

IH2010

# Tardos's Fingerprinting Code over AWGN Channel

Minoru Kuribayashi



*Graduate School of Engineering  
Kobe University, Japan*

E-mail: [kminoru@kobe-u.ac.jp](mailto:kminoru@kobe-u.ac.jp)

- ▶ Background
- ▶ Attack Model
- ▶ Hard & Soft Decision Method
- ▶ Estimation of Channel
- ▶ Proposed Tracing Algorithm
- ▶ Experimental Results
- ▶ Concluding Remarks

A server distributes personal copies of a content to  $N$  users.  
 $c$  colluders mix their copies to forge a pirated copy.

## The objective of a fingerprinting code

Identification of the colluders from the pirated copy.

**$c$ -secure code:**

If the number of colluders is equal or less than  $c$ ,  
at least one of them can be identified.

Boneh Shaw (1995) concatenation code

Tardos (2003) Probabilistic fingerprinting code

Codeword of  $j$ -th user  $\mathbf{x}_j = \{x_{j,1}, x_{j,2}, \dots, x_{j,L}\}$   
 $x_{j,i} \in \{0, 1\}$   $L$ : code length

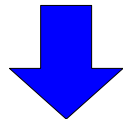
*When 4 users are colluded, they can produce a pirated copy under the following condition.*

$$\mathbf{x}_1 = \{0\ 1\ 0\ 1\ 0\ 1\ 0\ 0\ 1\ 1\}$$

$$\mathbf{x}_2 = \{0\ 1\ 0\ 1\ 0\ 0\ 1\ 0\ 1\ 0\}$$

$$\mathbf{x}_3 = \{1\ 1\ 0\ 1\ 0\ 1\ 0\ 0\ 1\ 1\}$$

$$\mathbf{x}_4 = \{0\ 1\ 1\ 1\ 0\ 1\ 1\ 0\ 1\ 1\}$$



$$\mathbf{y} = \{y_1, y_2, \dots, y_L\}$$

● If  $i$ -th elements are equal,  
**undetectable position**

● otherwise  
detectable position

$$\text{Codeword of } j\text{-th user } \mathbf{x}_j = \{x_{j,1}, x_{j,2}, \dots, x_{j,L}\}$$

$$x_{j,i} \in \{0, 1\} \quad L: \text{code length}$$

*When 4 users are colluded, they can produce a pirated copy under the following condition.*

$$\mathbf{x}_1 = \{0 \ 1 \ 0 \ 1 \ 0 \ 1 \ 0 \ 0 \ 1 \ 1\}$$

$$\mathbf{x}_2 = \{0 \ 1 \ 0 \ 1 \ 0 \ 0 \ 1 \ 0 \ 1 \ 0\}$$

$$\mathbf{x}_3 = \{1 \ 1 \ 0 \ 1 \ 0 \ 1 \ 0 \ 0 \ 1 \ 1\}$$

$$\mathbf{x}_4 = \{0 \ 1 \ 1 \ 1 \ 0 \ 1 \ 1 \ 0 \ 1 \ 1\}$$

$$\mathbf{y} = \{? \ 1 \ ? \ 1 \ 0 \ ? \ ? \ 0 \ 1 \ ?\}$$

● If  $i$ -th elements are equal,  
**undetectable position**

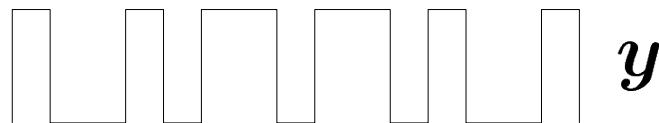
● otherwise  
detectable position

Each bit of the codeword is embedded into digital content  
assisted by a watermarking method.

Even if the watermarking method is robust,  
the extracted signal must be distorted by a noise.

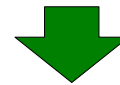
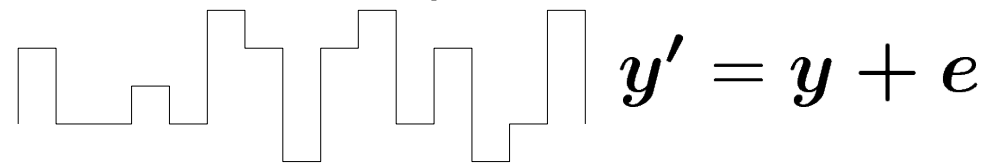
**Assumption** additive white Gaussian noise (AWGN)

(marking assumption)



Optimal Detector

(relaxed assumption)



???

How to design a good detector ?

Codeword of  $j$ -th user  $\mathbf{x}_j = \{x_{j,1}, x_{j,2}, \dots, x_{j,L}\}$   
 $x_{j,i} \in \{0, 1\}$   $L$ : code length

$x_{j,i}, (1 \leq j \leq L)$  are independent.

$$\Pr(x_{j,i} = 1) = p_i \quad \forall j \in [n]$$

i.i.d. random variables

$$p_i \in [0, 1]$$

$$p_i \sim f(p)$$

**Tracing Algorithm**  $\mathbf{y} = \{y_1, y_2, \dots, y_L\}$  a pirated codeword

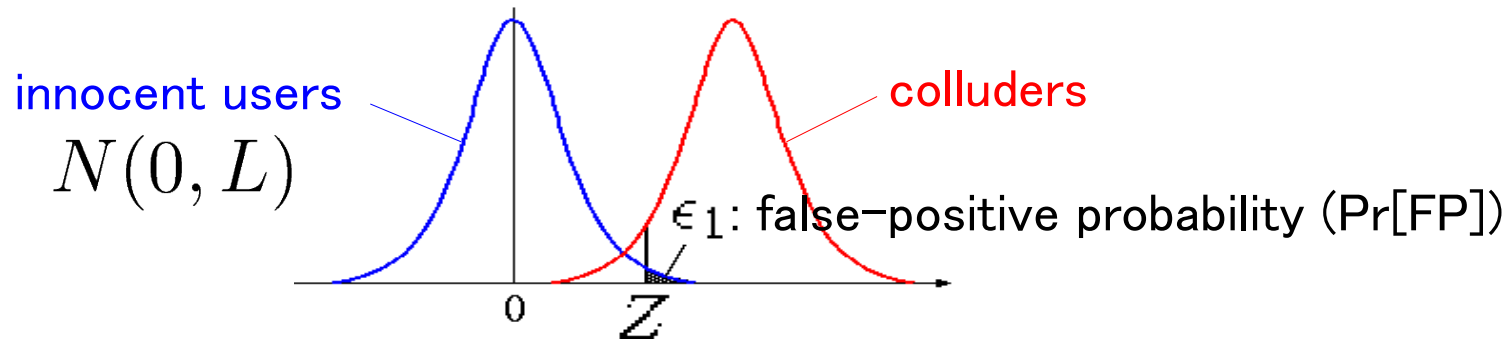
If the score  $S_j$  exceeds a threshold  $Z$ ,  $j$ -th user is judged guilty.

$$S_j = \sum_{i=1}^L y_i U_{j,i} \quad \text{where} \quad U_{j,i} = \begin{cases} \sqrt{\frac{1-p_i}{p_i}} & \text{if } x_{j,i} = 1 \\ -\sqrt{\frac{p_i}{1-p_i}} & \text{if } x_{j,i} = 0 \end{cases}$$

- Symmetric version of the score

$$S_j = \sum_{i=1}^L y_i U_{j,i} \longrightarrow S_j = \sum_{i=1}^L (2y_i - 1) U_{j,i}$$

- Gaussian approximation of the score's distribution based on CLT



- Design of the threshold  $Z$  for a given  $\epsilon_1$

$$Z = \sqrt{2L} \cdot \operatorname{erfc}^{-1} \left( \frac{2\epsilon_1}{N} \right) \quad N : \text{number of users}$$



- Symmetric version of the score

$$S_j = \sum_{i=1}^L y_i U_{j,i} \longrightarrow S_j = \sum_{i=1}^L (2y_i - 1) U_{j,i}$$

- Gaussian ... CLT

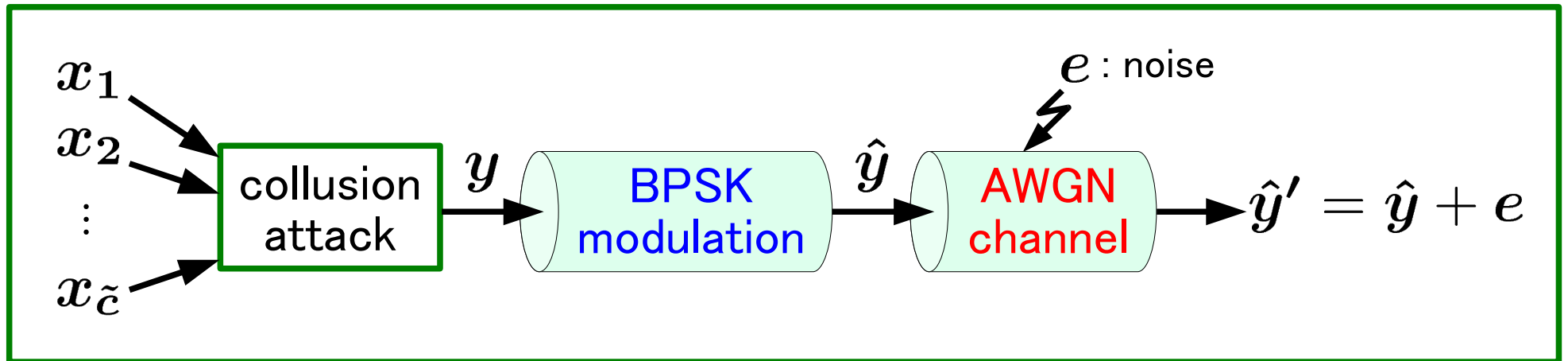
This means **BPSK** (binary phase shift keying) modulation.

$$y_i \longrightarrow \hat{y}_i = 2y_i - 1$$

$$\{0, 1\} \qquad \{-1, 1\}$$

$$S_j = \sum_{i=1}^L \hat{y}_i U_{j,i}$$

- De

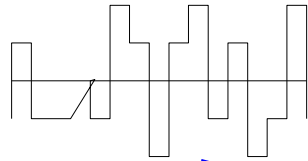


- The number  $\tilde{c}$  of colluders is not always equal and less than  $c$ .
- The length  $L$  of codeword is fixed.

## Our Goal

Under a fixed length  $L$ , we want to catch as many colluders as possible without increasing the false-positive probability  $\epsilon_1$  no matter how many colluders are involved in.

received signal



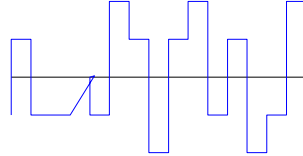
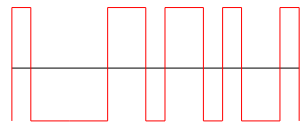
$$\hat{y}' = \hat{y} + e$$

correlation score

$$S_j = \sum_{i=1}^L \hat{y}_i U_{j,i}$$

**Hard Decision (HD)**

**Soft Decision (SD)**



correlator

correlator

judgement

judgement

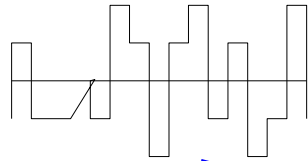
$Z_{HD}$

$Z_{SD}$

identified colluders

identified colluders

received signal



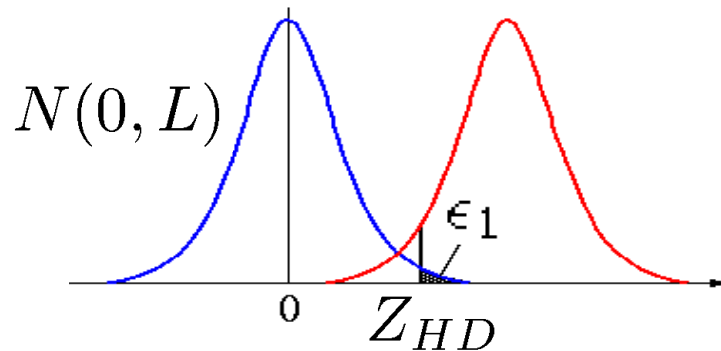
$$\hat{y}' = \hat{y} + e$$

correlation score

$$S_j = \sum_{i=1}^L \hat{y}_i U_{j,i}$$

## Hard Decision (HD)

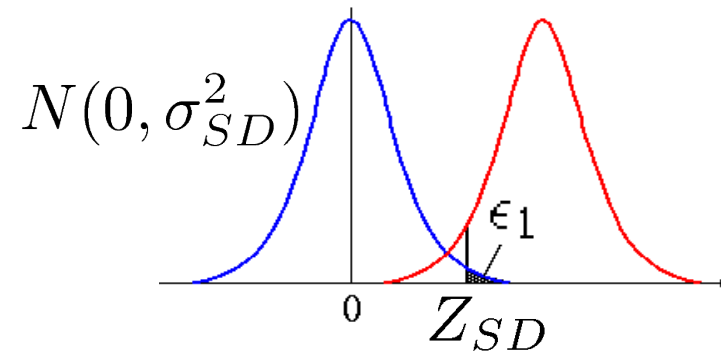
Based on the CLT,  $Z_{HD}$  is calculated by a given  $\epsilon_1$ .



$$Z_{HD} = \sqrt{2L} \cdot \text{erfc}^{-1} \left( \frac{2\epsilon_1}{N} \right)$$

## Soft Decision (SD)

Based on the CLT,  $Z_{SD}$  is calculated by a given  $\epsilon_1$ .



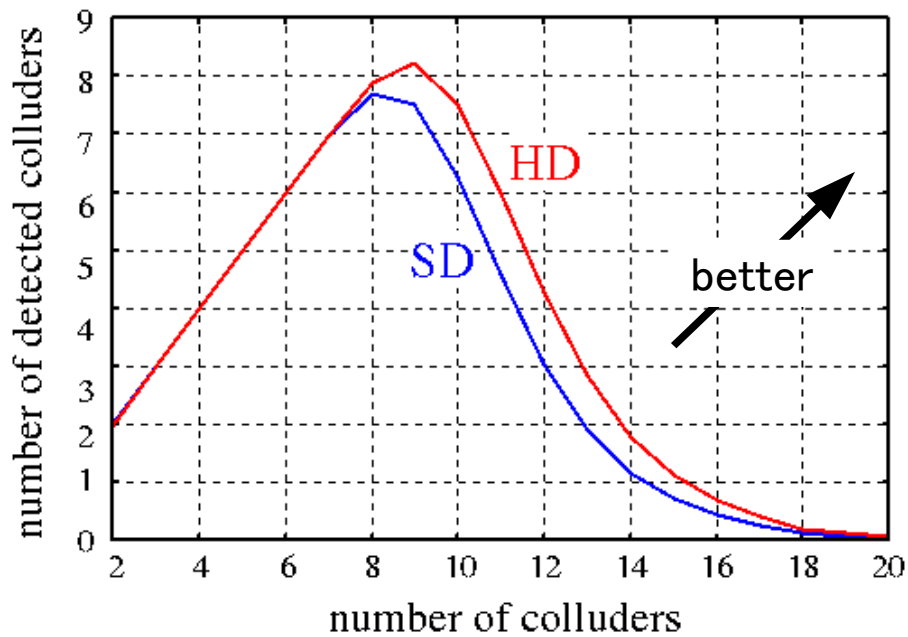
$$Z_{SD} = \sqrt{2\sigma_{SD}^2} \cdot \text{erfc}^{-1} \left( \frac{2\epsilon_1}{N} \right)$$

code length :  $L = 10^4$

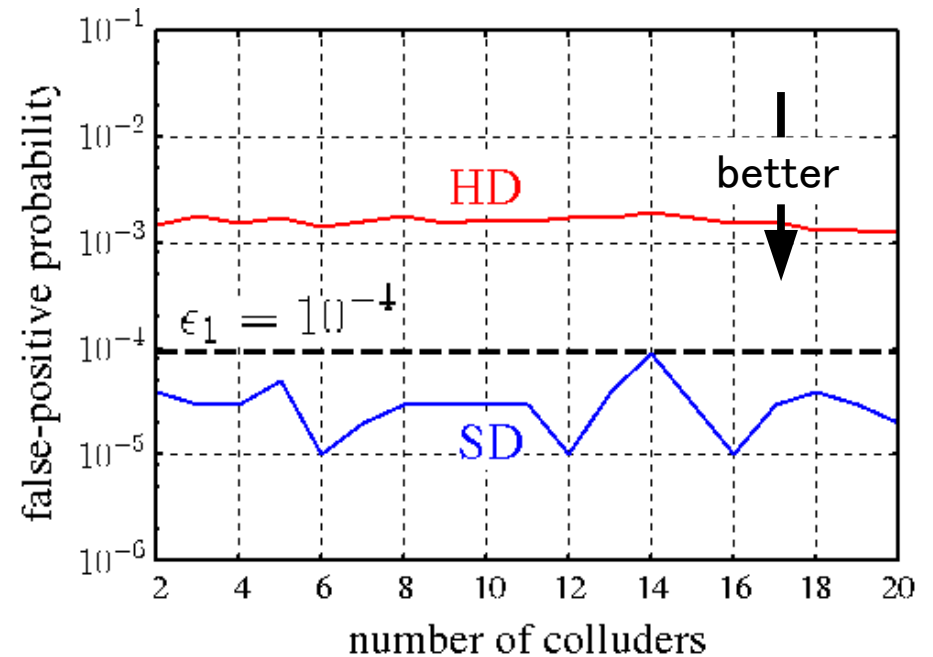
$\Pr[\text{FP}]: \epsilon_1 = 10^{-4}$

# of users :  $N = 10^4$

# of detected colluders



False positive probability



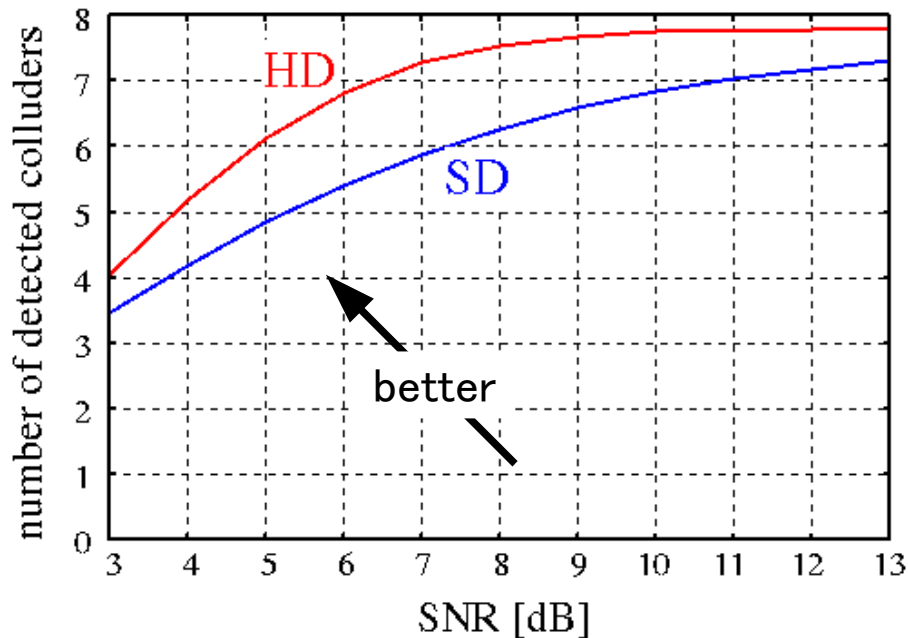
Although the HD method catches more colluders, the false-positive probability is increased.

code length :  $L = 10^4$

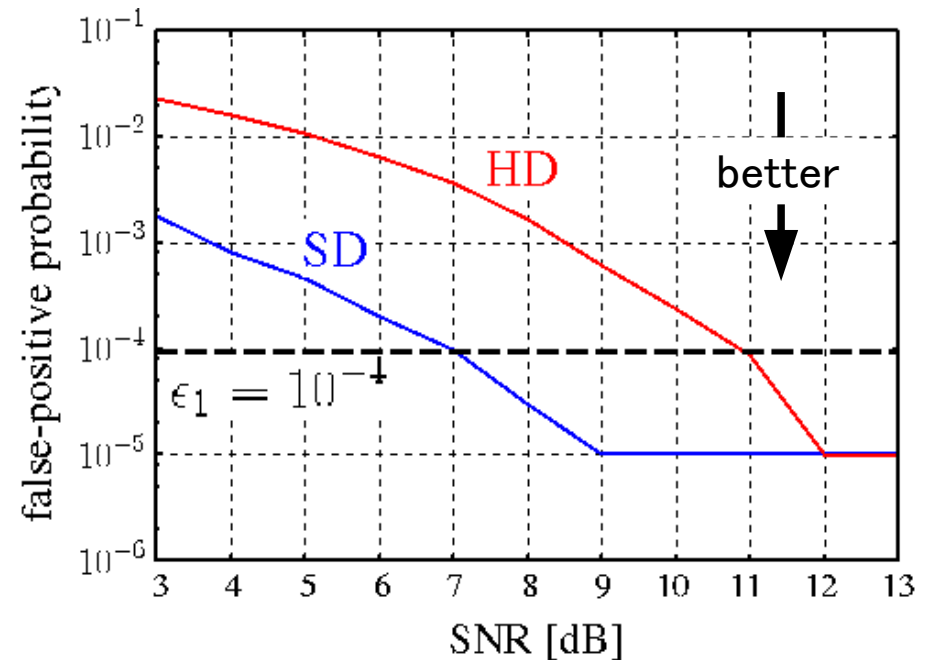
$\Pr[\text{FP}]$ :  $\epsilon_1 = 10^{-4}$

# of users :  $N = 10^4$

# of detected colluders



False positive probability



When the amount of noise is very small,  
the use of CLT seems to be valid for both methods.

With the increase of noise, the false positive probability is increased.

## Remark

In this experiment, the threshold  $Z_{HD}$  is calculated by a given  $\epsilon_1$  based on the CLT.

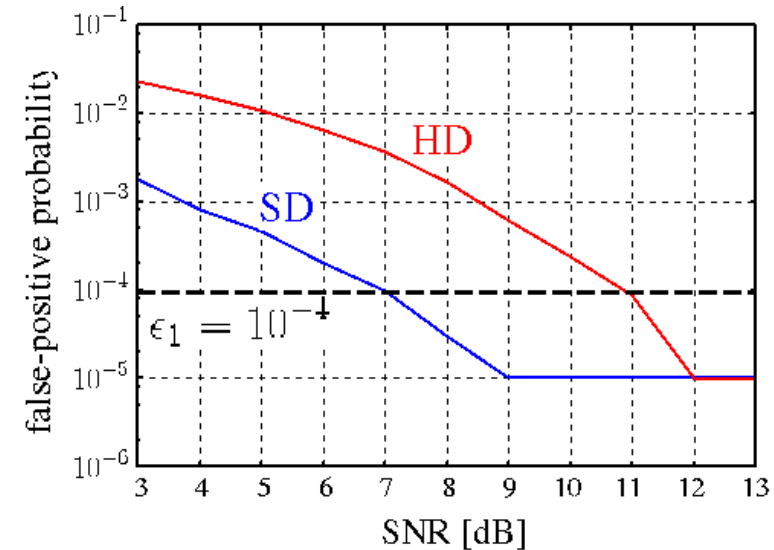
$$Z_{HD} = \sqrt{2L} \cdot \operatorname{erfc}^{-1} \left( \frac{2\epsilon_1}{N} \right)$$

$$= 3.97\sqrt{2L} \quad (\text{constant})$$

In the related works,

$$Z \sim Z_{HD} \quad (\text{constant})$$

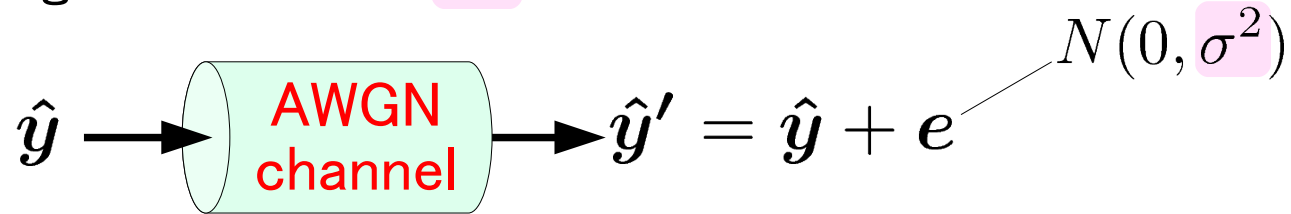
## False positive probability



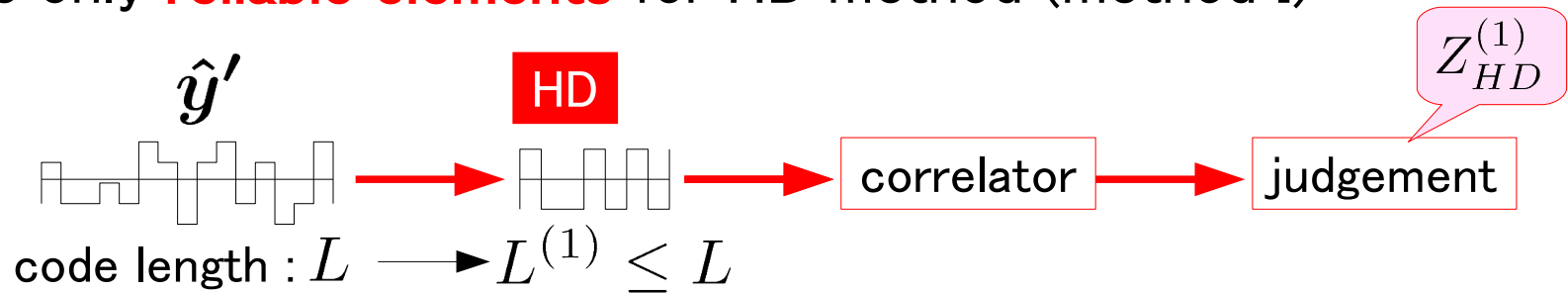
$$\epsilon_1 = 10^{-4}, \quad N = 10^4$$

The false positive probability must be increased in the same fashion.

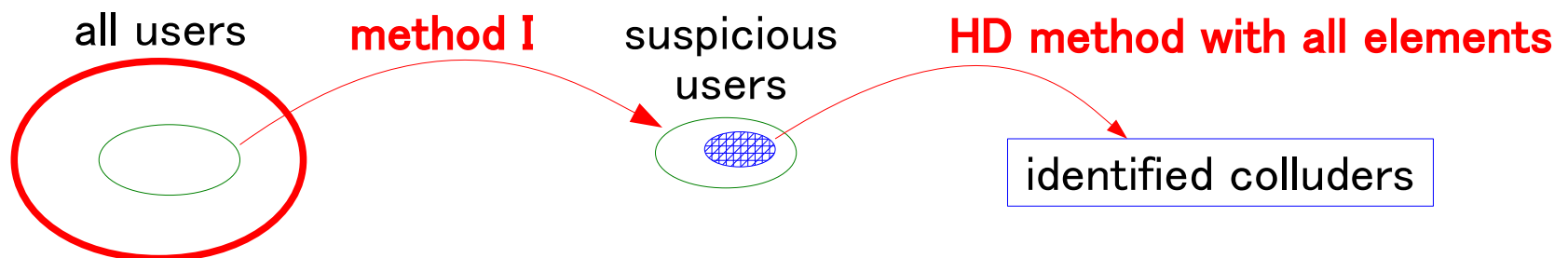
- ▶ Estimating the variance  $\sigma^2$  of noise



- ▶ Use only **reliable elements** for HD method (method I)

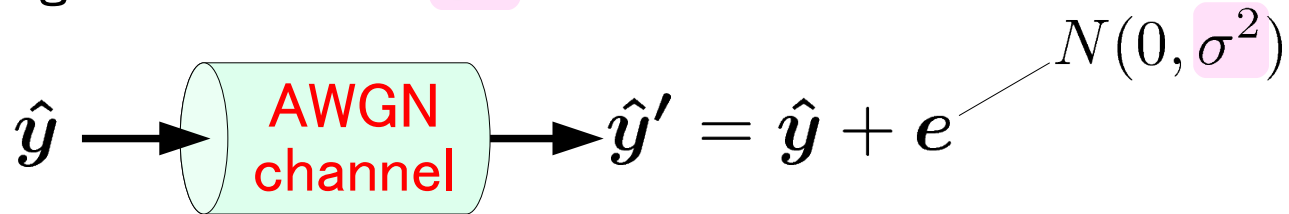


- ▶ method I + unreliable elements (method II)

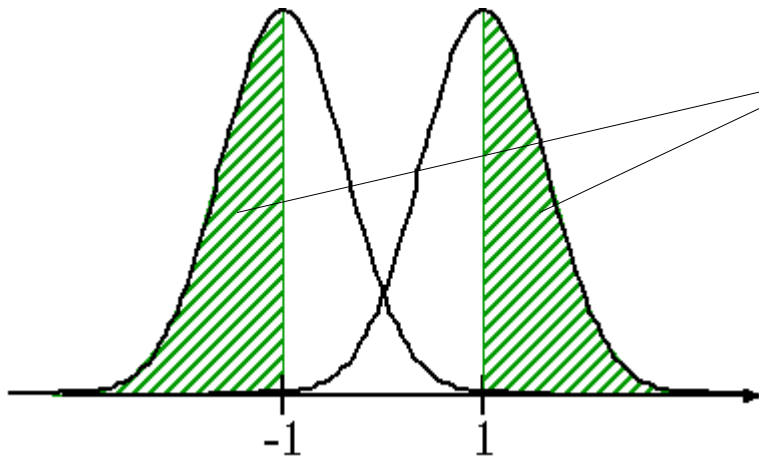




- ▶ Estimating the variance  $\sigma^2$  of noise



The distribution of received signal  $\hat{y}'_i = \hat{y}_i + e_i$

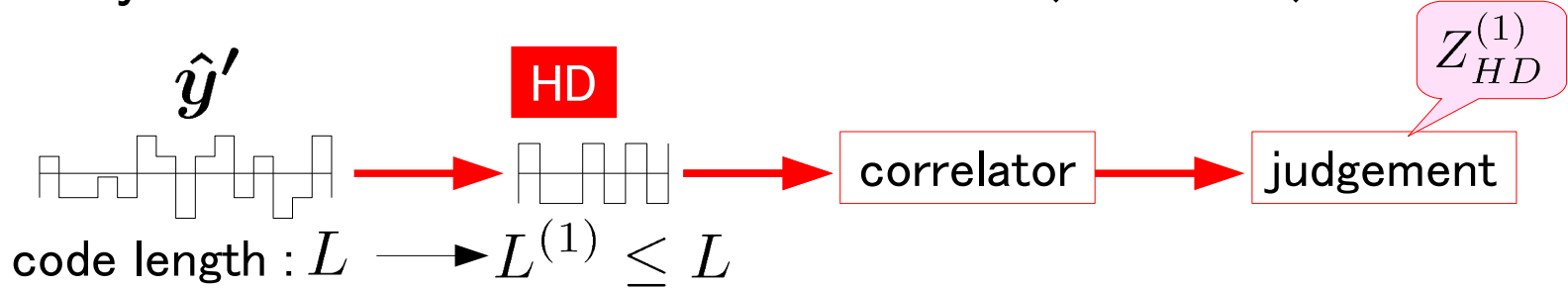


We estimate the variance  $\sigma^2$  only from these elements;

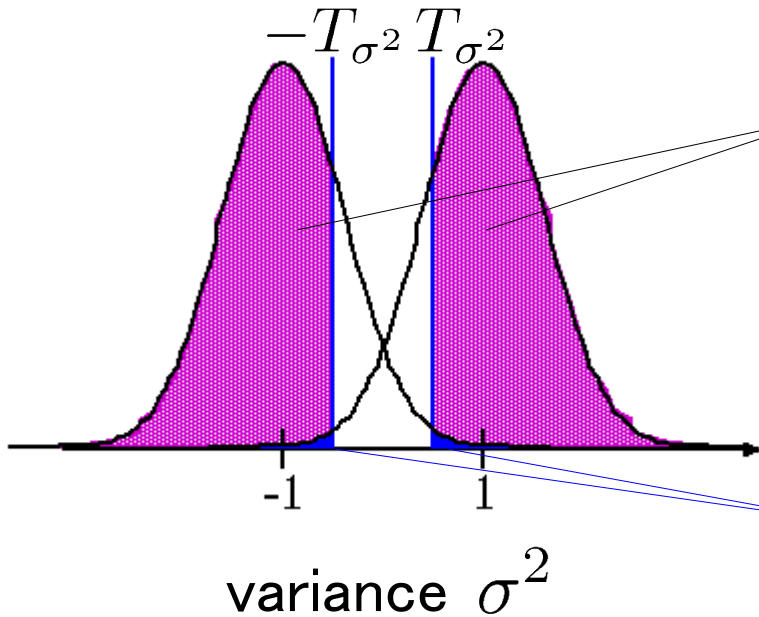
$$|\hat{y}'_i| > 1$$

The number of such elements is  $L/2$  in average.

- ▶ Use only **reliable elements** for HD method (method I)



The distribution of received signal  $\hat{y}'_i = \hat{y}_i + e_i$



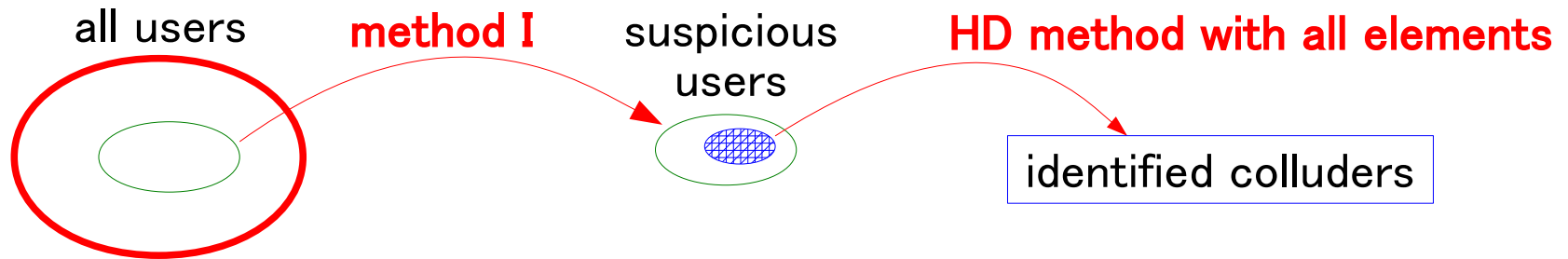
**reliable elements:**  $|\hat{y}'_i| \geq T_{\sigma^2}$

# of bit flips:  $P_{flip}L$

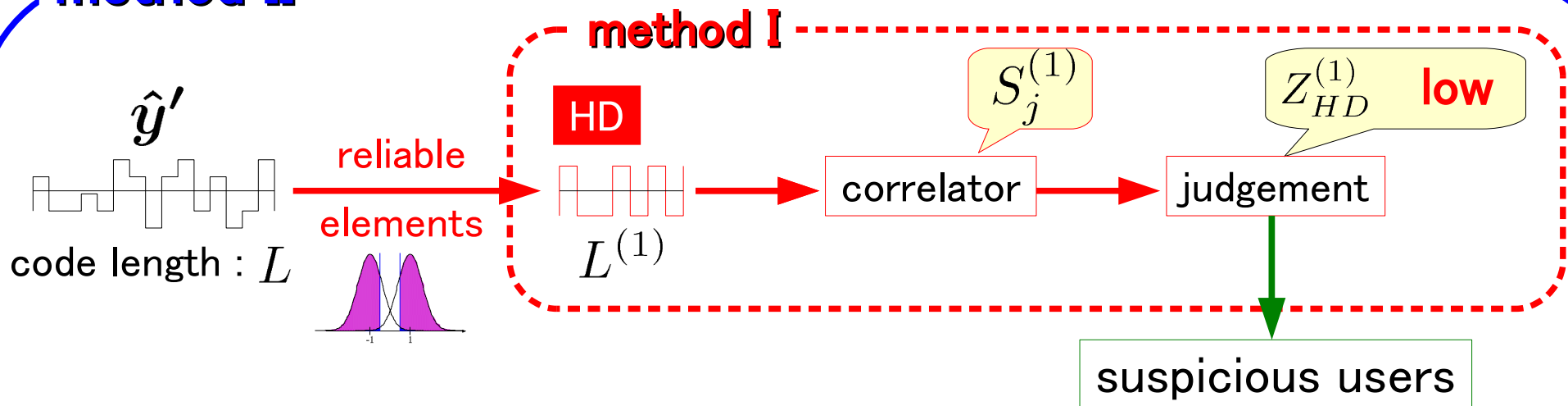
where  $T_{\sigma^2}$  is a threshold and

$$P_{flip} = \frac{1}{2} \operatorname{erfc} \left( \frac{T_{\sigma^2}}{2\sigma^2} \right)$$

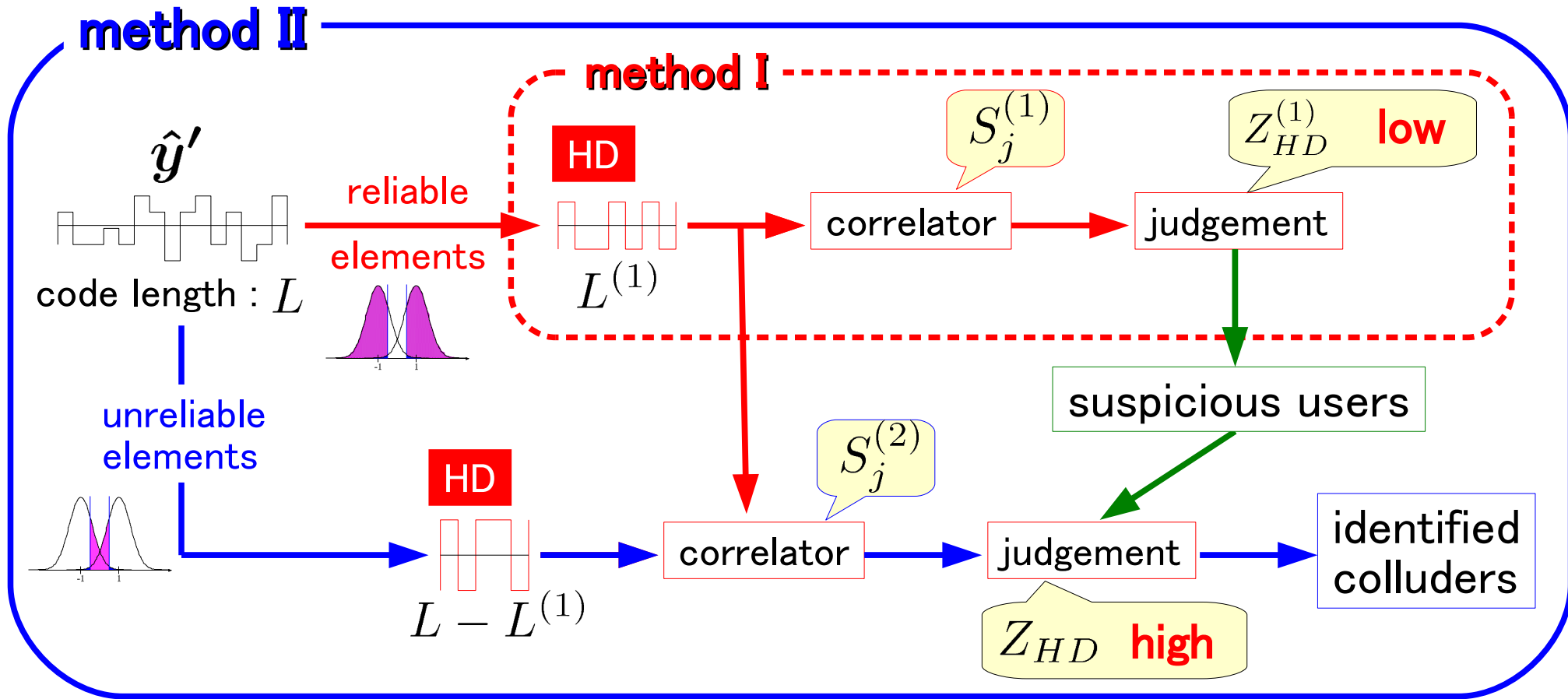
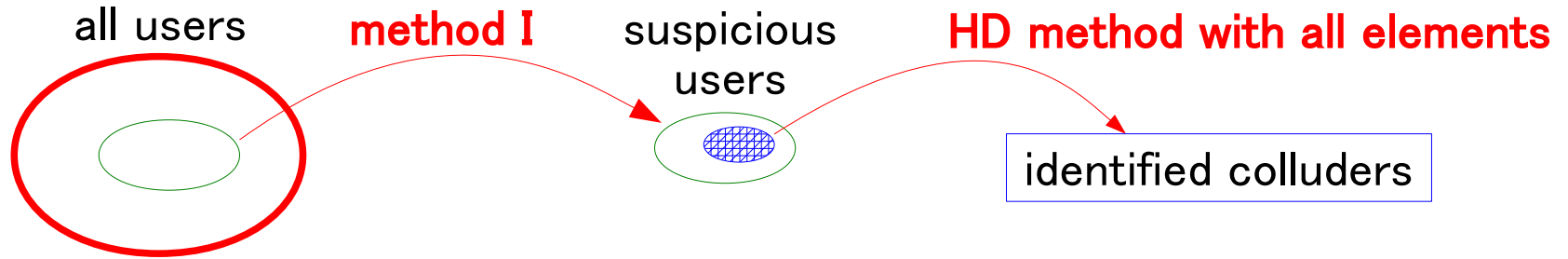
- ▶ method I + unreliable elements (method II)



## method II



▶ method I + unreliable elements (method II)



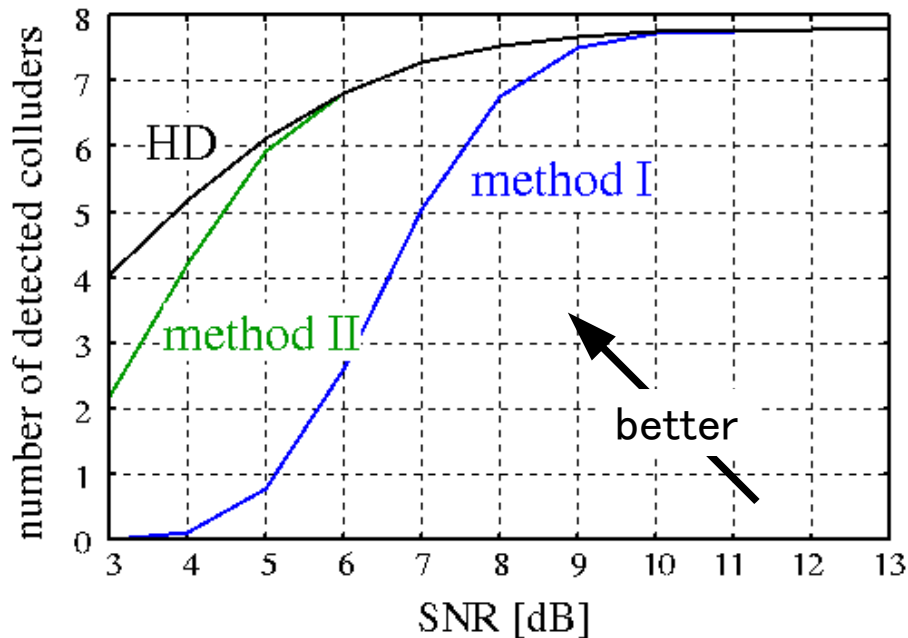
code length :  $L = 10^4$

$\Pr[\text{FP}] : \epsilon_1 = 10^{-4}$

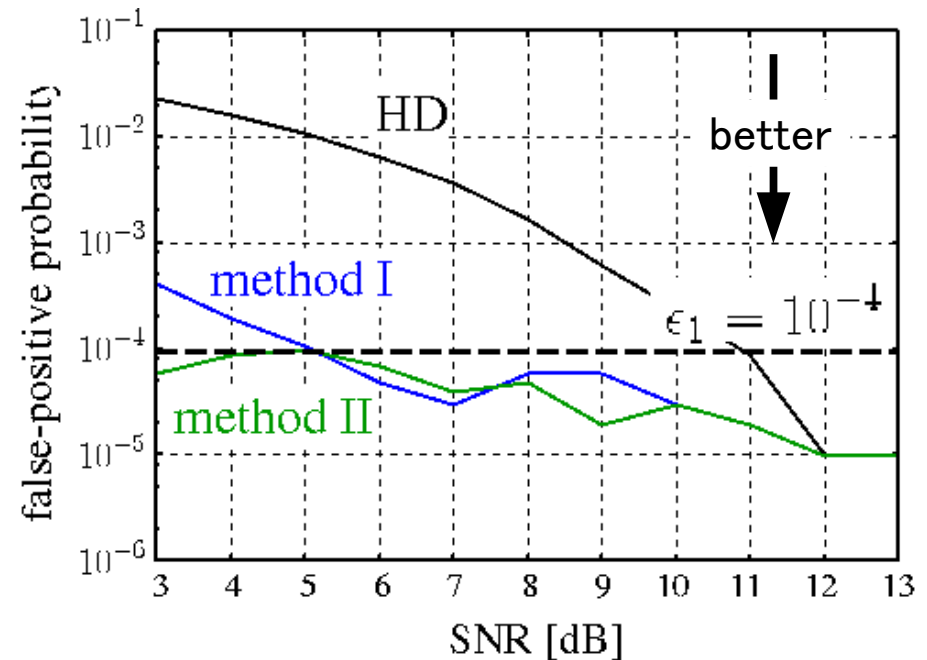
# of users :  $N = 10^4$

# of bit flips :  $P_{flip}L = 1$

# of detected colluders



False positive probability



The method II can detect many colluders without increasing the false positive probability.

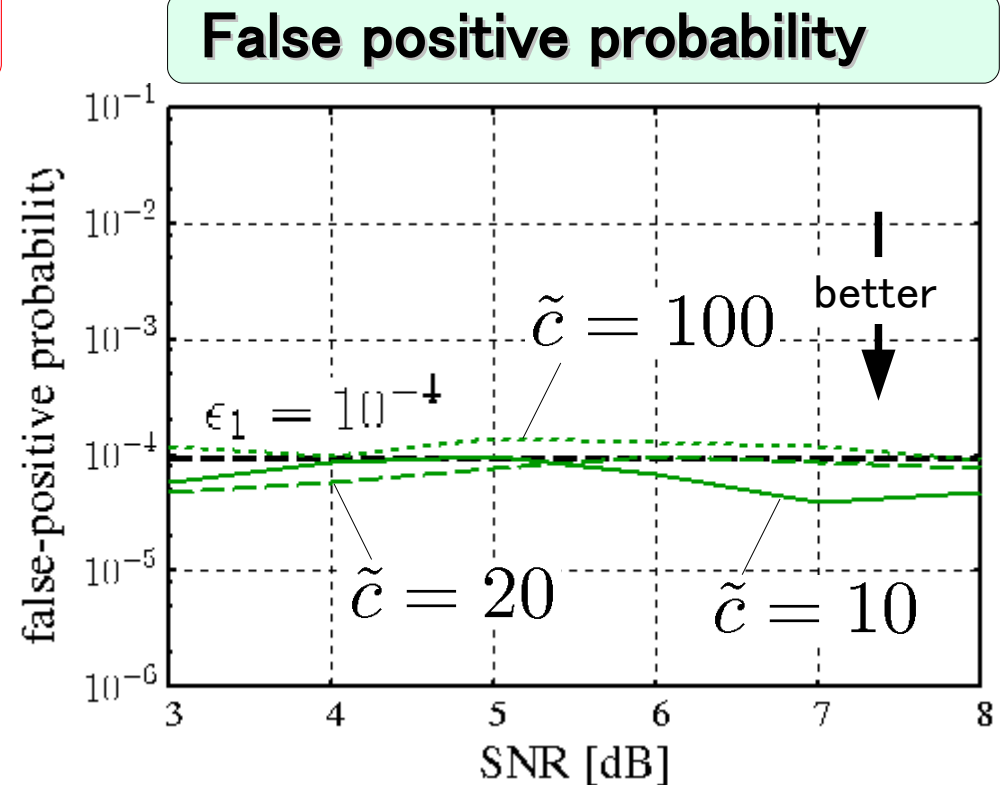
# of colluders :  $\tilde{c} = 10, 20, 100$

code length :  $L = 10^4$

# of users :  $N = 10^4$

$\Pr[\text{FP}] : \epsilon_1 = 10^{-4}$

# of bit flips :  $P_{flip}L = 1$



The false positive probability is independent on the number of colluders.

- When the amount of noise is very small, the use of CLT is valid.
- The false positive probability is increased with the amount of noise.  
It is advisable to design a threshold considering the noise.
- We can identify colluders only from reliable elements without the serious increase of false positive probability. (method I)
- Among the suspicious users detected by the method I, the HD method can catch many colluders with less innocents.
- The false positive probability does not increase with the number of colluders for the method II.