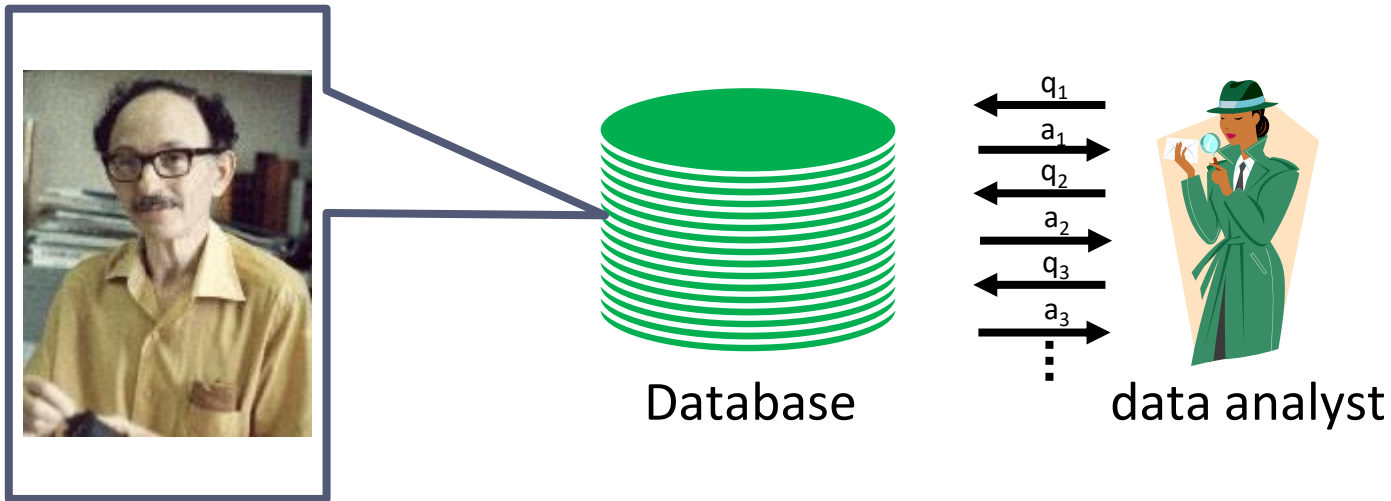


algorithms
satisfying
definition

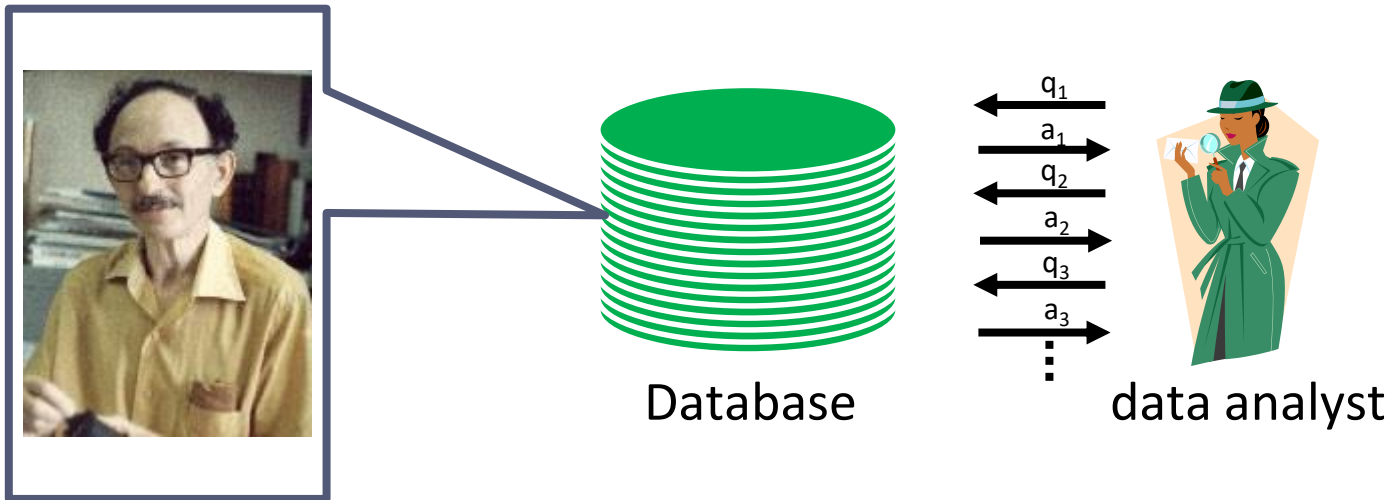
- ▶ A few high-quality random bits suffice
- ▶ Pseudo-randomness can be based on any one-way function



Privacy-Preserving Data Analysis



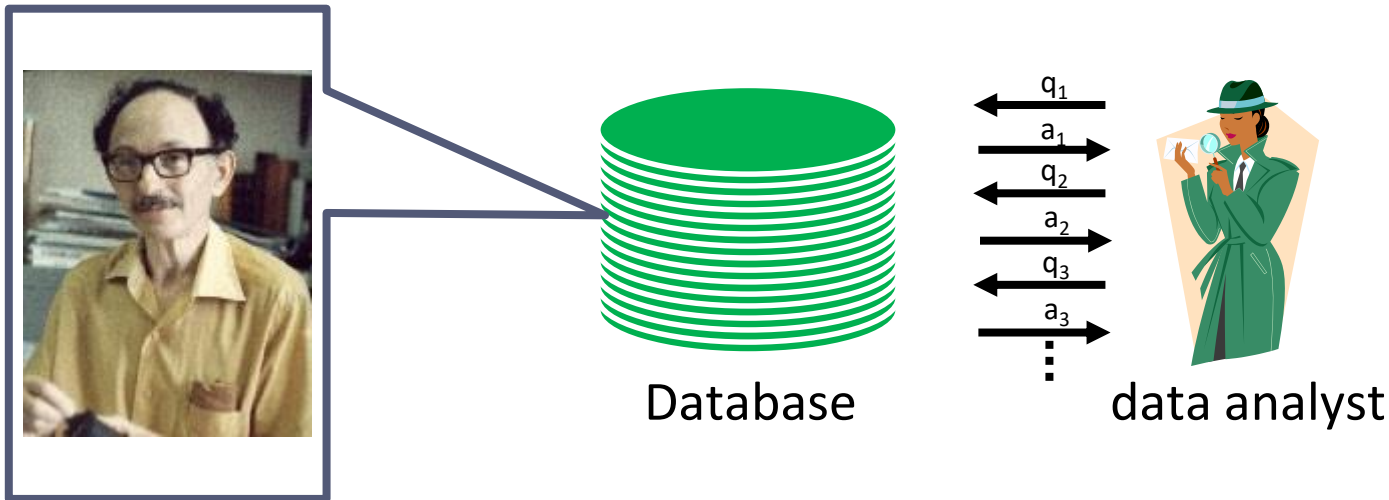
Privacy-Preserving Data Analysis?



- ▶ “Can’t learn anything new about Good”?
 - ▶ Dalenius, 1977; Goldwasser and Micali: semantic security 1982
-



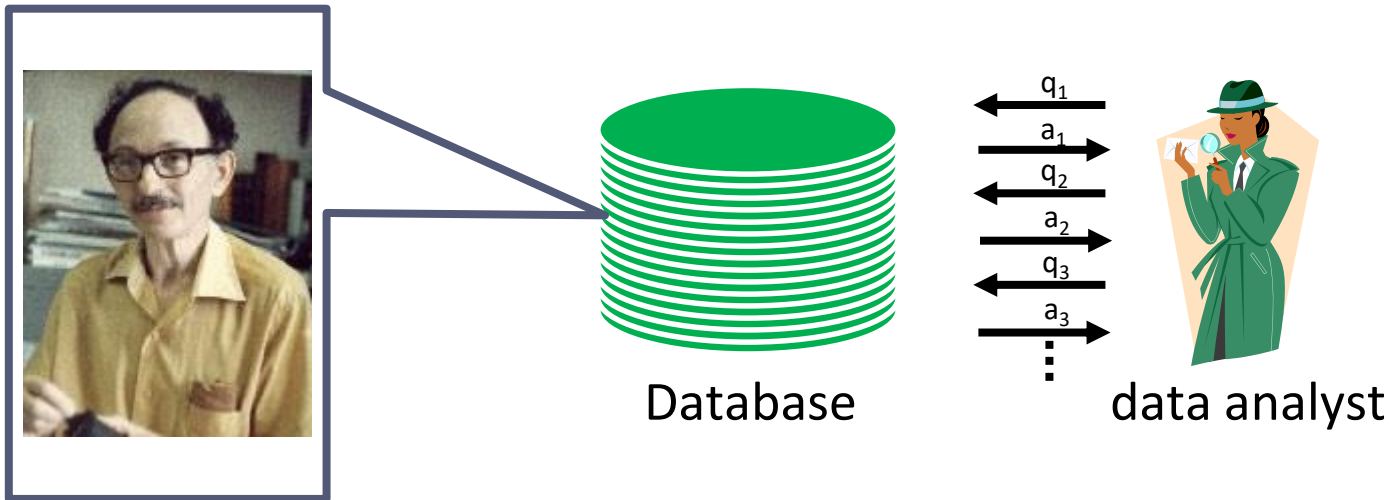
Privacy-Preserving Data Analysis?



- ▶ “Can’t learn anything new about Good”?
- ▶ Then what is the point?



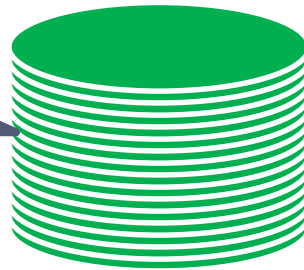
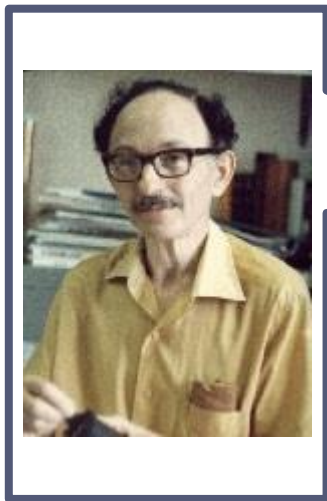
Privacy-Preserving Data Analysis?



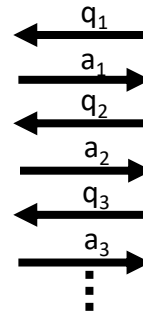
- ▶ “Can’t learn anything new about Good”?
- ▶ Then what is the point?



Privacy-Preserving Data Analysis?



Database



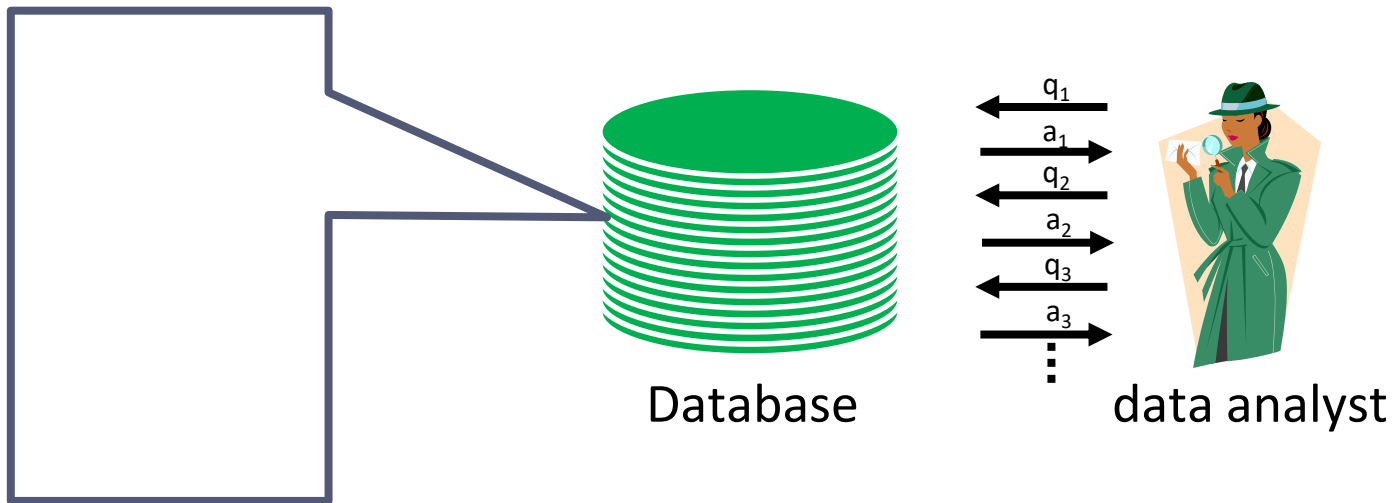
data analyst



▶ **Semantic Security is the Wrong Notion!**



Key Observation



- ▶ Learn the same things even without Good



Differential Privacy

- ▶ The outcome of any analysis is essentially equally likely, independent of whether any individual joins, or refrains from joining, the dataset.



Differential Privacy

M gives ϵ -differential privacy if for all pairs of adjacent data sets x, y , and all events S

$$\Pr[M(x) \in S] \leq e^\epsilon \Pr[M(y) \in S]$$

Randomness introduced by M

Differential Privacy Bounds the Bayes Factor

M gives ϵ -differential privacy if for all pairs of adjacent data sets x, y , and all events S

$$\Pr[M(x) \in S] \leq e^\epsilon \Pr[M(y) \in S]$$

$$\Pr[S|x] \leq e^\epsilon \Pr[S|y]$$

$$\frac{\Pr[S|x]}{\Pr[S|y]} \leq e^\epsilon$$

Privacy for Databases that Teach

- ▶ Database teaches that smoking causes cancer.
 - ▶ Smoker S's insurance premiums rise.
 - ▶ **Premiums rise even if S not in database!**
- ▶ Learning that smoking causes cancer is the whole point.
 - ▶ Smoker S enrolls in a smoking cessation program.
- ▶ **Differential privacy: limit harms to the teachings, not participation**

Bayes Factors Large and Small

- ▶ Modern Cryptography
 - ▶ Complexity theory provides an end run around infinite Bayes factor
- ▶ Differentially Private Data Analysis
 - ▶ Controls the Bayes factor to simultaneously provide privacy and utility





Thank you!



BFF4, Harvard University, May 2, 2017