

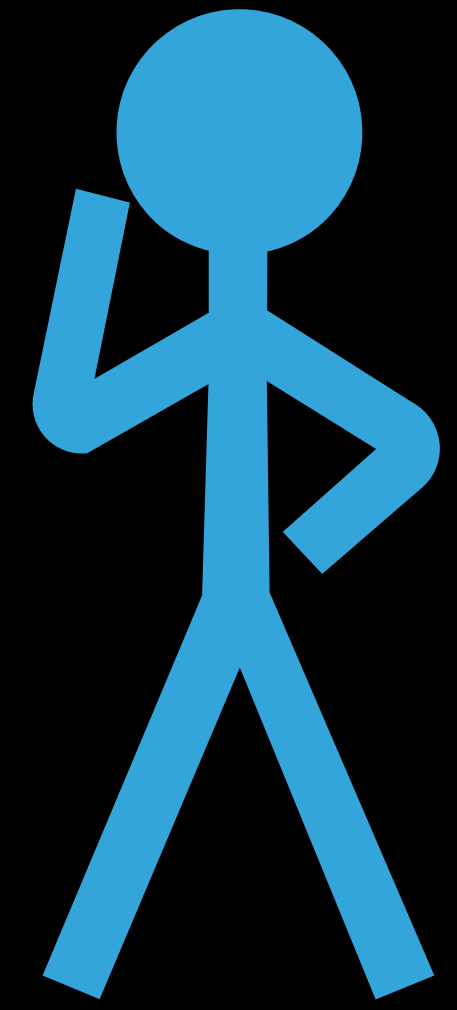
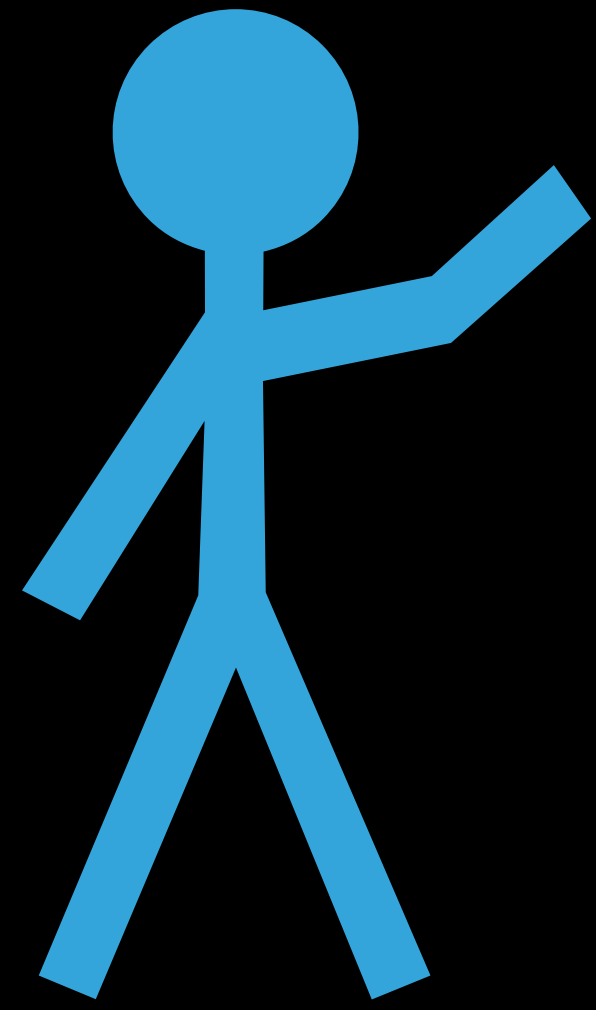
Reasoning about Aggregation of Information in Timing Attacks

Itsaka Rakotonirina

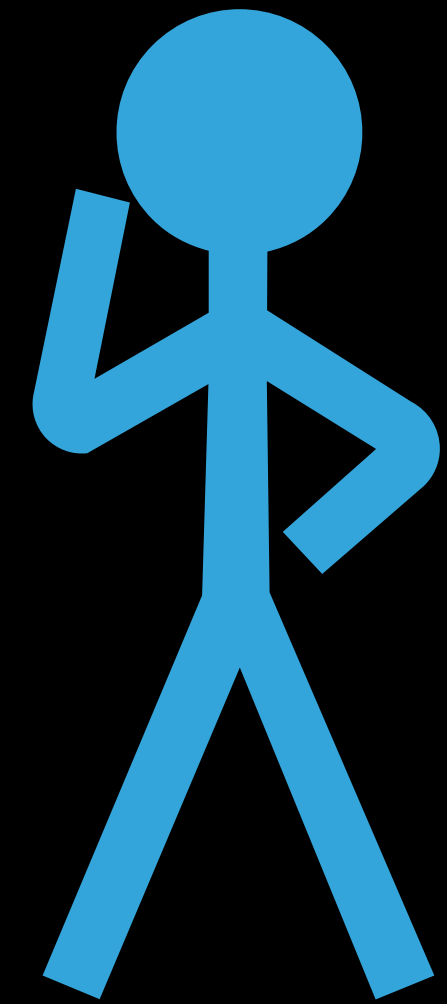
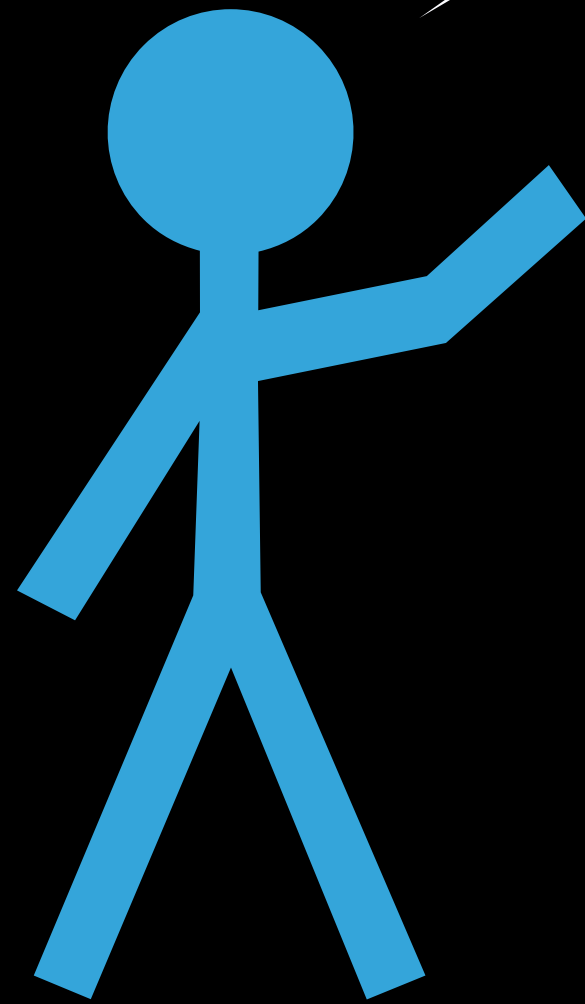
INRIA Nancy Grand-Est

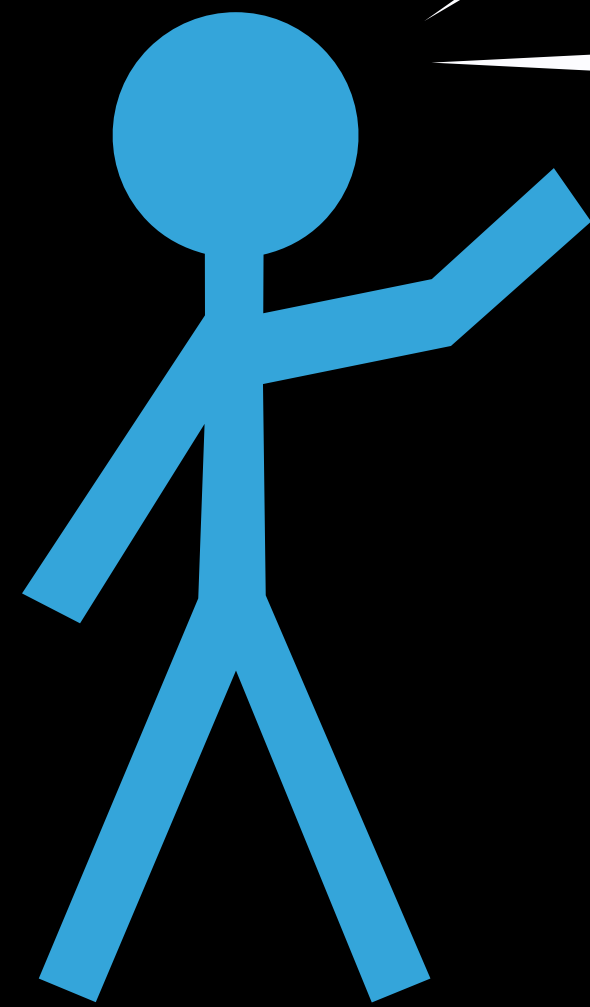
Boris Köpf

Microsoft Research



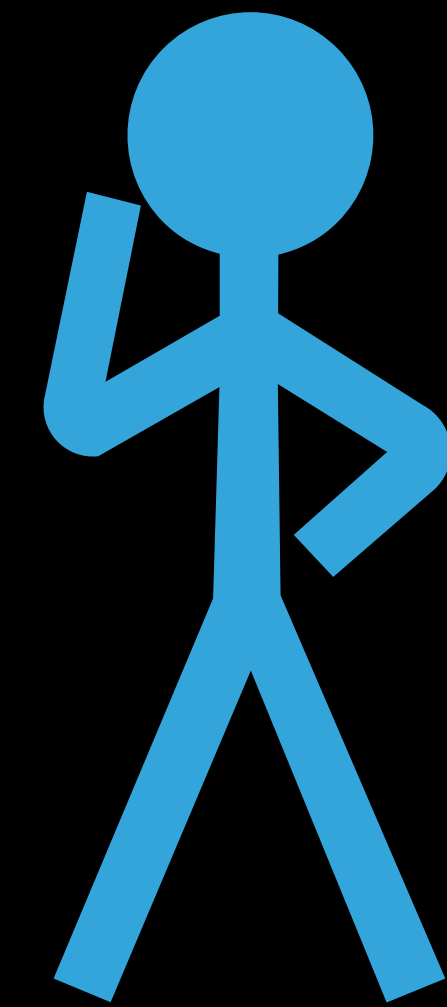
Choose a letter: A or B.





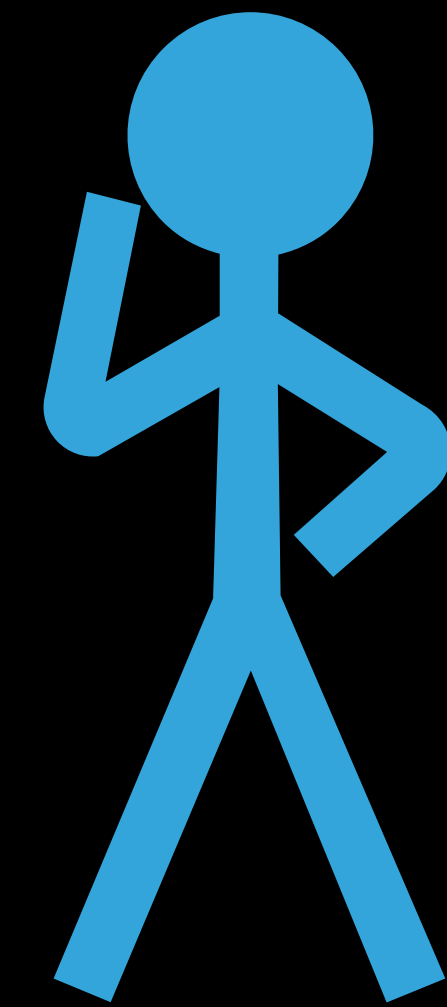
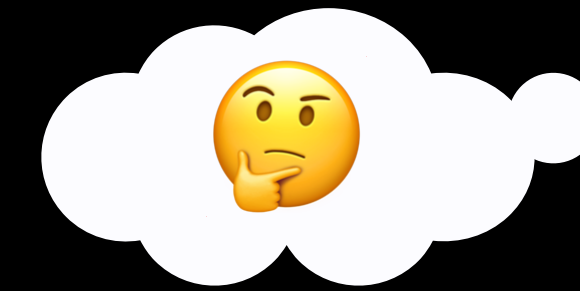
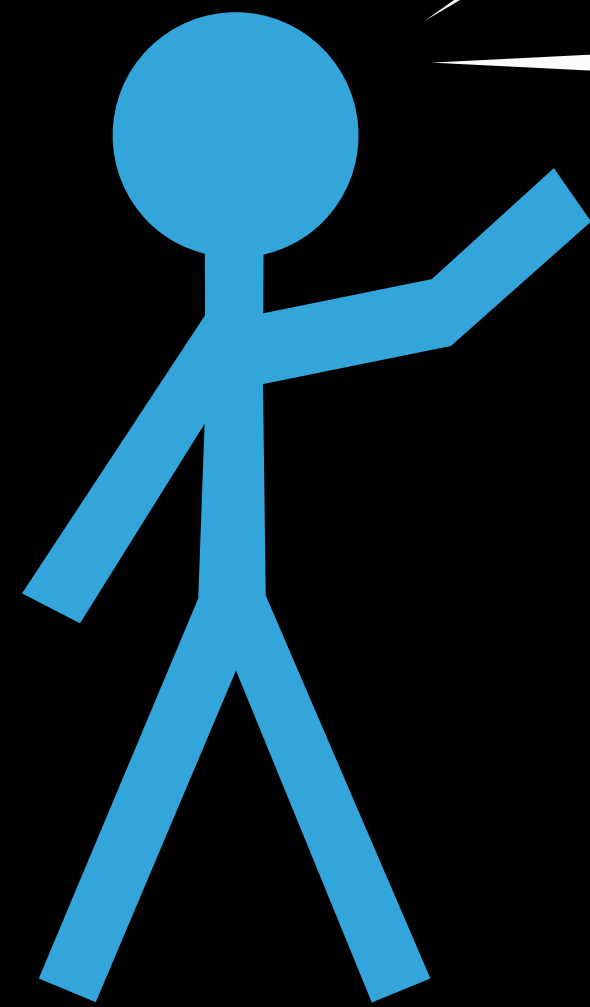
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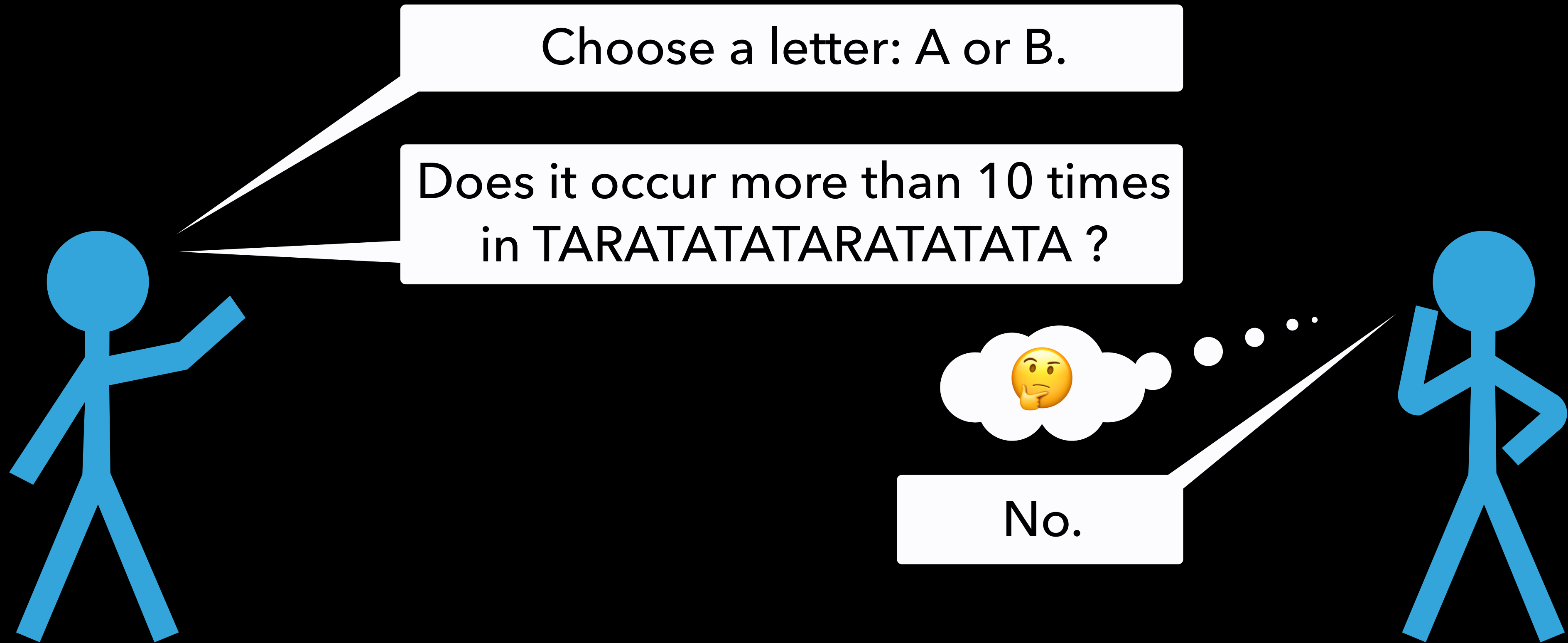
Does it occur more than 10 times
in TARATATATARATATATA ?

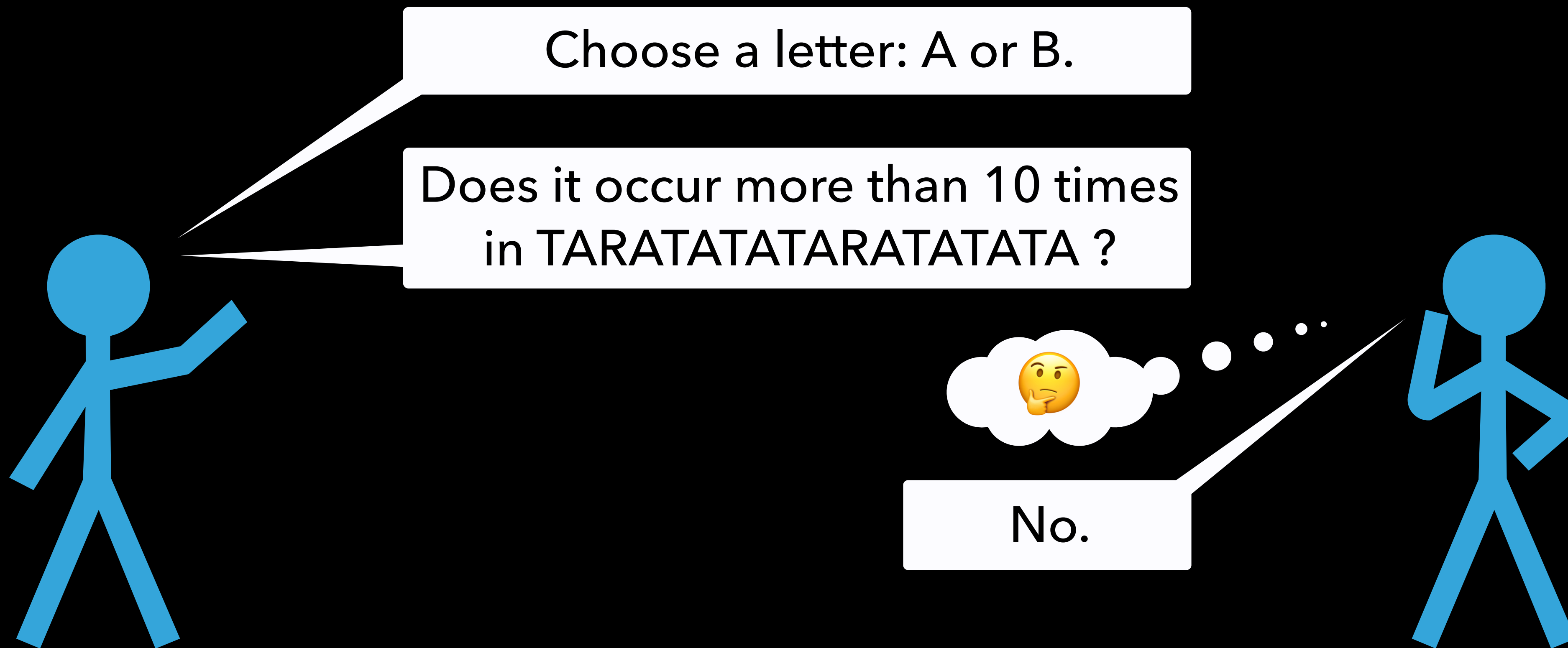


Choose a letter: A or B.

Does it occur more than 10 times
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Q : Which letter was chosen?

Timing attacks

- 1996 on RSA (Kocher)
- 1998 on RSA (Dhem *et al.*)
- 2005 on AES (Bernstein)
- 2007 on AES (Aciğmez *et al.*)
- 2013 Lucky Thirteen (AlFardan, Paterson)
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⋮

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A long-term secret, and queries to an oracle
 $O : \text{public input} \mapsto \text{execution time of a program}$

Remote measurements

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Exploit timing variations, and not the
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Differential measurements

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The secret is recovered chunk by chunk

Compositionality

Timing attacks

Attacker model

A long-term secret, and queries to an oracle
 $O : \text{public input} \mapsto \text{execution time of a program}$

Remote measurements

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Differential measurements

Under what hypotheses?

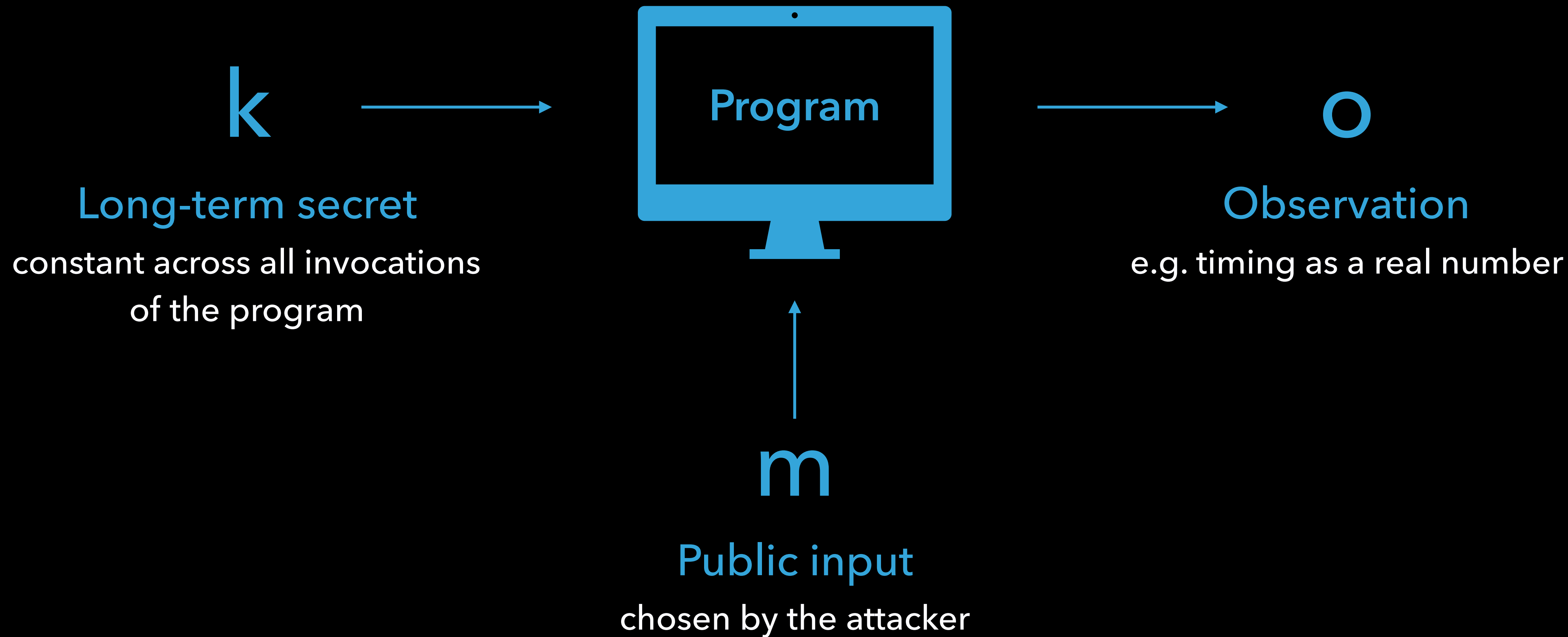
The secret is recovered chunk by chunk

Compositionality

Contributions

- ⊕ A model of timing attacks
capturing the essence of compositional attacks
- ⊕ Core hypotheses giving rise to efficient attacks
under the form of independence properties
- ⊕ Generic attack descriptions + cost analyses

A model for timing leakage



A simple example

```
1  for i = 0 to n - 1 do  
2  |  if k[i] ≠ m[i] then g()  
3  done
```


A simple example

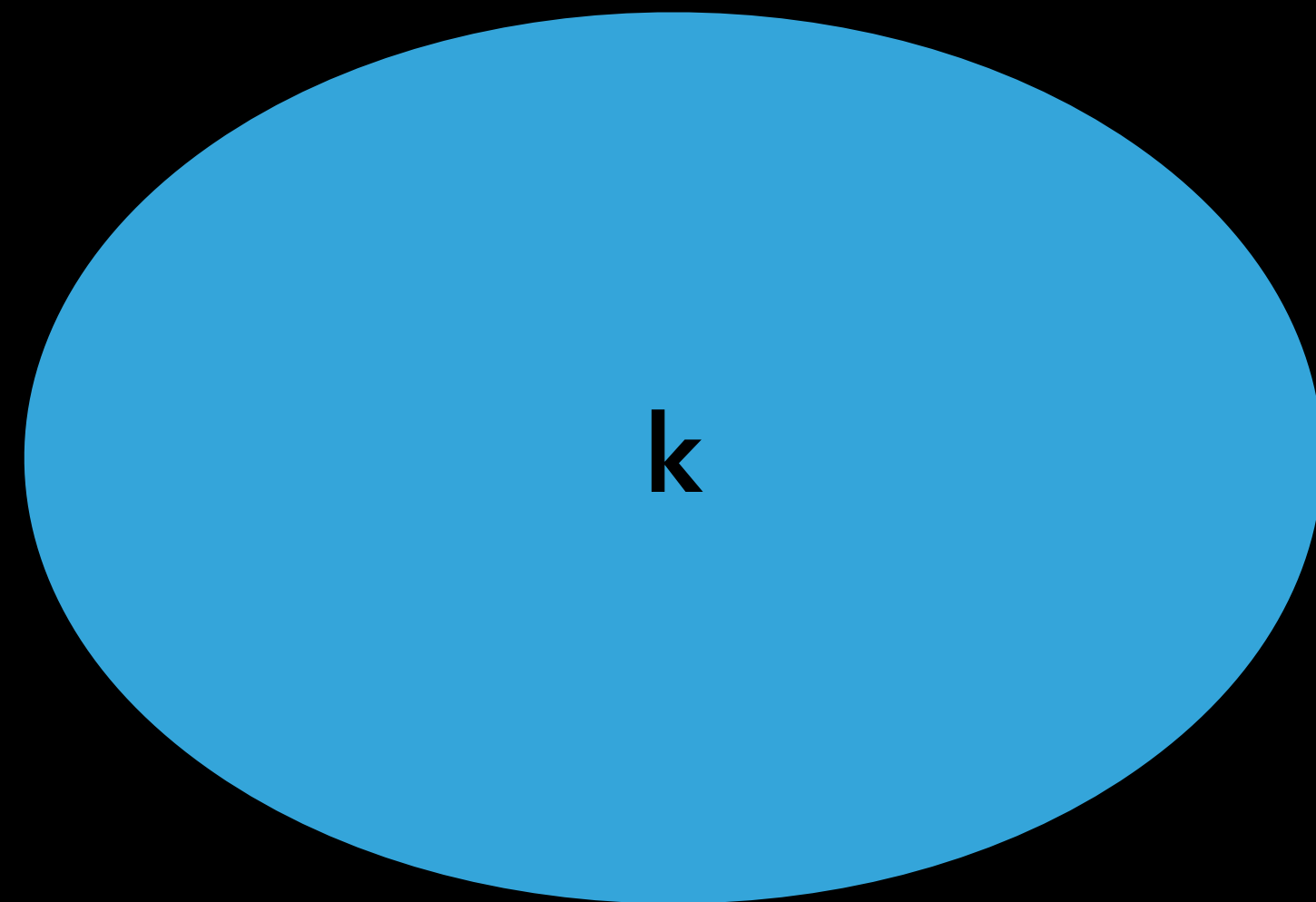
```
1  for i = 0 to n - 1 do  
2  |  if k[i] ≠ m[i] then g()  
3  done
```

execution time proportional to:

$$t(k,m) = \sum_{i=1}^n k[i] \oplus m[i] = \text{nb of bits where } k \text{ and } m \text{ differ}$$

Hamming distance

Aggregation of information

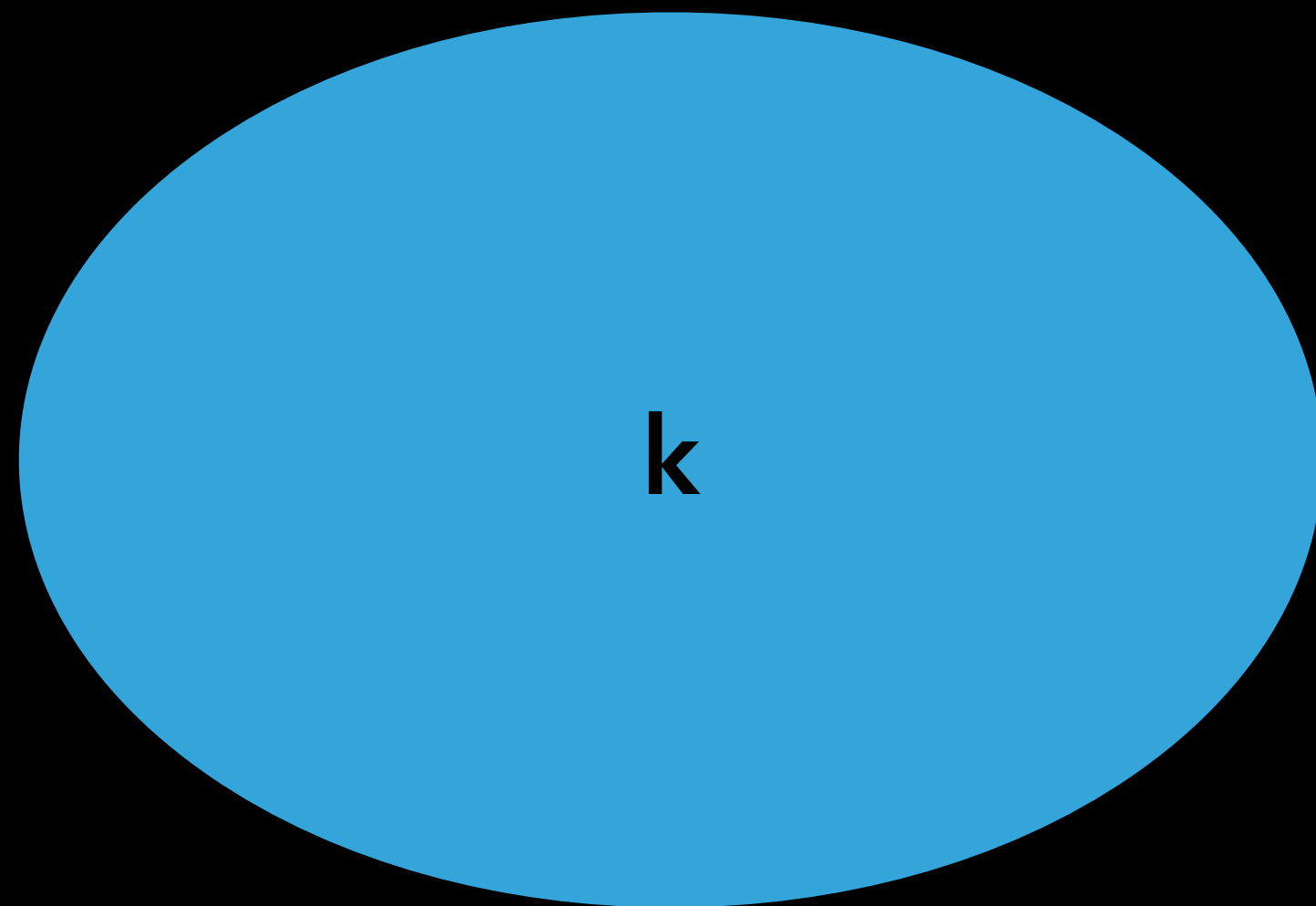


potential values of
the long-term secret

$$t(k,m) = \sum_{i=1}^3 k[i] \oplus m[i]$$

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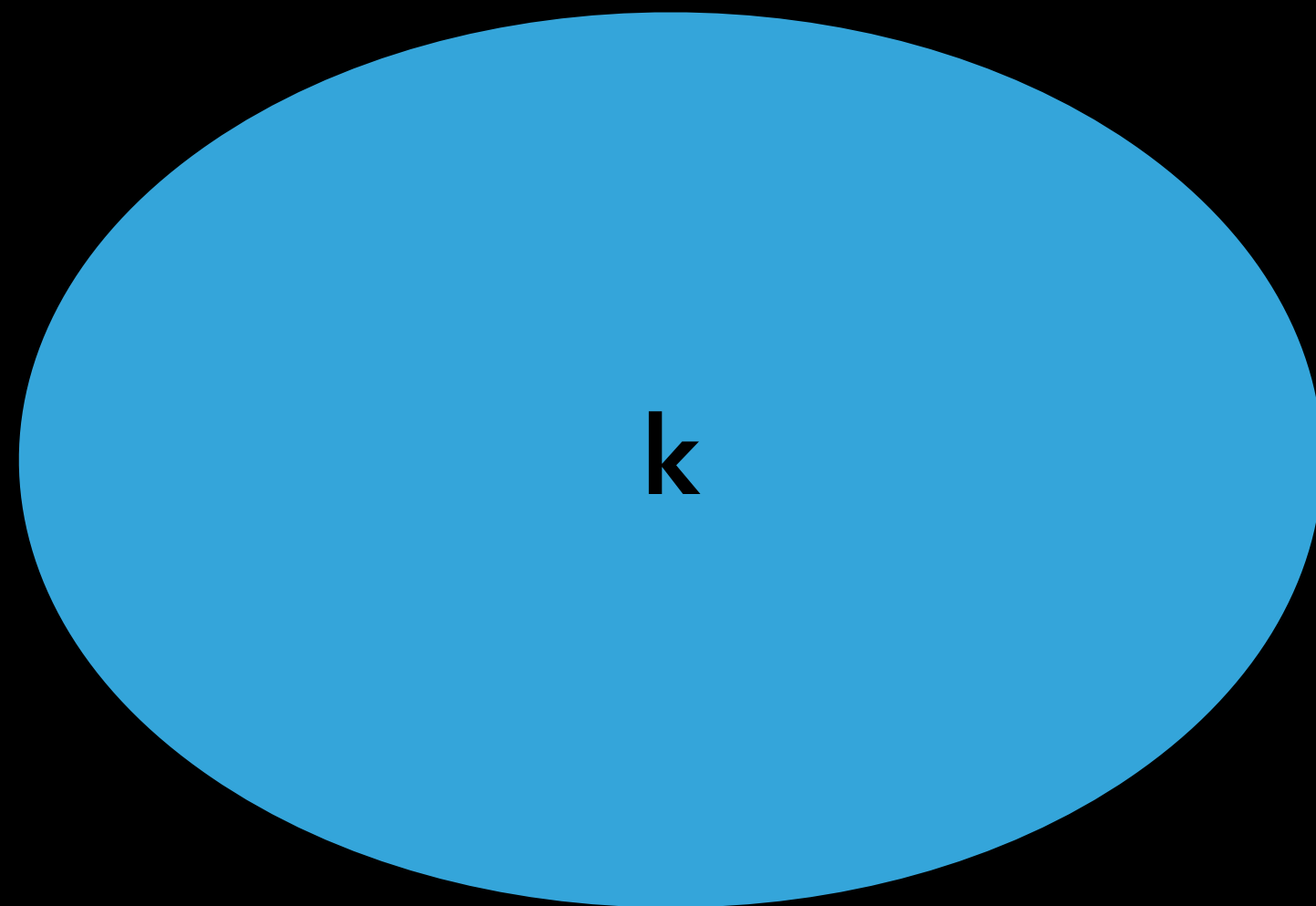
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$$000 \mapsto 0 = t(k,000) \in \{0,1,2,3\}$$

Aggregation of information



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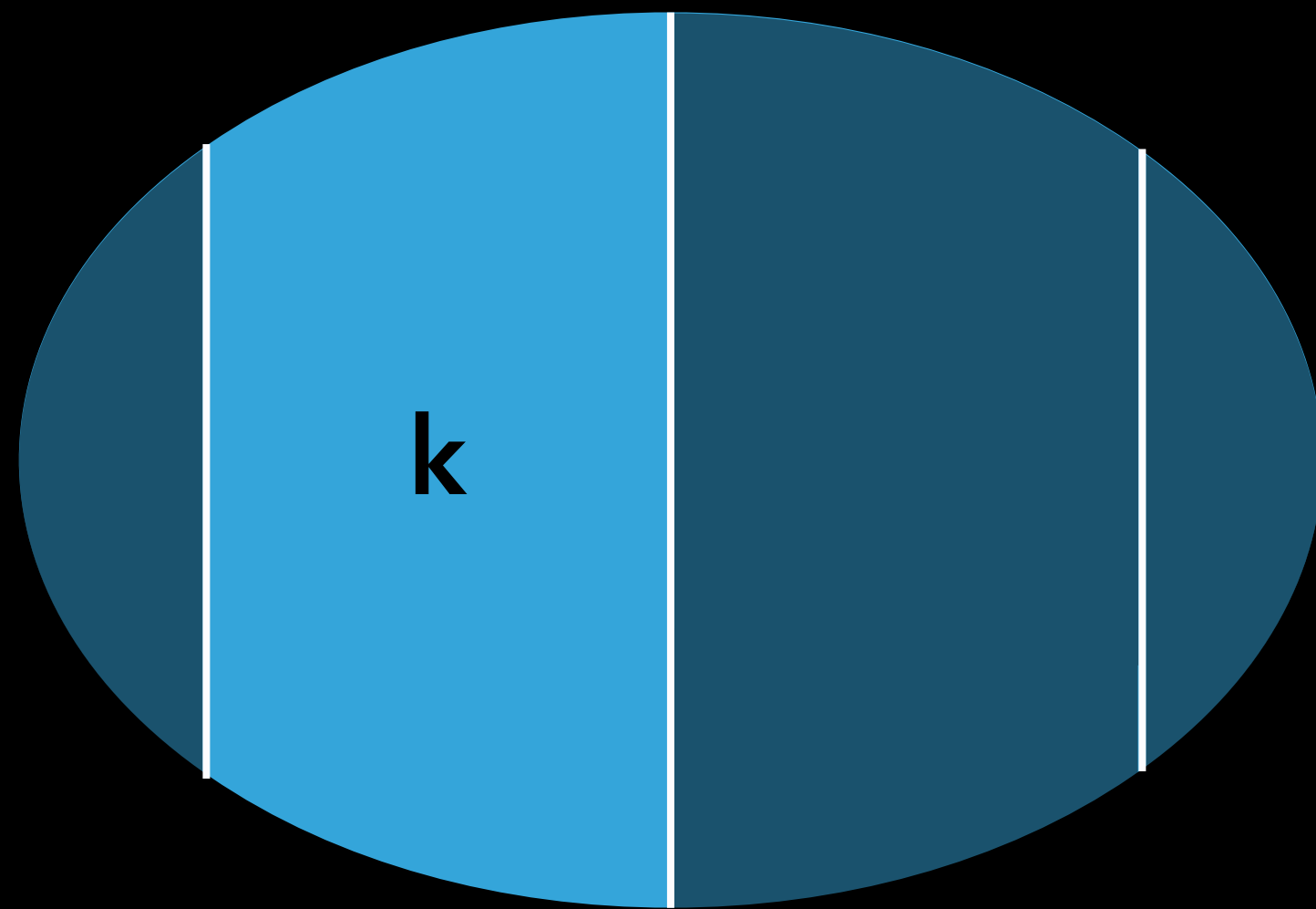
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$$\Rightarrow k \in \{ k' \mid t(k',000) = 0 \}$$

Aggregation of information



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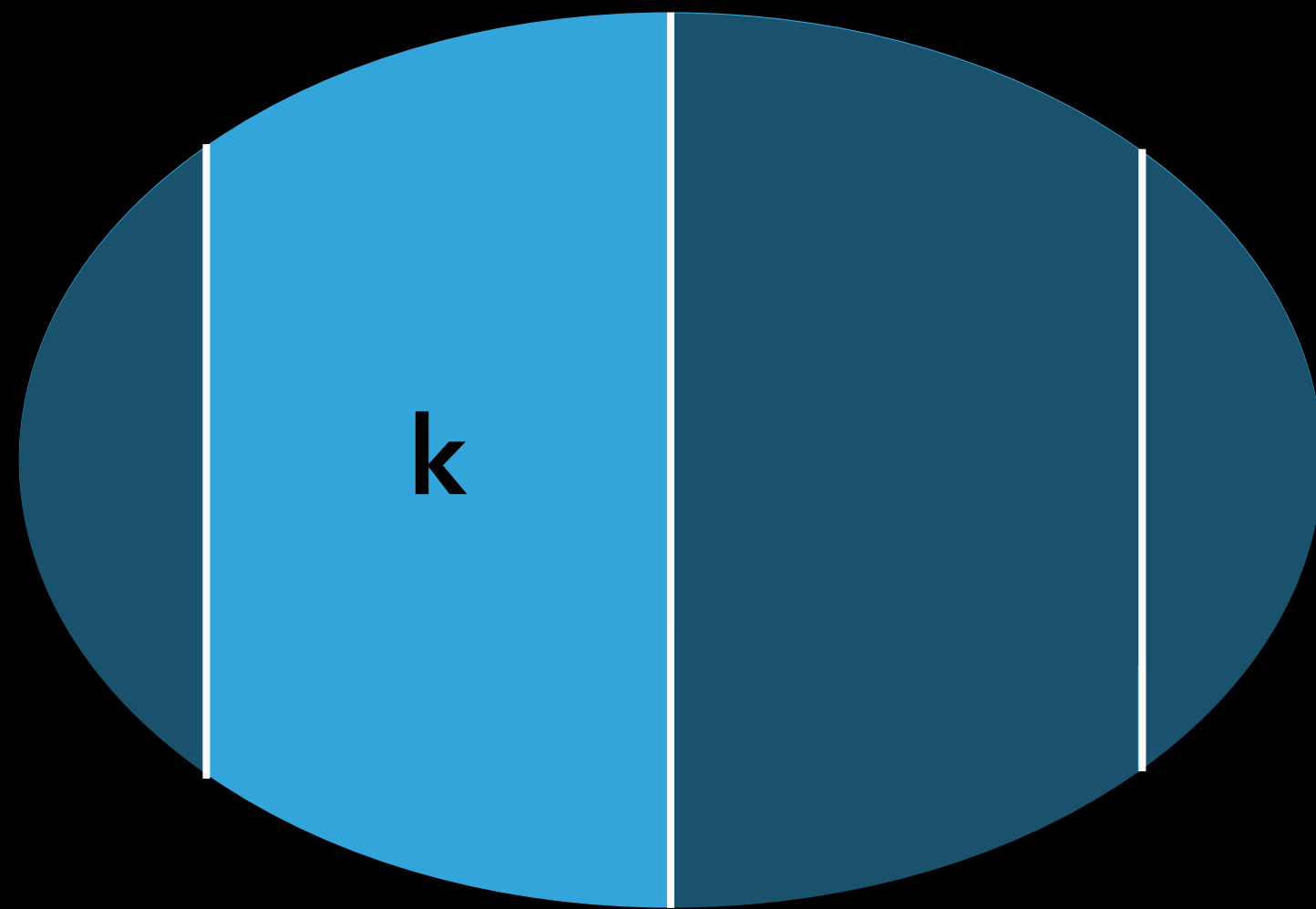
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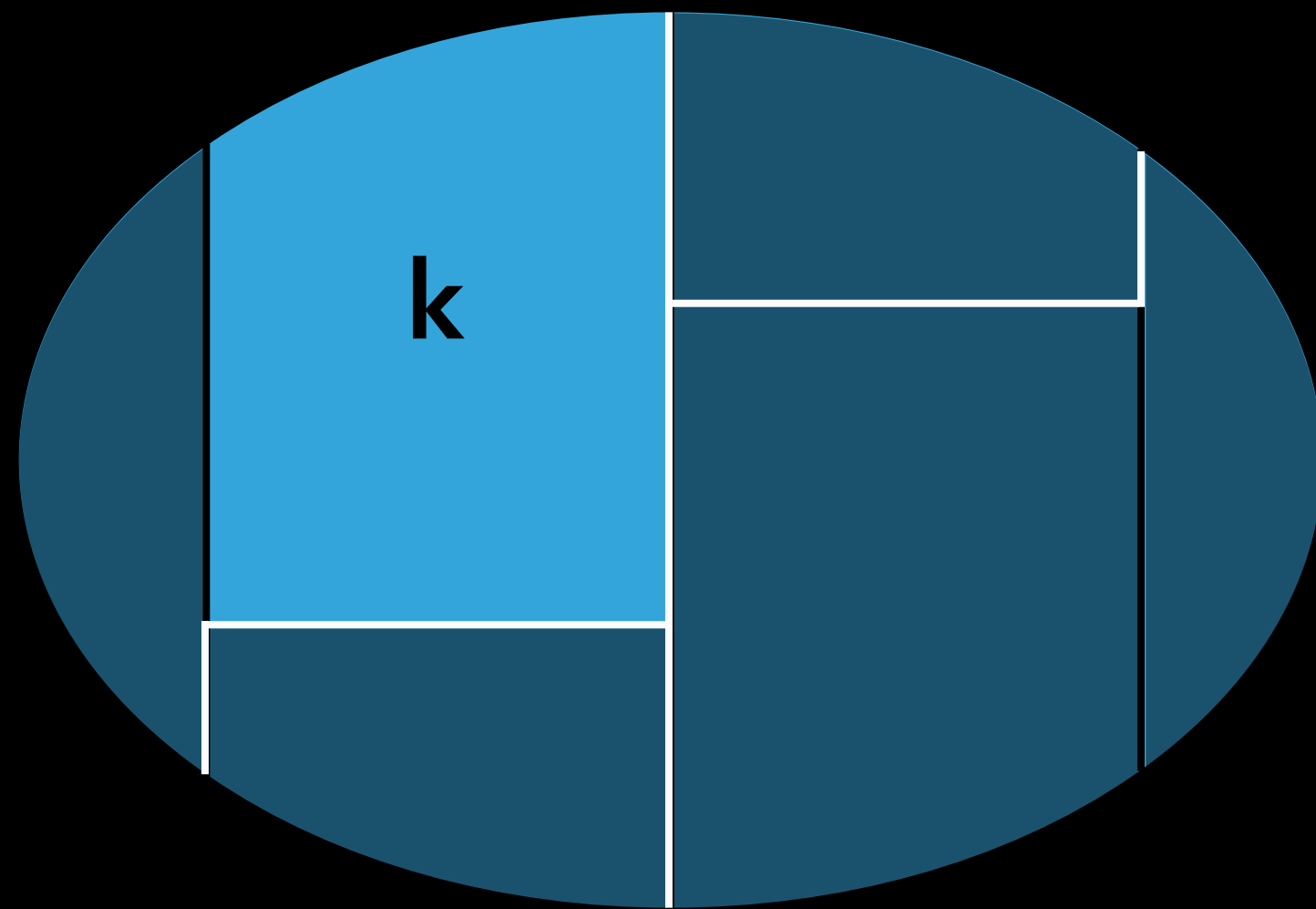
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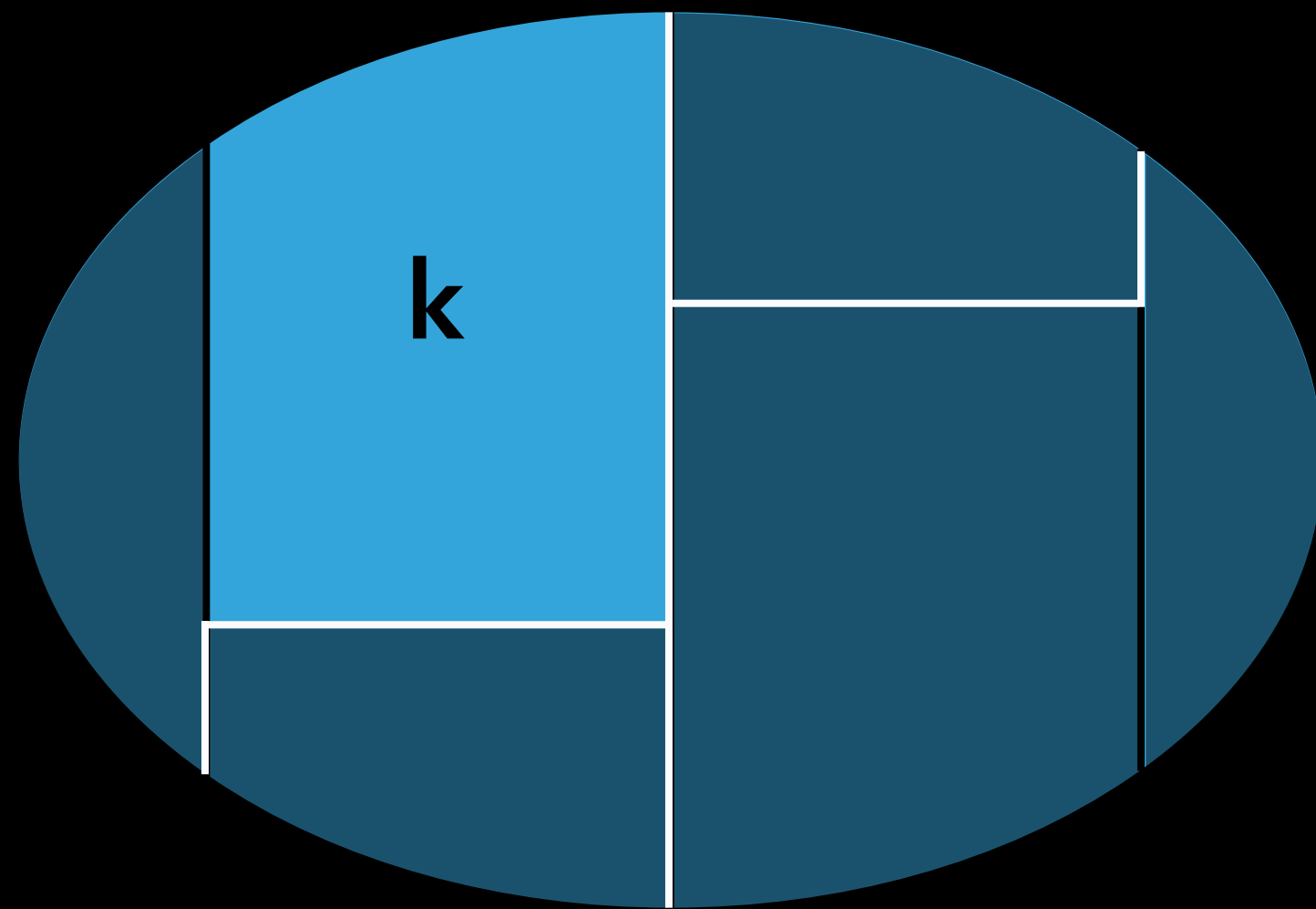
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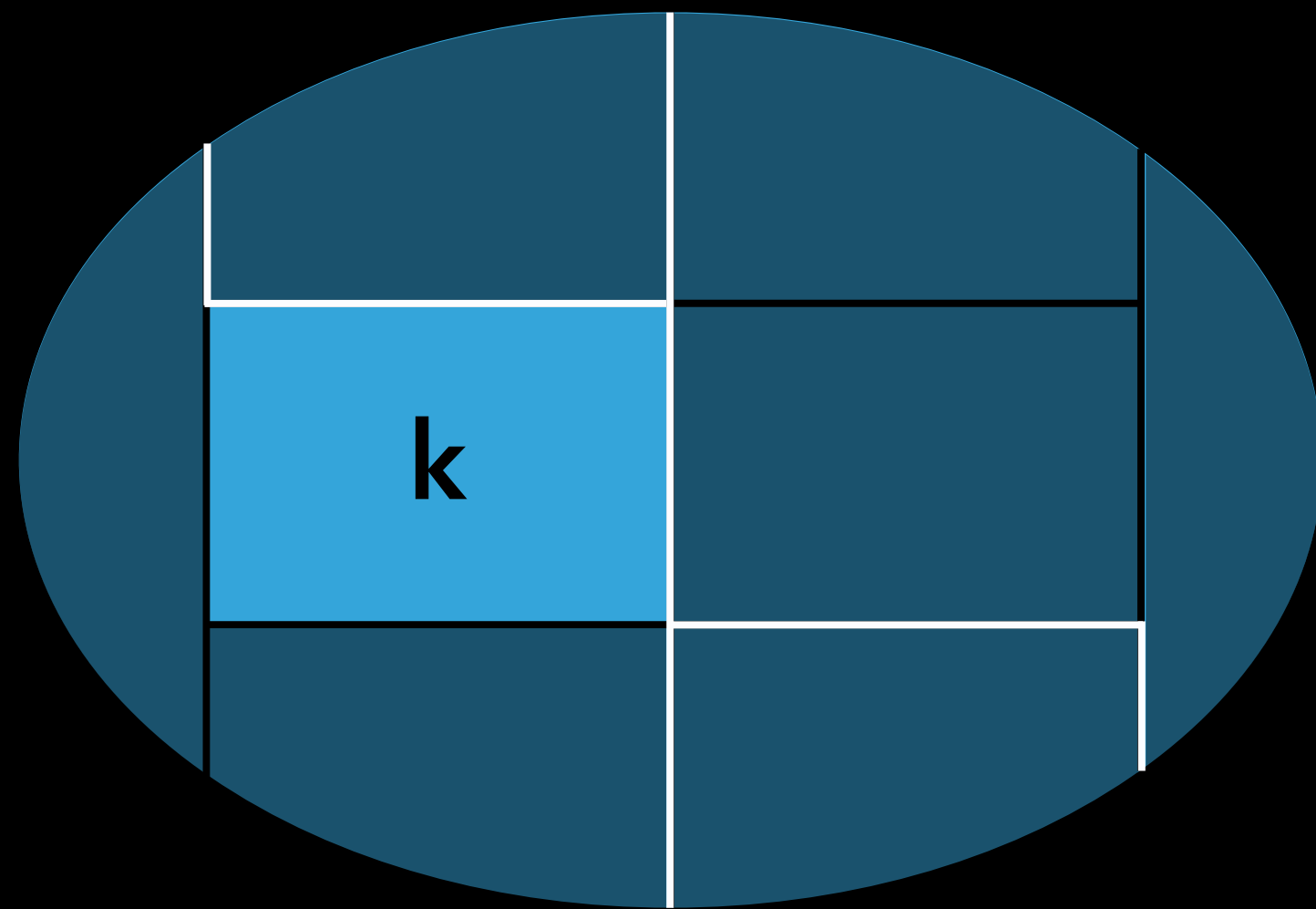
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$$001 \mapsto o' = t(k,001)$$

$$010 \mapsto o'' = t(k,010)$$

Aggregation of information



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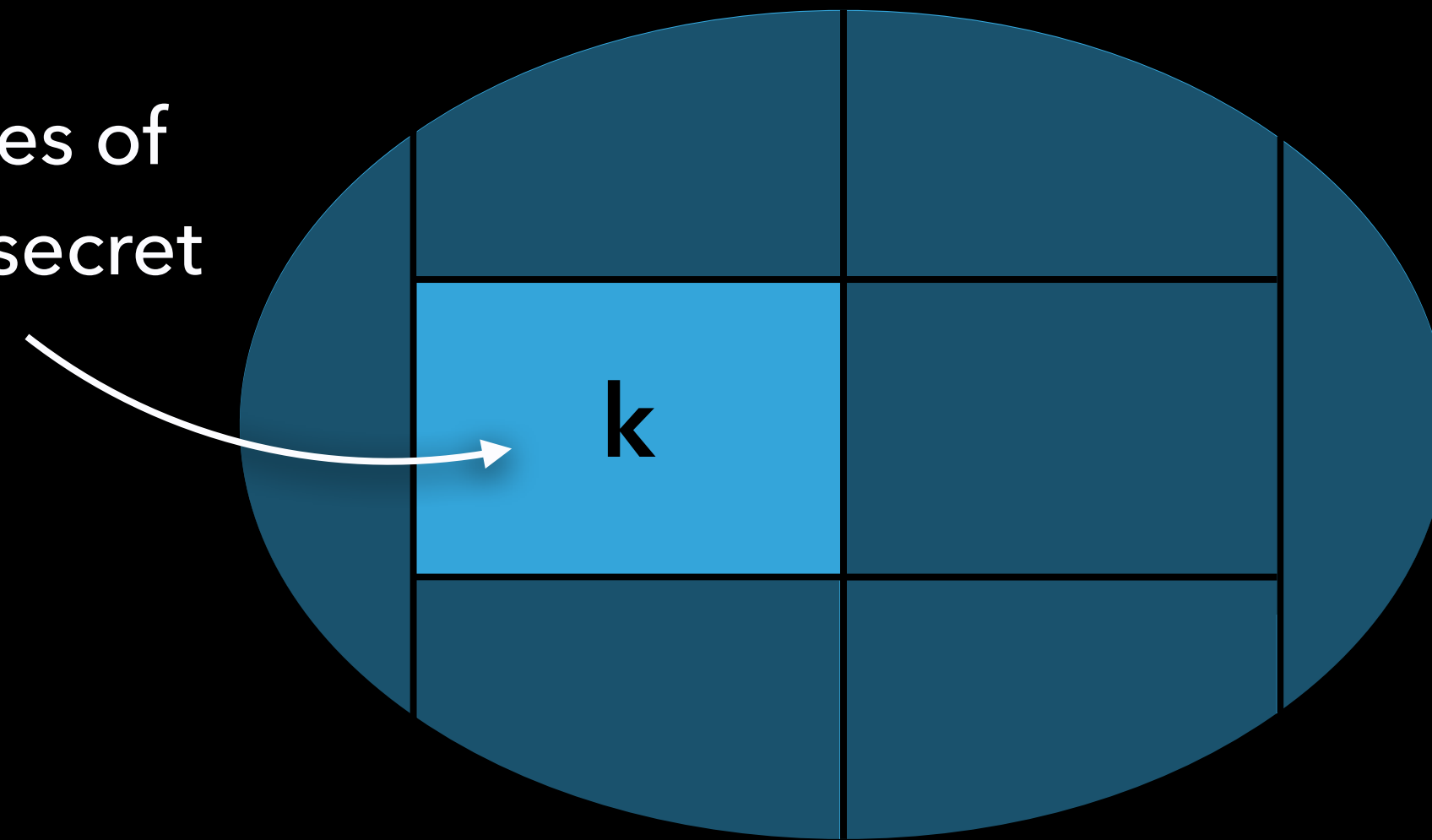
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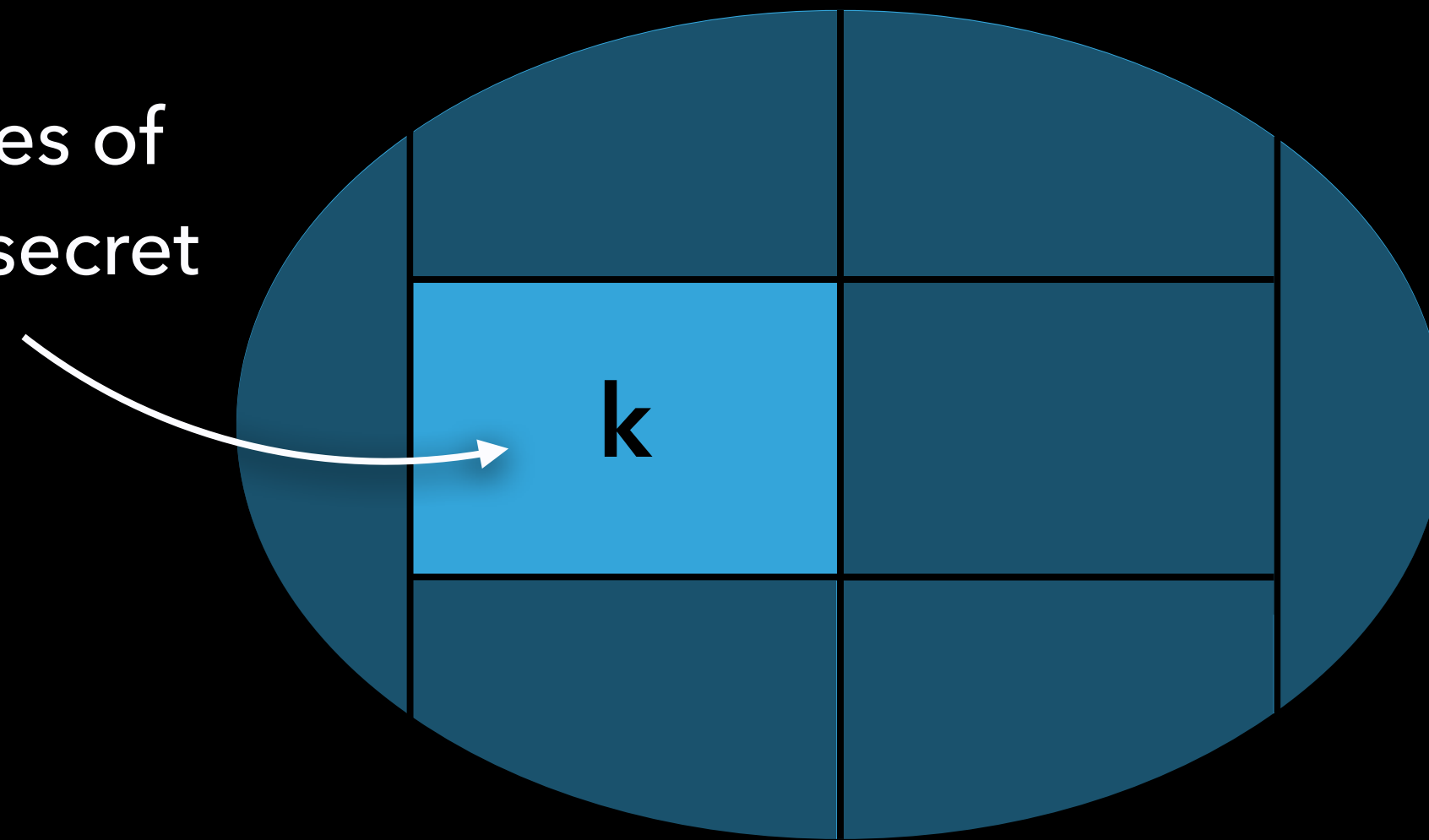
Aggregation of information

potential values of
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Aggregation of information

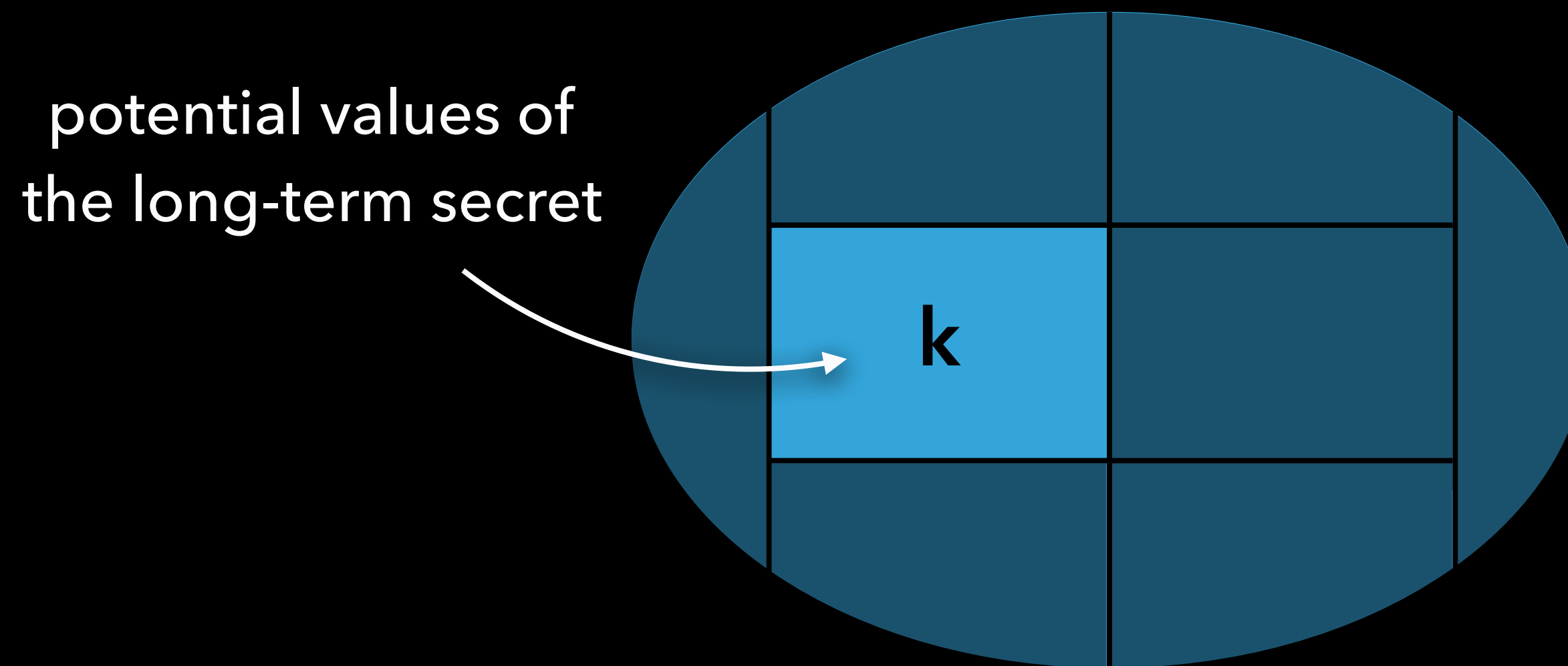
potential values of
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Compute this equivalence relation
over the set of secrets

static approach
(security bounds)

Aggregation of information



Compute this equivalence relation
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static approach
(security bounds)

Given an oracle to $\mathbf{t}(\mathbf{k}, \cdot)$,
retrieve the class enclosing k

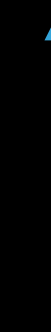
dynamic approach
(attacks)

A more practical model for timing leakage

k
Long-term secret

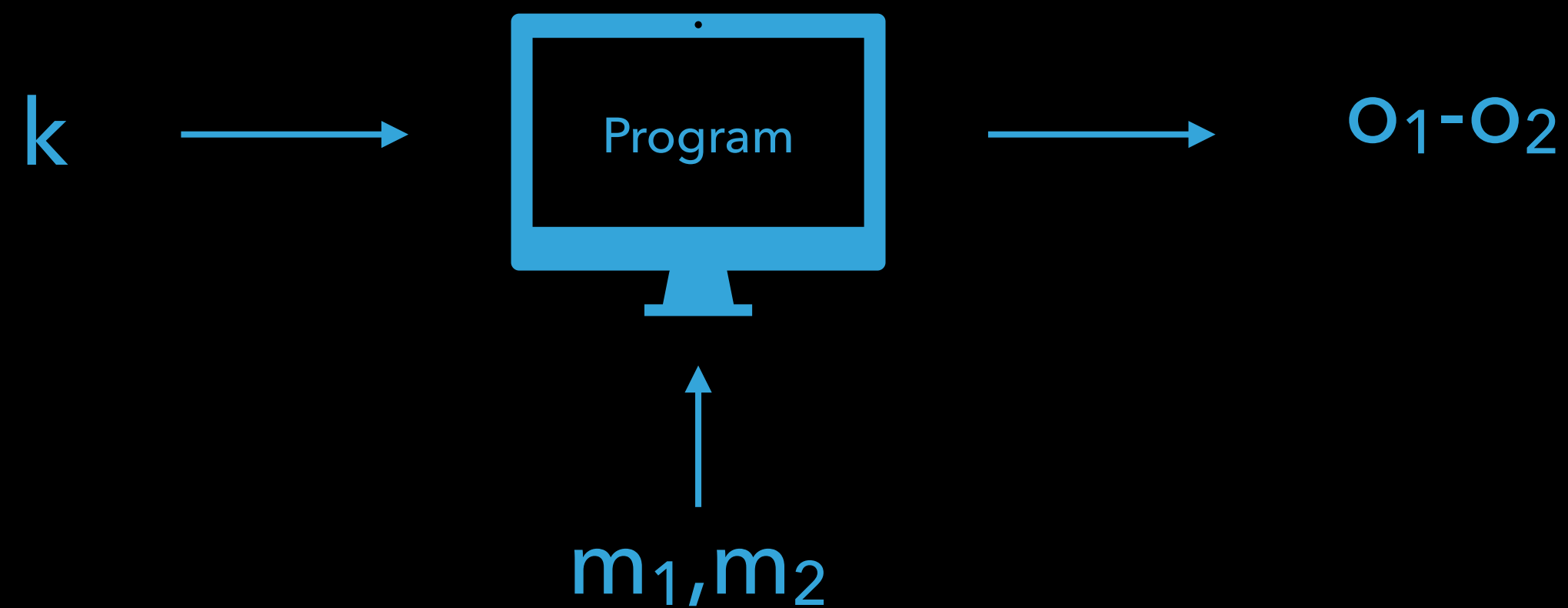


$O_1 - O_2$
Difference of timings



m_1, m_2
Two public inputs

Differential measurements



Less powerful attacker, but...



Closer to the models used in actual attack research



Compositionality

Compositionality for differential measurements

Compositional attacks

```
1  for i = 0 to n - 1 do  
2  |  if k[i] ≠ m[i] then g()  
3  done
```

recovering k ?

with oracle to execution time $m \mapsto t(k, m)$

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$$t(k, 0) - t(k, 2^i)$$

Compositional attacks

```
1  for  $i = 0$  to  $n - 1$  do  
2  |   if  $k[i] \neq m[i]$  then  $g()$   
3  done
```

recovering k ?

with oracle to execution time $m \mapsto t(k, m)$

```
if  $t(k, 0) < t(k, 2^i)$   
then  $K := K \cap \{ k \mid k[i] = 1 \}$   
else  $K := K \cap \{ k \mid k[i] = 0 \}$ 
```

Exploiting the i^{th} iteration

Sequential composition

```
1  x = m
2  for i = 0 to n - 1 do
3    | x = fi(k,x)
4    | if Testi(k,x) = 1 then g()
5  done
```

Sequential composition

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Goal: writing this code under the form

$$p = p_0; p_2; \dots; p_{n-1}$$

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$$p = p_0; p_2; \dots; p_{n-1}$$

p_i computes $f_i : K \times M \rightarrow M$ with
execution time $Test_i : K \times M \rightarrow \{0,1\}$

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States are composed

Sequential composition

composition of public values,
i.e. $(f \circ g)(k,m) = f(k, g(k,m))$

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States are composed

$$t_{\text{comp}} = t_1 + (t_2 \circ f_1)$$

Timings are summed

Key hypothesis: independence

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Hypotheses

- t, t' timing functions

Theorem

$$\text{Leak}(t+t') = \text{Leak}(t) \cap \text{Leak}(t')$$

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$$\text{Leak}(t+t') = \text{Leak}(t) \cap \text{Leak}(t')$$

Leak(t) = the equivalence relation on secrets characterising timing leakage

Key hypothesis: independence

Hypotheses

- t, t' timing functions
- X distribution of public inputs
- for all secrets k, k' , the distributions $t(k, X)$ and $t'(k', X)$ are **independent**

Theorem

$$\text{Leak}(t+t') = \text{Leak}(t) \cap \text{Leak}(t')$$

Leak(t) = the equivalence relation on secrets characterising timing leakage

Randomised compositional attack

Randomised compositional attack

Inputs

independent blocks $p_1 = (f_1, t_1), \dots, p_n = (f_n, t_n)$

oracle to $t(k^*, \cdot)$ execution time of $(p_1; \dots; p_n)$
for some k^*

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Algorithm

$K :=$ set of all secrets

M := sample of r random messages

for $i=1$ to n do

$K := K \cap \text{Attack}(\bar{t}_i |_{K \times M})$

done

return K

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timing attack on
 $\bar{t}_i = t_i \circ f_{i-1} \circ \dots \circ f_1$
with oracle to $t(k^*, \cdot)$

Applications

Cost analysis

for simple bit-serial operations, n bits

Bruteforce

$O(2^n)$ measurements

Random. attack

$O(n \log(n/\epsilon))$ random measurements
(to guarantee proba of success $1 - \epsilon$)

Cost analysis

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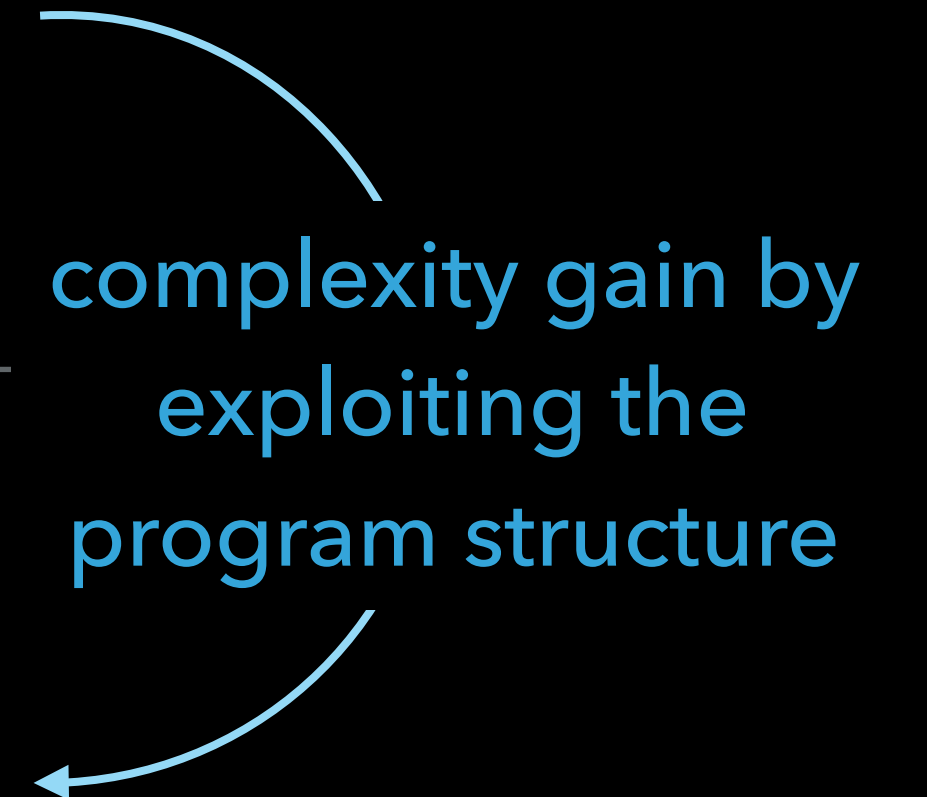
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complexity gain by
exploiting the
program structure



Explaining documented attacks

as instances of the randomised attack VS independent blocks

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1998 on RSA (Dhem *et al.*)

Targets: implem. of modular exponentiation
with Montgomery multiplications

Exploits: timing variations of squaring operations

Extracts: all bits of the secret exponent but one

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Exploits: timing variations of squaring operations

Extracts: all bits of the secret exponent but one

Decomposition:

1 block = 1 multiplication

Explaining documented attacks

as instances of the randomised attack VS independent blocks

2007 on AES (Aciçmez *et al.*)

Targets: implem. of AES with precomputed tables

Exploits: timing variations due to cache

Extracts: all bits of the encryption key

Decomposition:

1 block = 1 table lookup

Conclusion

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A formal model for reasoning about timing attacks

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- ⊕ Compositionality results

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- ⊕ Compositionality results
- ⊕ Generic description of attacks / cost analysis
- ⊕ Captures several documented attacks
- ➔ Future: use as a basis for automating attack synthesis