

CSE5014 CRYPTOGRAPHY AND NETWORK SECURITY

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Formal definition

- Fix A, Π. Define a randomized experiment $Forge_{A,\Pi}(n)$:
 - 1. $k \leftarrow Gen(1^n)$
 - 2. $A(1^n)$ interacts with an *oracle* $Mac_k(\cdot)$; let M be the set of messages submitted to this oracle
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Theorem 4.6 in Textbook



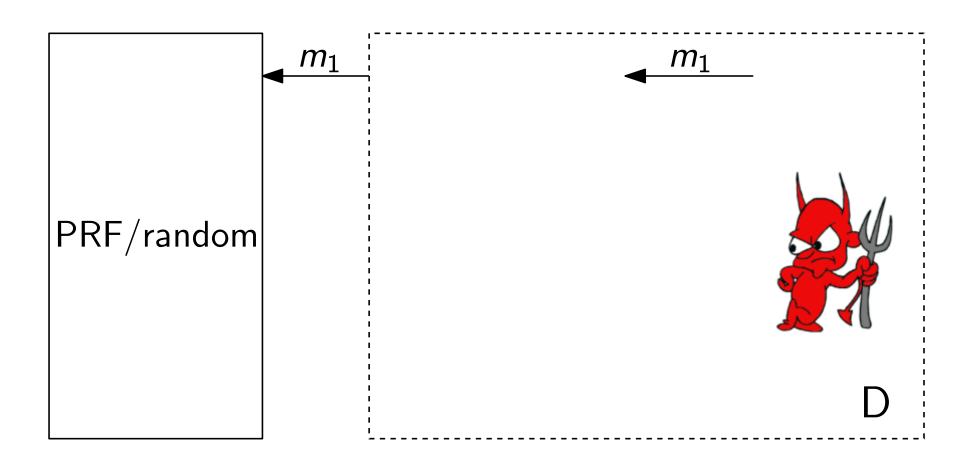


■ Theorem 6.3 Π is a *secure* MAC

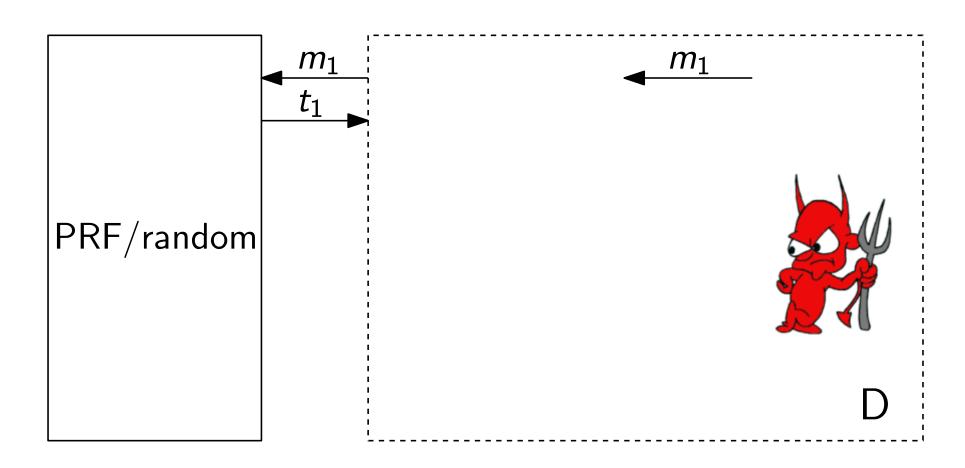
PRF/random



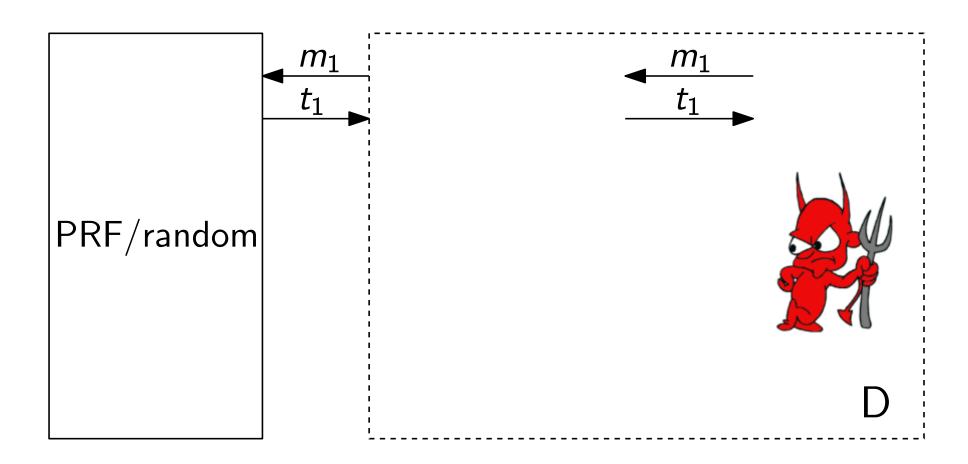




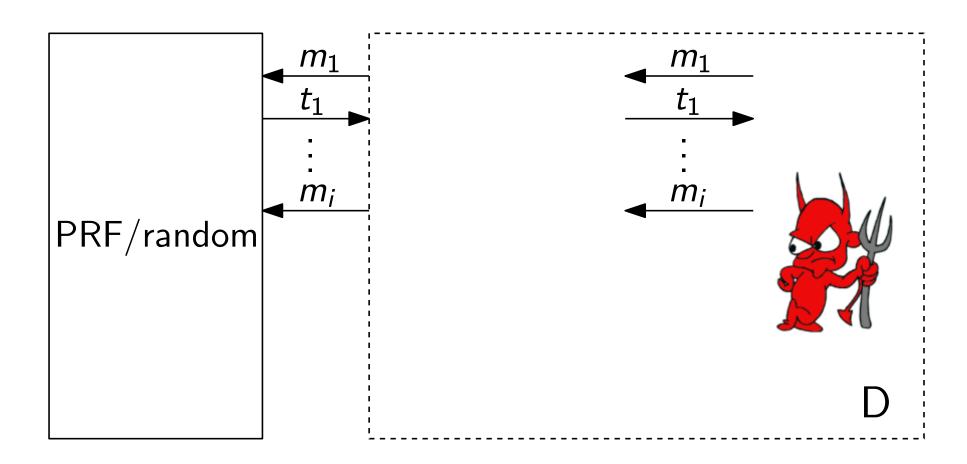




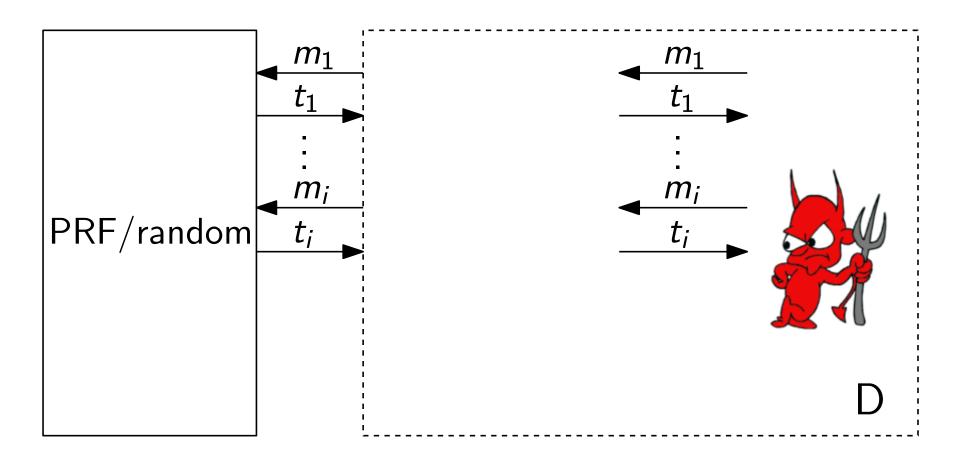




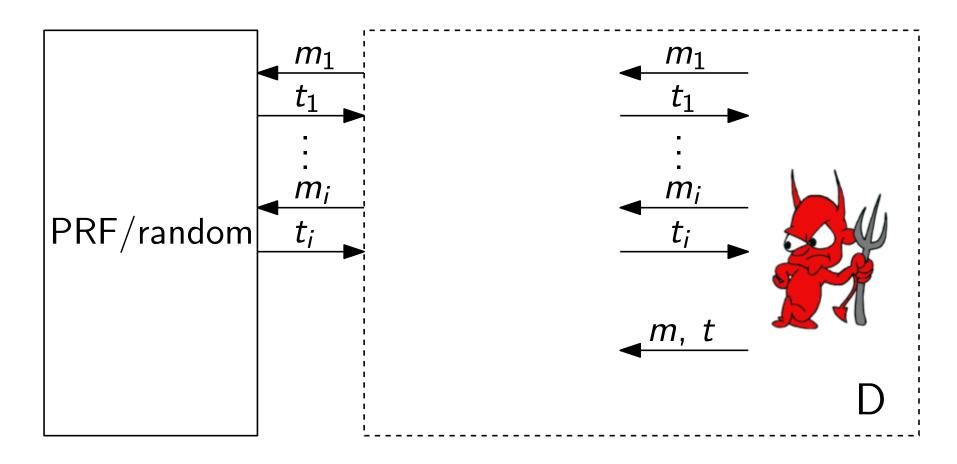




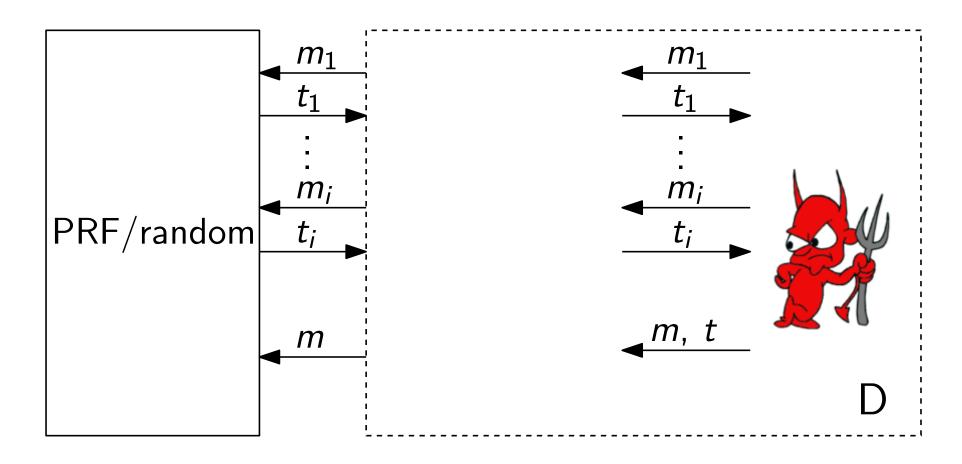




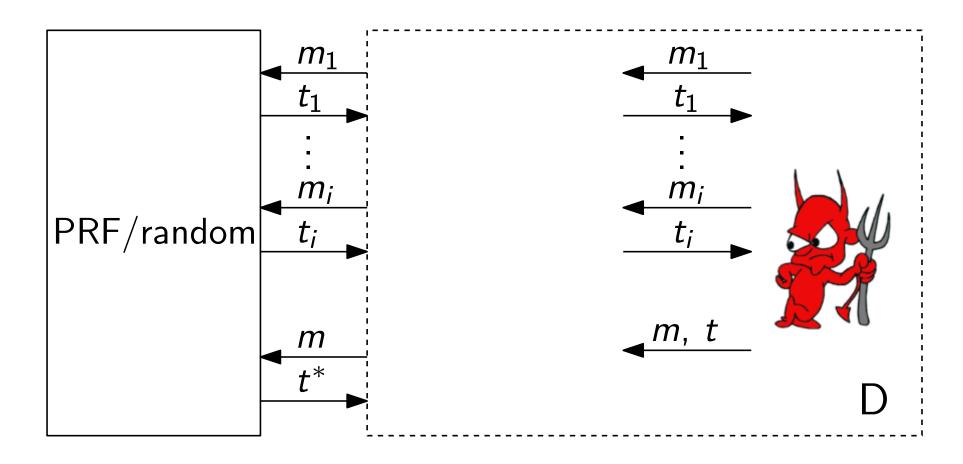




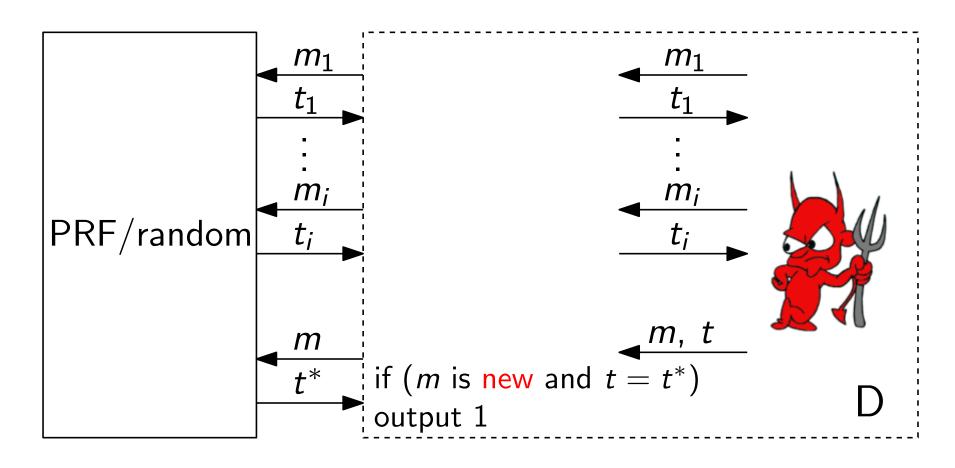














Analysis

• When D interacts with F_k for uniform k, the view of the adversary is *identical* to its view in the real MAC experiment

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 - $-\Pr[D^{F_k} \text{ outputs } 1] = \Pr[Forge_{Adv,\Pi}(n) = 1]$
- When D interacts with uniform f, then seeing $f(m_1), \ldots, f(m_i)$ does not help predict f(m) for any $m \notin \{m_1, \ldots, m_i\}$
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- Since F is a PRF, $|\Pr[D^{F_k} \text{ outputs } 1] \Pr[D^f \text{ outputs } 1]| < negl(n)$ $\Rightarrow \Pr[Forge_{Adv,\Pi}(n) = 1] = \Pr[D^{F_k} \text{ outputs } 1] \le 2^{-n} + negl(n)$



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 - $Vrfy_k'(m_1,\ldots,m_\ell,t_1,\ldots,t_\ell)=1$ iff $Vrfy_k(m_i,t_i)=1$ for all i
 - Is this secure?



- Need to prevent (at least)
 - Block reordering
 - Truncation
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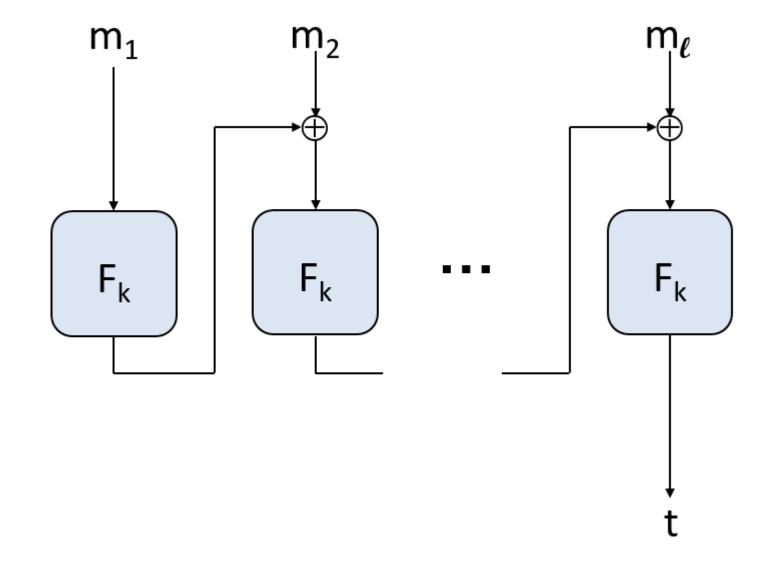
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 - $Mac'_k(m_1, ..., m_\ell) = r, Mac_k(r||\ell||1||m_1), ..., Mac_k(r||\ell||\ell||m_\ell)$
 - See Construction 4.7 & Theorem 4.8
 - Not very efficient. Can we do better?

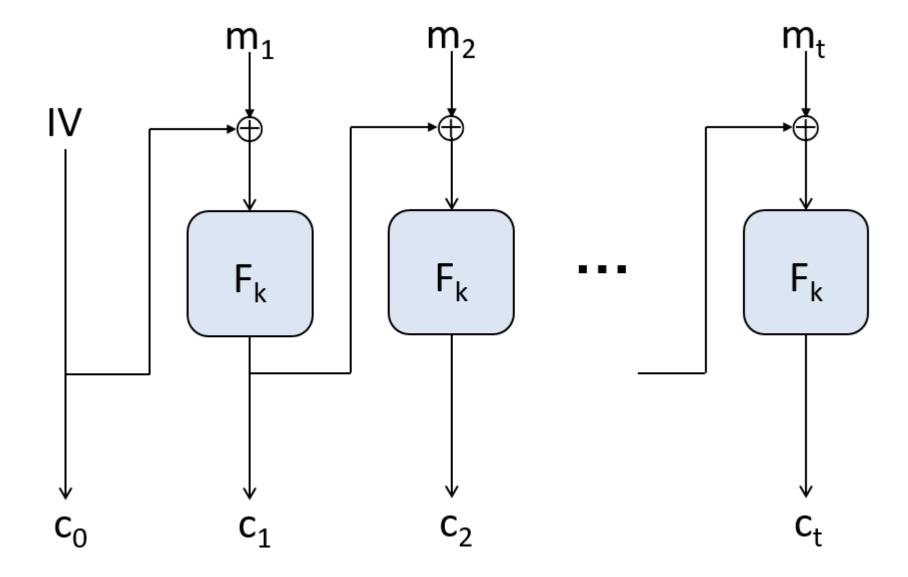


(Basic) CBC-MAC





CBC mode





CBC-MAC vs. CBC-mode

- CBC-MAC is deterministic (no IV)
 - MACs do not need to be randomized to be secure
 - Verification is done by re-computing the result
- In CBC-MAC, only the final value is output
- Both are essential for security



Security of (basic) CBC-MAC

- If F is a PRF with block length n, then for any $\underbrace{\mathsf{fixed}}_{\ell} \ell$ basic CBC-MAC is a secure MAC for messages of length $\ell \cdot n$
- The sender and receiver must agree on the length parameters ℓ in advance
 - Basic CBC-MAC is not secure if this is not done! (Attacks?)

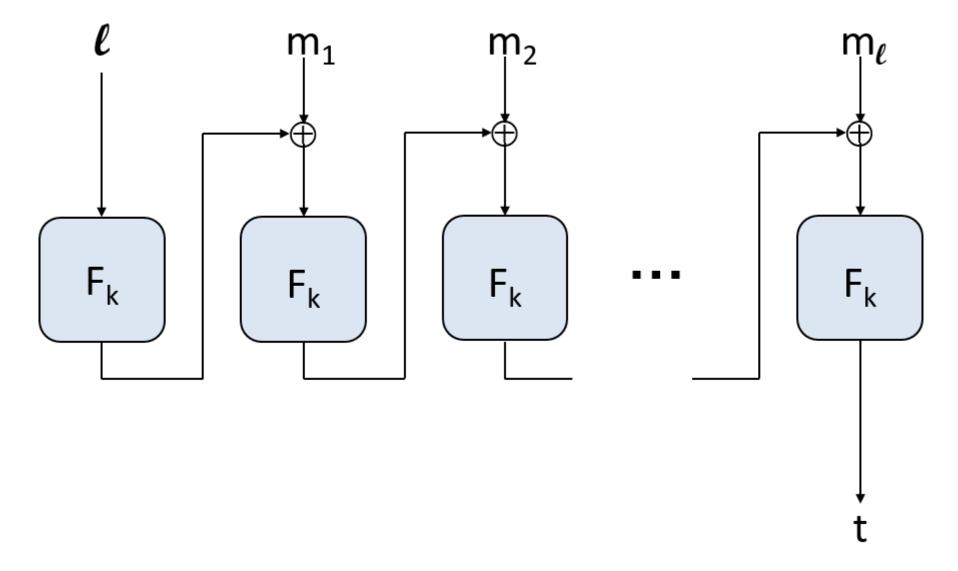


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- The sender and receiver must agree on the length parameters ℓ in advance
 - Basic CBC-MAC is not secure if this is not done! (Attacks?)
- Several ways to handle variable-length messages
 - One of the simplest: prepend the message length before applying (basic) CBC-MAC



CBC-MAC





Authenticated encryption (secrecy + integrity)

We have shown primitives for achieving secrecy and integrity in the private-key setting What if we want to achieve both?



Authenticated encryption (secrecy + integrity)

- We have shown primitives for achieving secrecy and integrity in the private-key setting What if we want to achieve both?
- Secrecy notion: CCA-security
- Integrity notion: unforgeability
 - Adversary cannot generate ciphertext that decrypts to a previously unencrypted message



Constructions

- There are three natural generic constructions:
 - Encrypt and Authenticate (E&A): Compute $c = Enc_{k_1}(m)$ and $t = Mac_{k_2}(m)$ and send (c, t) (SSH style)
 - Authenticate and then Encrypt (AtE): Compute $t = Mac_{k_2}(m)$ and then $Enc_{k_1}(t)$ (SSL style)
 - Encrypt and then Authentication (EtA): Compute $c = Enc_{k_1}(m)$ and $t = Mac_{k_1}(c)$ and send (c, t) (IPSec style)



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Note: In all these methods, we use independent keys (k_1, k_2) for encryption and authentication



Constructions

■ Th

The order of encryption and authentication for protecting communications (Or: how secure is SSL?)*

Hugo Krawczyk[†]

June 6, 2001

Abstract

We study the question of how to generically compose symmetric encryption and authentication when building "secure channels" for the protection of communications over insecure networks. We show that any secure channels protocol designed to work with any combination of secure encryption (against chosen plaintext attacks) and secure MAC must use the encrypt-then-authenticate method. We demonstrate this by showing that the other common methods of composing encryption and authentication, including the authenticate-then-encrypt method used in SSL, are not generically secure. We show an example of an encryption function that provides (Shannon's) perfect secrecy but when combined with any MAC function under the authenticate-then-encrypt method yields a totally insecure protocol (for example, finding passwords or credit card numbers transmitted under the protection of such protocol becomes an easy task for an active attacker). The same applies to the encrypt-and-authenticate method used in SSH.

No

 (k_1)

On the positive side we show that the authenticate-then-encrypt method is secure if the encryption method in use is either CBC mode (with an underlying secure block cipher) or a stream cipher (that xor the data with a random or pseudorandom pad). Thus, while we show the generic security of SSL to be broken, the current standard implementations of the protocol that use the above modes of encryption are safe.



Generic constructions

Generically combine an encryption scheme and a MAC



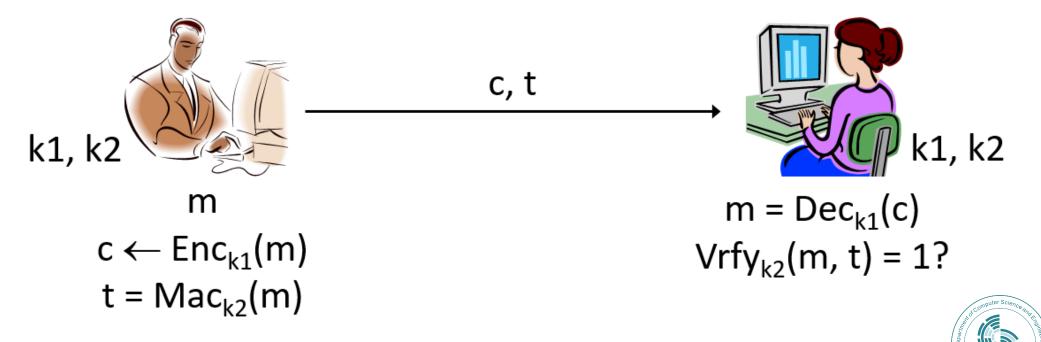
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- Generically combine an encryption scheme and a MAC
- **Goal**: the combination should be an authenticated encryption scheme when instantiated with any *CPA-secure* encryption scheme and any *secure* MAC
- Encrypt and authenticate (E&A)



Problems

- The tag t might leak information about m!
 - Nothing in the definition of security for a MAC implies that it hides information about m
 - So, the combination may not even be EAV-secure

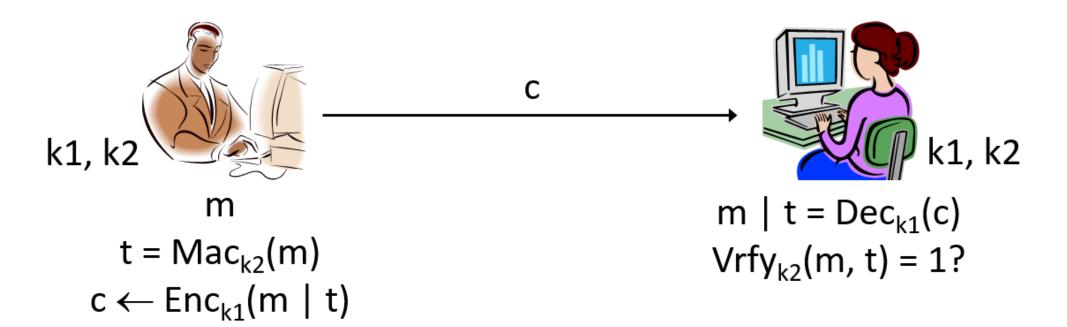


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- If the MAC is deterministic (as is CBC-MAC), then the tag leaks whether the same message is encrypted twice
 - I.e., the combination will not be CPA-secure

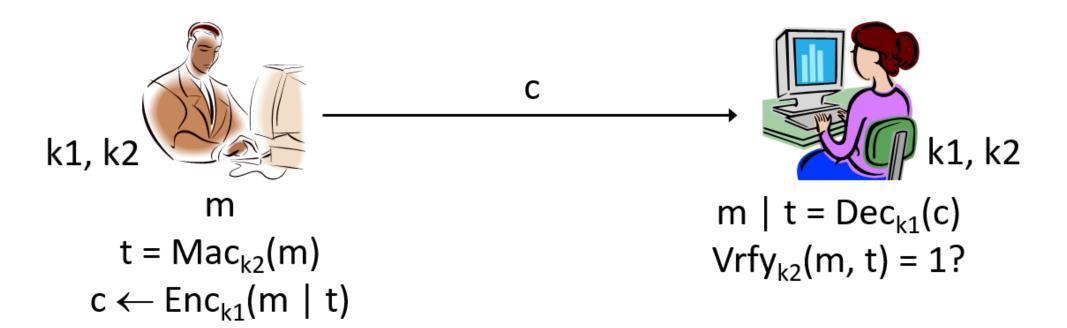


Authenticate then encrypt (AtE)





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Problems

- Padding-oracle attack still works
- Other counterexamples are also possible
- The combination may not be CCA-secure



Idea: consider the CPA-secure entryption scheme in Theorem 5.1, if combined with every secure MAC in the form of AtE, by proving it is malleable, we show that it is not CCA-secure.



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```
Gen(1<sup>n</sup>): choose a uniform key k \in \{0,1\}^n

Enc_k(m), for |m| = |k|

- Choose uniform r \in \{0,1\}^n (nonce/ initialization vector)

- Output ciphertext \langle r, F_k(r) \oplus m \rangle

Dec_k(c_1, c_2): output c_2 \oplus F_k(c_1)
```

Theorem 5.1 If F is a pseudorandom function, then this scheme is CPA-secure.



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- 1. if bit $m_i = 0$, then $(m'_{2i-1}, m'_{2i}) = (0, 0)$
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For decrypting $c = Enc'_k(m')$, one first applies the decryption Dec to obtain m', which is then decoded into m by mapping

$$(0,0)\mapsto 0$$
, $(0,1)$ or $(1,0)\mapsto 1$

If m' contains a pair $(m'_{2i-1}, m'_{2i}) = (1, 1)$, the decoding outputs the invalidity sign \perp .

We consider an active attack: When an attacker Eve sees a transmitted ciphertext $c = Enc'_k(m)$, she can learn the first bit m_1 of m as follows: She intercepts c, flips the first two bits (c_1, c_2) of c, and sends the modified ciphertext c' to its destination. If she can obtain the information of whether the decryption output a valid or invalid plaintext then Eve learns the first bit of m. This is so since the modified c' is valid if and only if $m_1 = 1$.



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In a sense, the MAC just makes things worse since a failure of authentication is easier to be learnt by the attacker.

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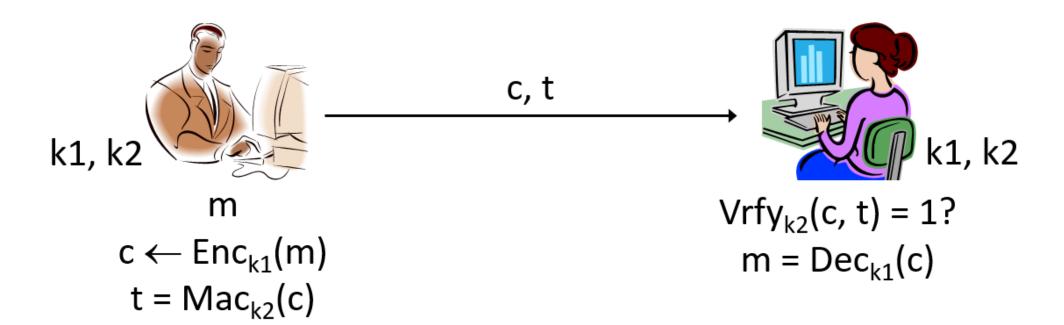
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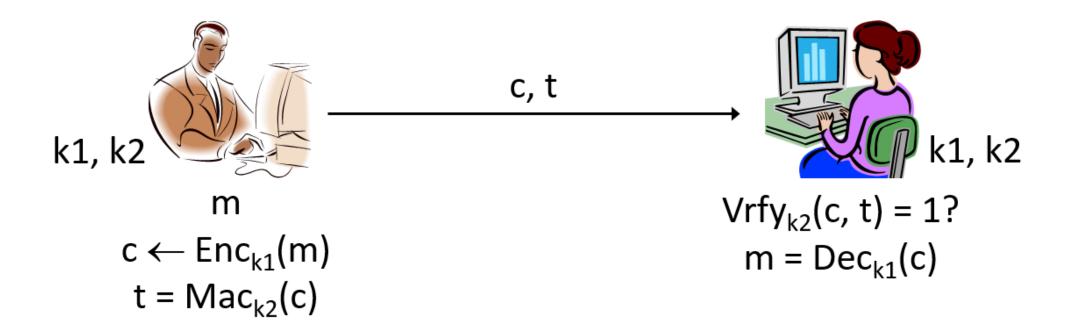
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Read the paper [Krawczyk 2001] & the textbook

Note: This does not mean that SSL is not secure, but does mean that it is not *generically secure*.

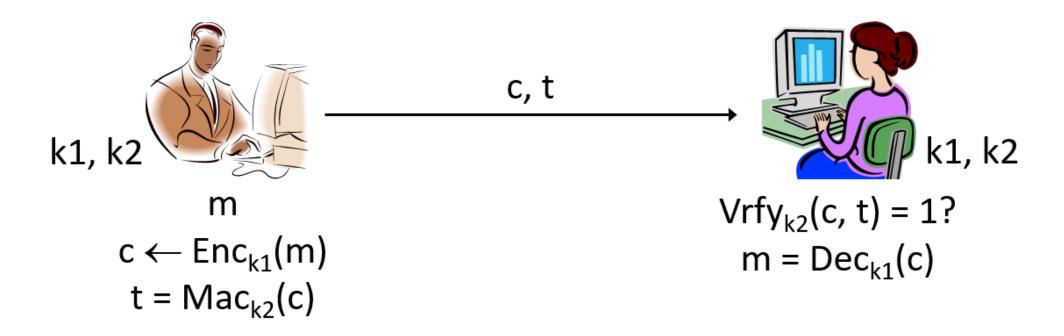






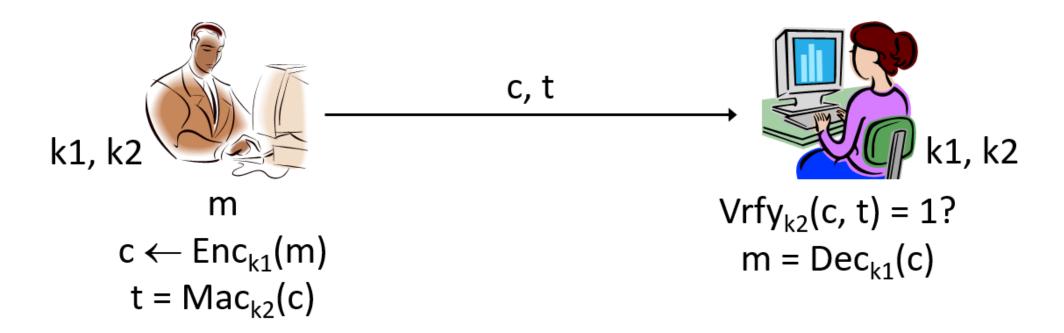
Security

- If the encryption scheme is CPA-secure and the MAC is secure (with unique tags), then this is an authenticated encryption scheme
- It achieves something even stronger: Given ciphertexts corresponding to (chosen) plaintexts m_1, \ldots, m_k , it is infeasible for an attacker to generate any new, valid ciphertext!



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- Encrypt-then-authenticate (with independent keys) is the recommended generic approach for constructing authenticated encryption
- Other, more efficient constructions have been proposed and are an active area of research and standardization https://competitions.cr.yp.to/caesar.html

CAESAR: Competition for Authenticated Encryption: Security, Applicability, and Robustness

Timeline

- M-20, 2012.07.05–06: <u>DIAC</u>: Directions in Authenticated Ciphers. Stockholm.
- M-14, 2013.01.15: Competition announced at the Early Symmetric Crypto workshop in Mondorf-les-Bains; also announced online.
- M-7, 2013.08.11-13: DIAC 2013: Directions in Authenticated Ciphers 2013. Chicago.
- M0, 2014.03.15: Deadline for first-round <u>submissions</u>.
- M2, 2014.05.15: Deadline for first-round software.
- M5, 2014.08.23–24: <u>DIAC 2014</u>: Directions in Authenticated Ciphers 2014. Santa Barbara.
- M16, 2015.07.07: Announcement of second-round candidates.
- M17, 2015.08.29: Deadline for second-round tweaks.
- M18, 2015.09.15: Deadline for second-round software.
- M18, 2015.09.28-29: DIAC 2015: Directions in Authenticated Ciphers 2015. Singapore.
- M27, 2016.06.30: Deadline for Verilog/VHDL.
- M29, 2016.08.15: Announcement of third-round candidates.
- M30, 2016.09.15: Deadline for third-round tweaks.
- M30, 2016.09.26-27: DIAC 2016. Nagoya, Japan.
- M31, 2016.10.15: Deadline for third-round software.
- M40, 2017.07.15: Deadline for third-round Verilog/VHDL.
- M40, 2017.07.15: Deadline for optimized third-round software.
- M48, 2018.03.05: Announcement of finalists.
- M59: 2019.02.20: Announcement of final portfolio.

authenticated encryption

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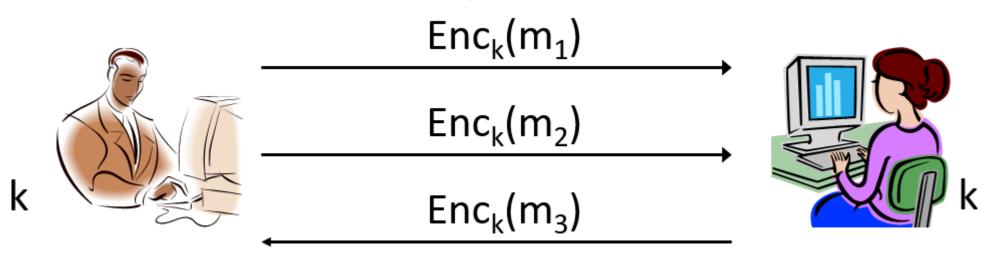
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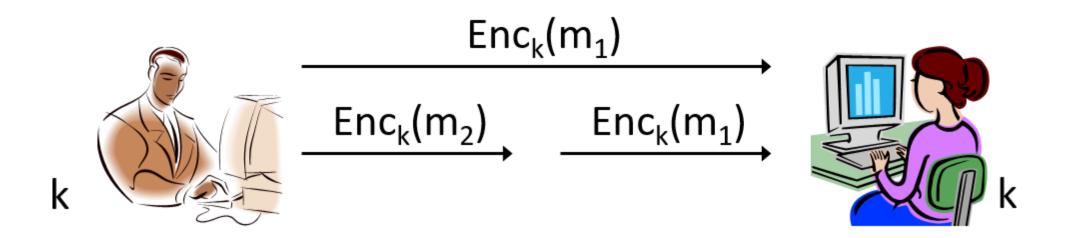


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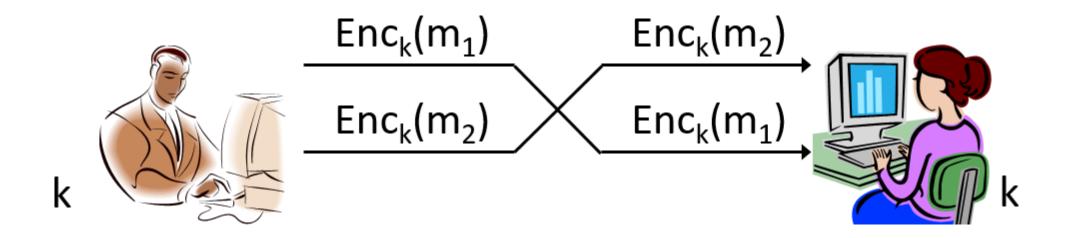


Replay attack



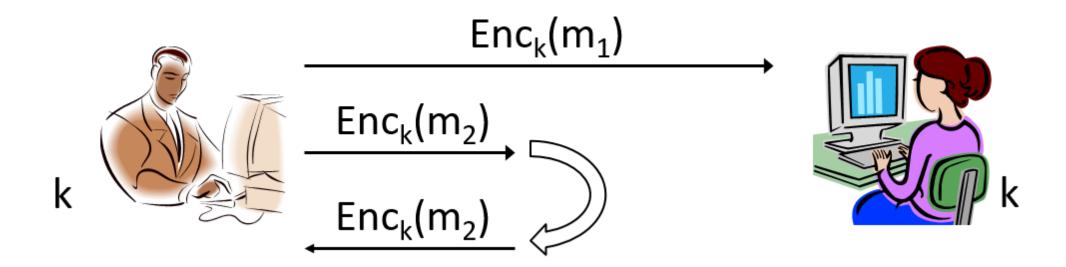


Re-ordering attack





Reflection attack



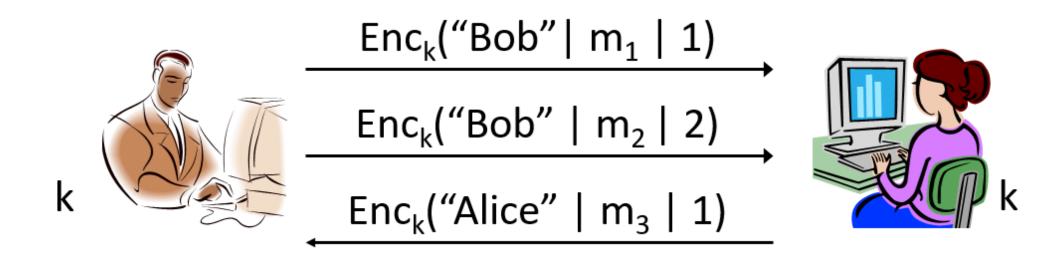


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Secure sessions

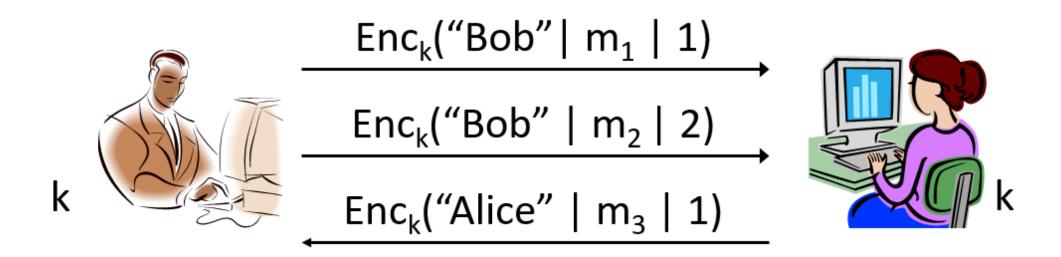
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Secure sessions

- These attacks (and many others) can be prevented using counters/sequence numbers and identifiers
 - Can also use a directionality bit in place of identifiers





Hash functions

Cryptographic) hash function: deterministic function mapping arbitrary length inputs to a short, fixed-length output (sometimes called a digest)



Hash functions

- (Cryptographic) hash function: deterministic function mapping arbitrary length inputs to a short, fixed-length output (sometimes called a digest)
- Hash functions can be keyed or unkeyed
 - In practice, hash functions are unkeyed
 - We will assume unkeyed hash functions for simplicity



- Let $H:\{0,1\}^* \to \{0,1\}^\ell$ be a hash function
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 - Note that collisions are guaranteed to exist!
 - If we compute $H(x_1), \ldots, H(x_{2\ell+1})$, we are guaranteed to find a collision.
 - Can we do better?



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 - What is the probability of a collision?
- Related to the so-called birthday paradox
 - How many people are needed to have a 50% chance that some two people share a birthday?



Event A: at least two people in the room have the same birthday
Event B: no two people in the room have the same birthday

$$Pr[A] = 1 - Pr[B]$$

$$\Pr[B] = \left(1 - \frac{1}{365}\right) \cdot \left(1 - \frac{2}{365}\right) \cdot \dots \cdot \left(1 - \frac{n-1}{365}\right)$$
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Recall that
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Let n(p; H) be the smallest number of values we have to choose, such that the probability for finding a collision is at least p. By inverting the expression above, we have

$$n(p; H) \approx \sqrt{2H \ln \frac{1}{1-p}}.$$



Next Lecture

■ hash ...

