

Algoritmos para códigos separadores

Marcel Fernandez

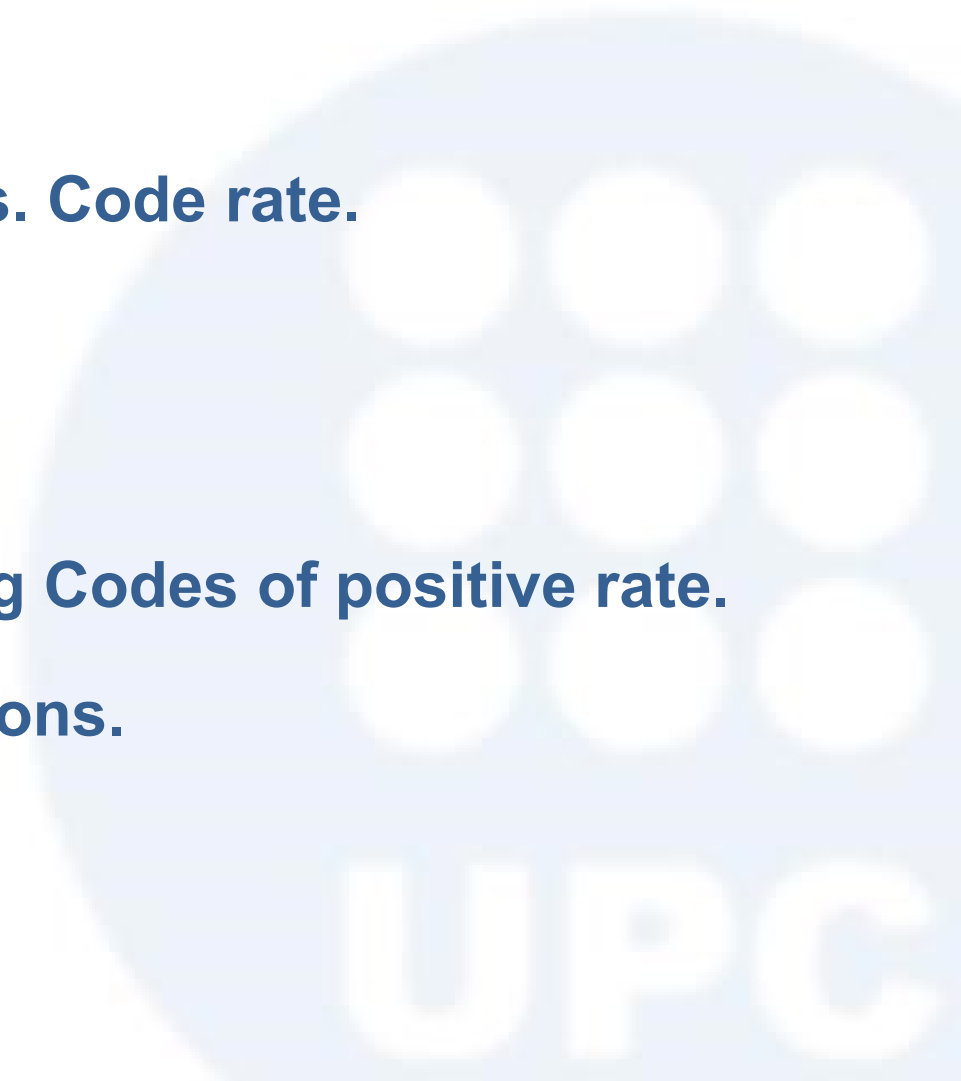
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- 
- A large, light blue watermark of the UPC logo is visible in the background on the right side of the slide. The logo consists of a circular emblem with a grid of dots and the letters 'UPC' below it.

Separating codes.

**There are almost no
(2,2)-separating codes
in the literature**

**Best known
(comes after several names)**

**Dual Hamming code
Haddamard code
Simplex code
(rate $\rightarrow 0$)**

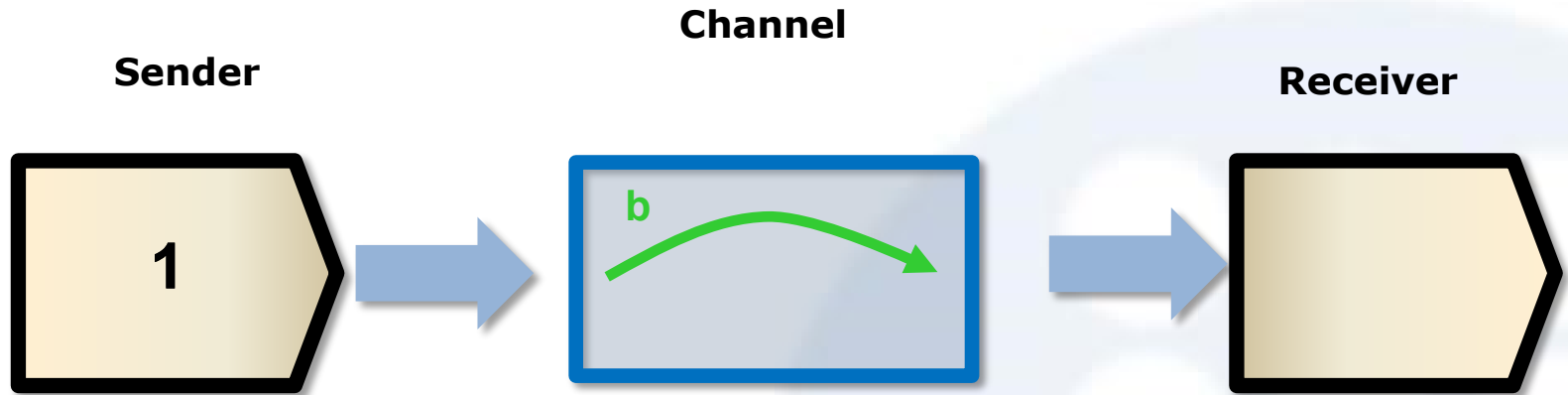
**The purpose of this work is to construct
(2,2)-separating codes
of positive rate**

1

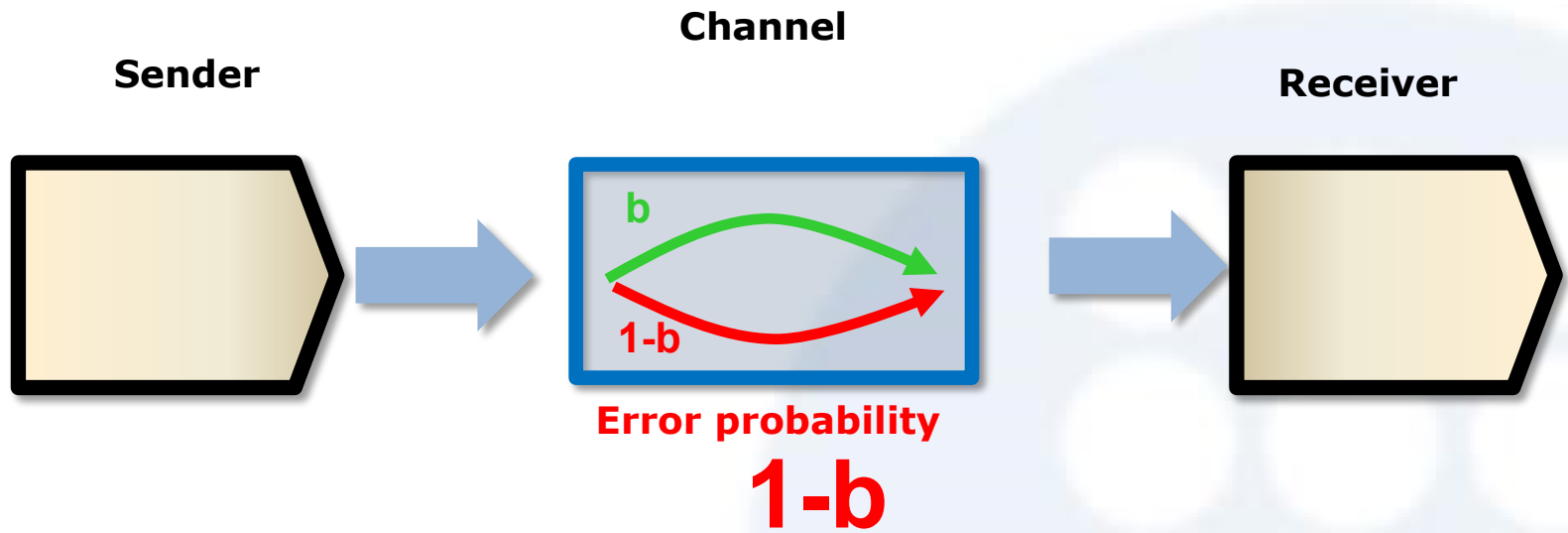
Error correcting codes

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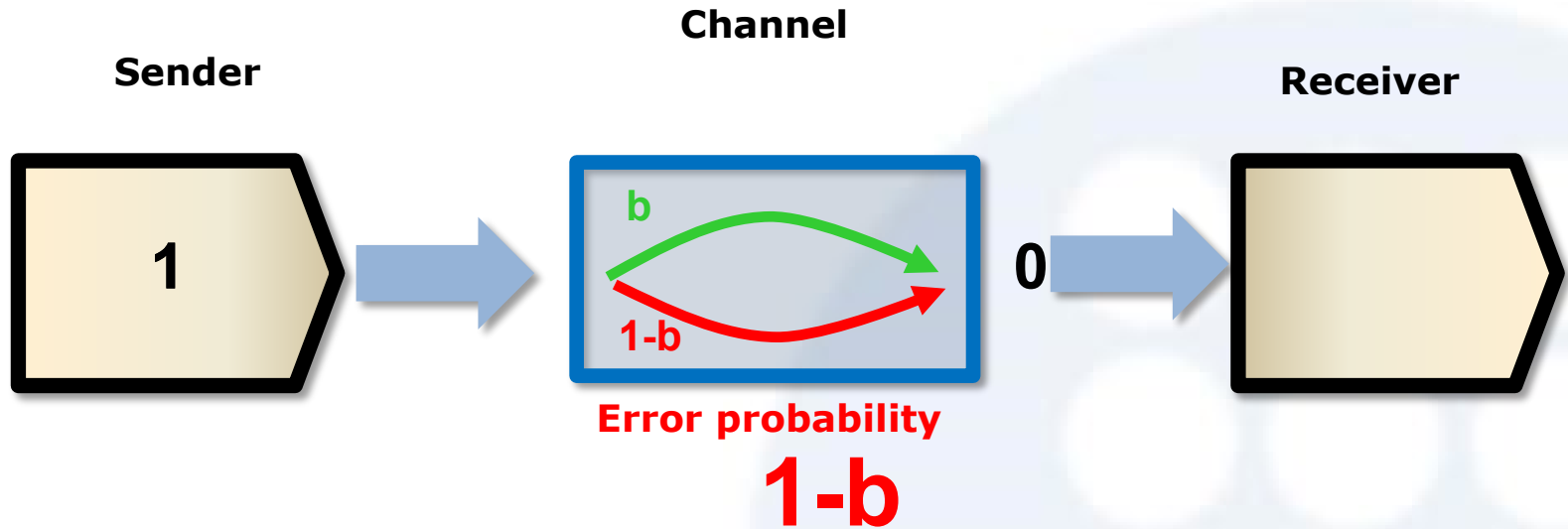
Error Correcting Codes. Code rate.



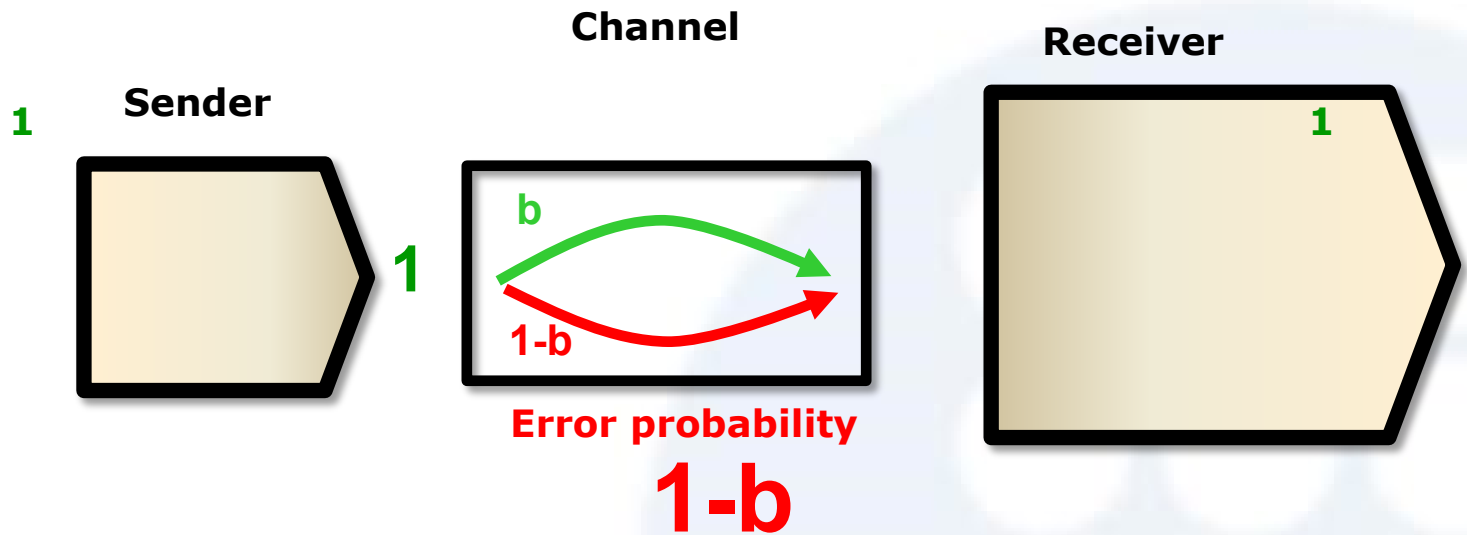
Error Correcting Codes. Code rate.



Error Correcting Codes. Code rate.

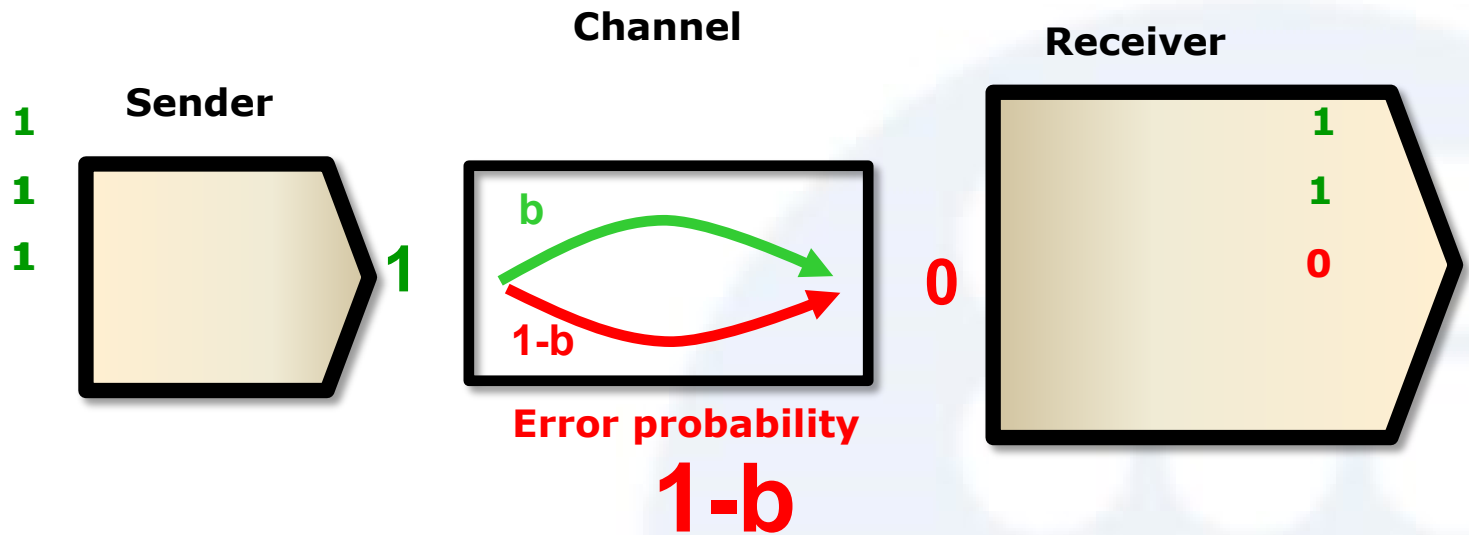


Error Correcting Codes. Code rate.



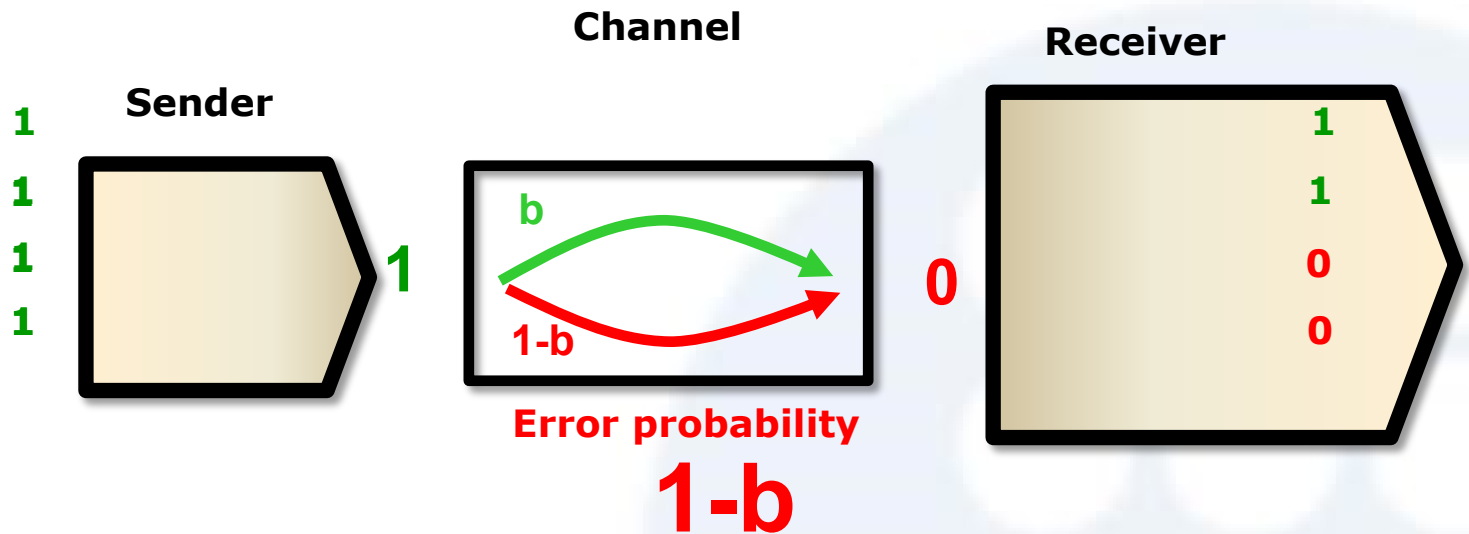
Can we correct errors?

Error Correcting Codes. Code rate.



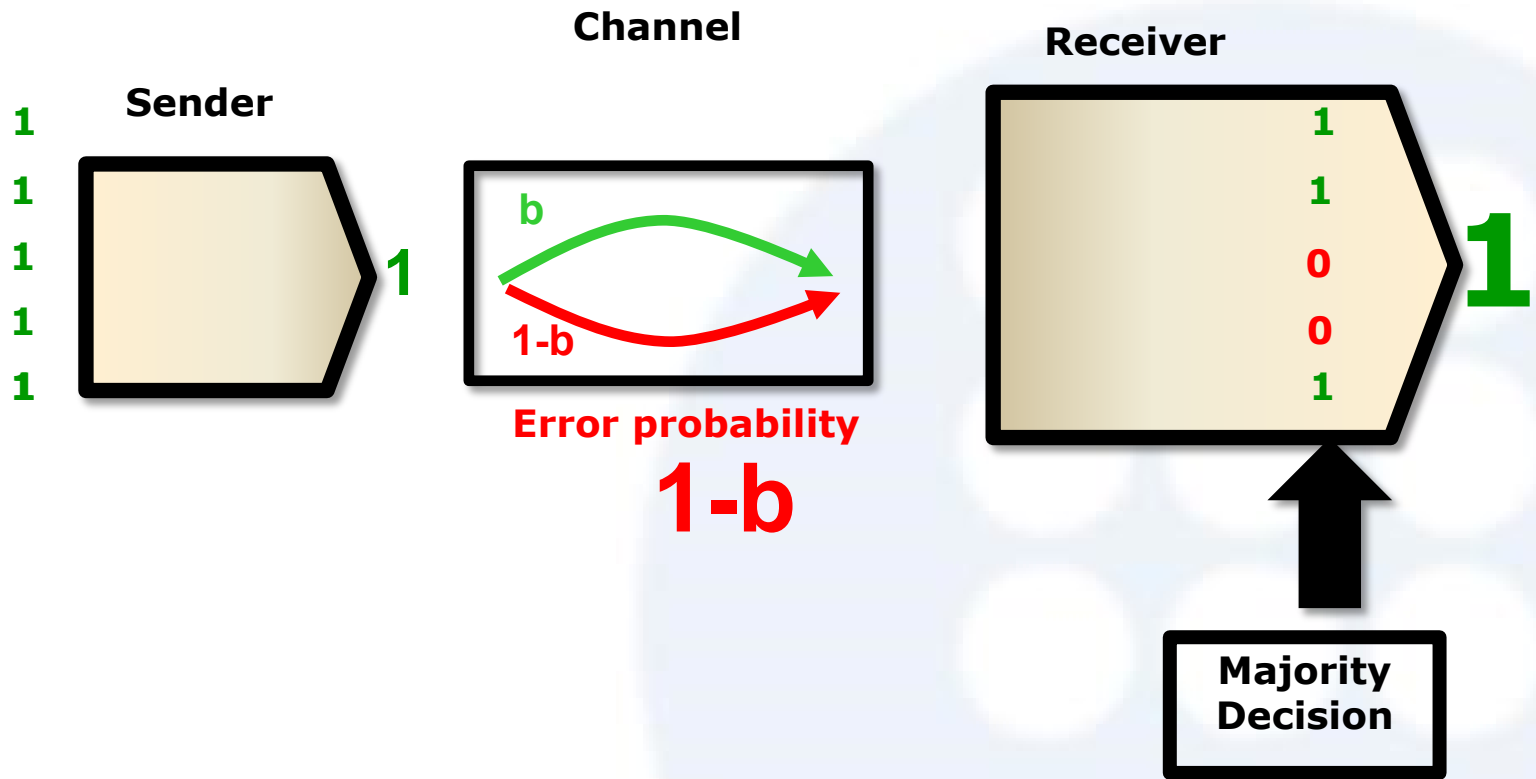
Can we correct errors?

Error Correcting Codes. Code rate.



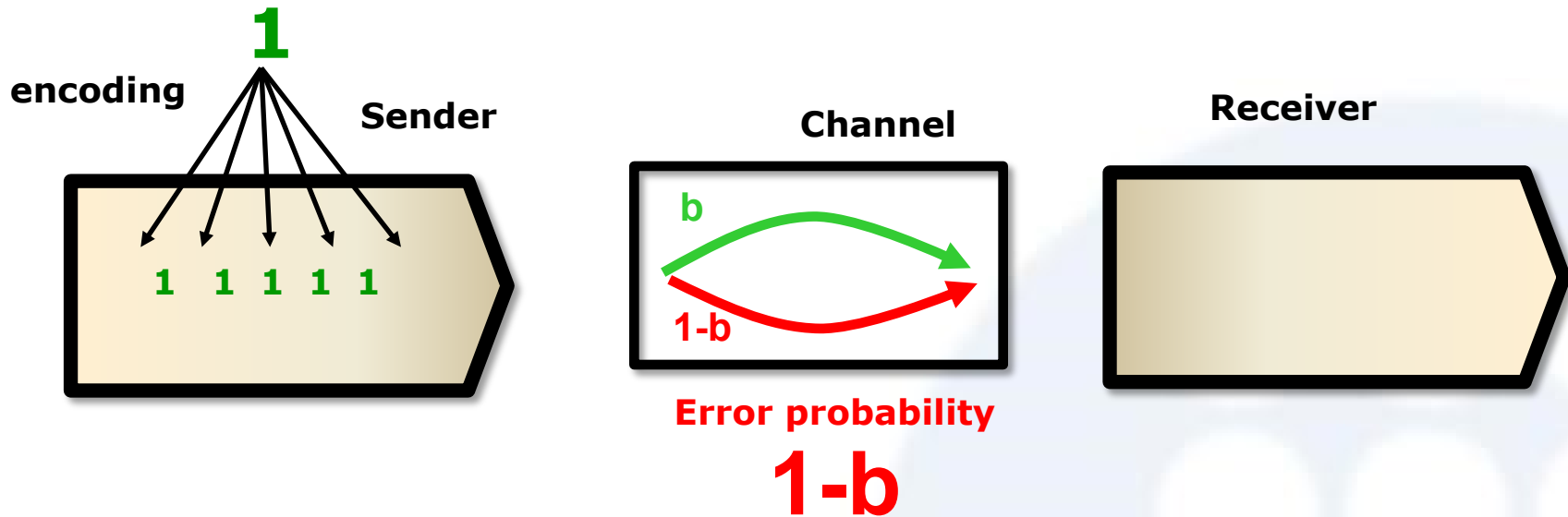
Can we correct errors?

Error Correcting Codes. Code rate.



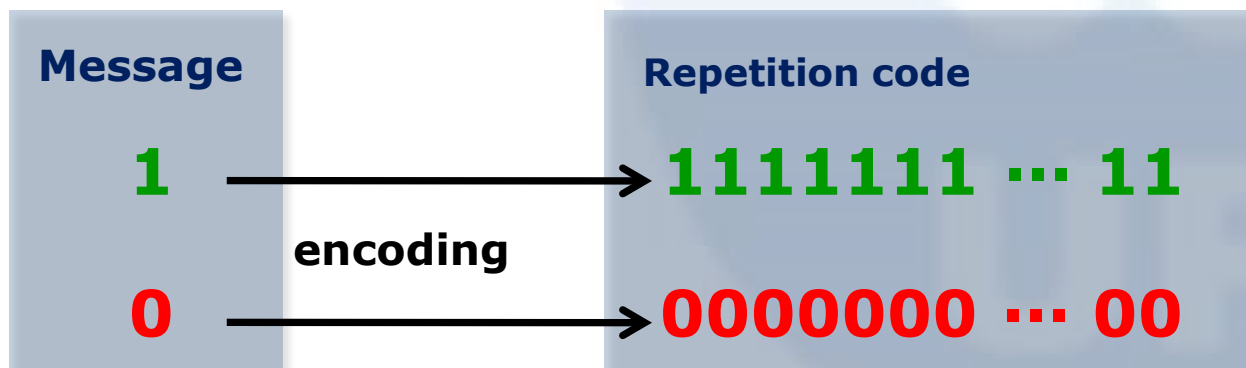
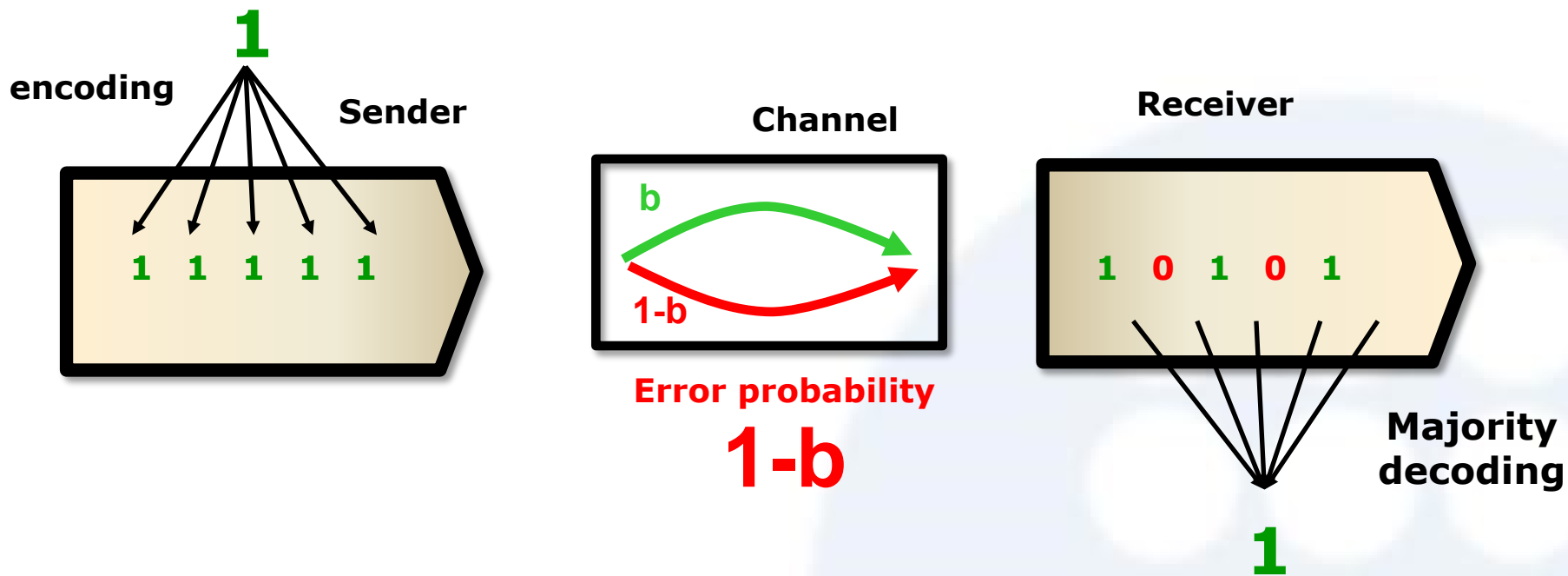
Can we correct errors?

Error Correcting Codes. Code rate.

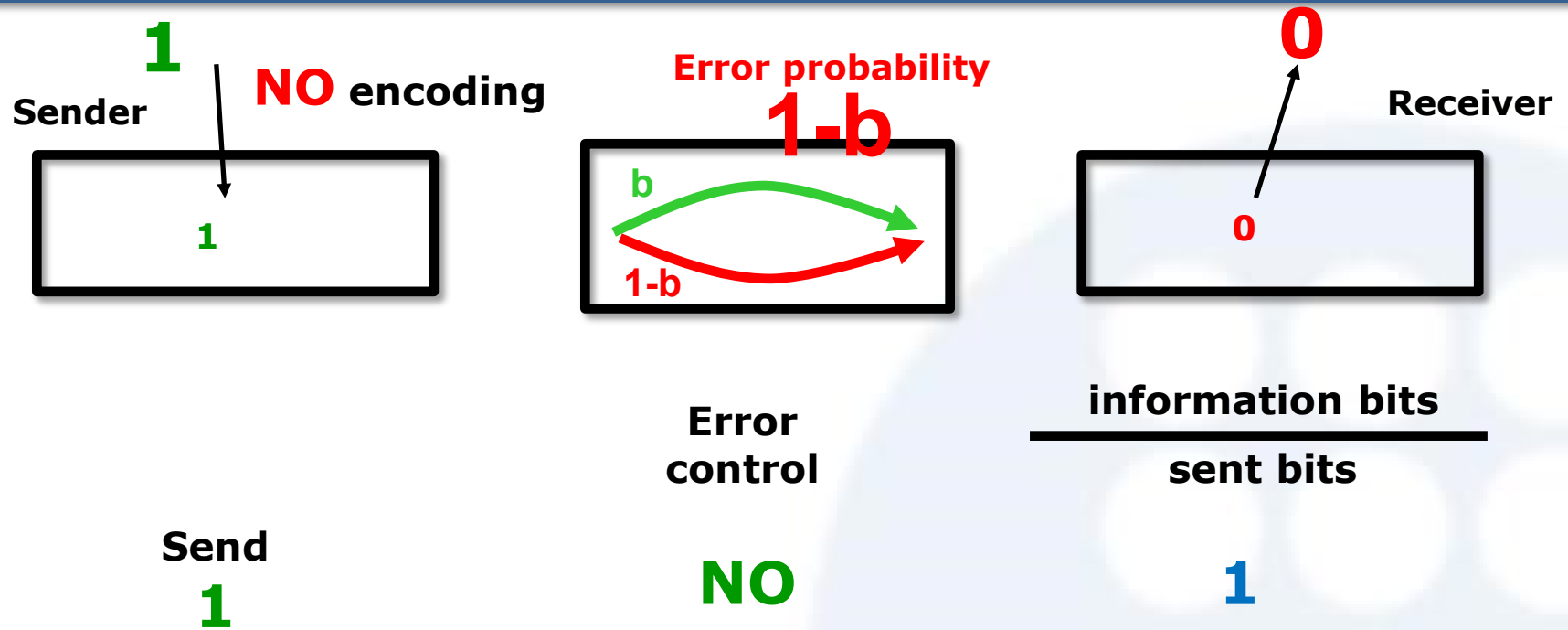


Can we correct errors?

Error Correcting Codes. Code rate.

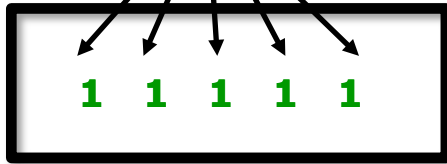


Error Correcting Codes. Code rate.

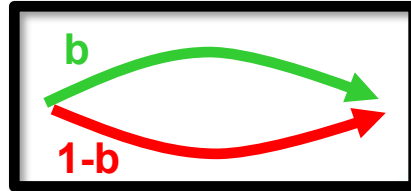


Error Correcting Codes. Code rate.

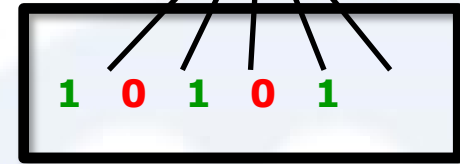
Sender **1** encoding



Majority decision



Receiver **1**



information bits

sent bits

Send

1

NO

1

Send

11111



$1/5 = 0.2$

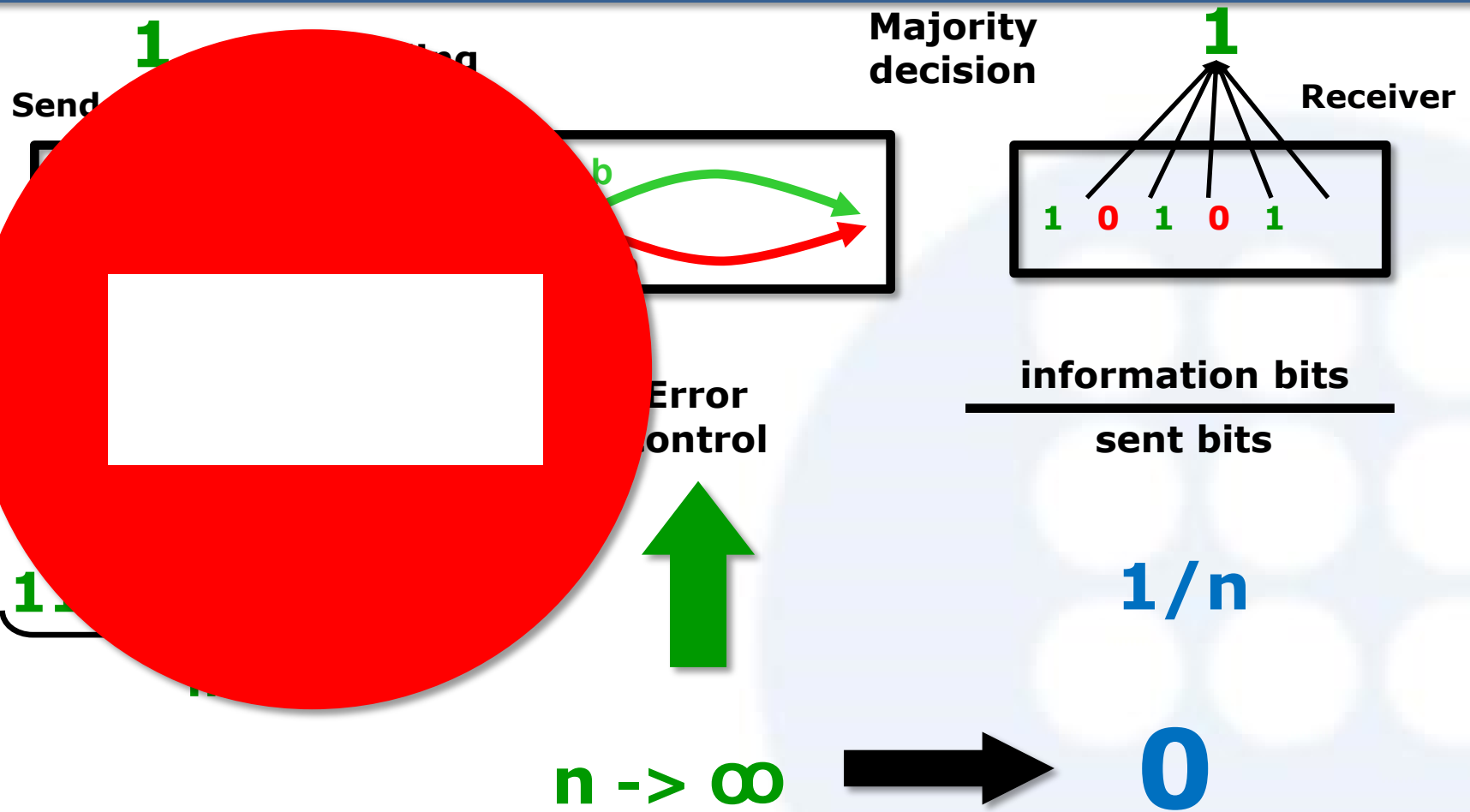
Send

111111 ... 11
n



$1/n$

Error Correcting Codes. Code rate.



Error Correcting Codes. Code rate.

We would like

Code rate

$n \rightarrow \infty$

Error
control



information bits
sent bits

> 0

2

Separating codes

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Separating codes.

Code C

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
1	0	1	1	0	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1

Separating codes.

Code **C**

1	0	0	1	1	1	0	1
2	0	1	0	1	0	1	1
3	0	1	1	0	1	1	0
4	1	0	0	0	1	1	1
5	1	0	1	1	0	1	0
6	1	1	0	1	1	0	0
7	1	1	1	0	0	0	1

Separating codes.

Code C

001

010

011

100

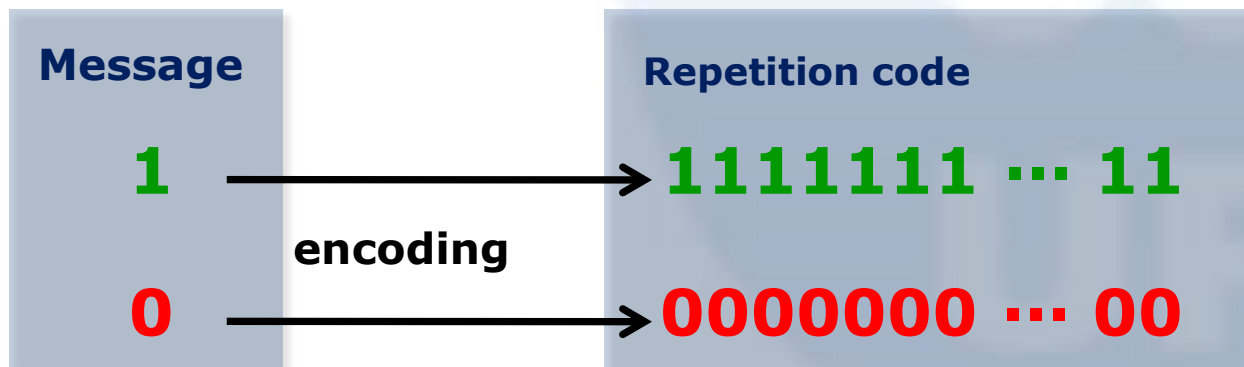
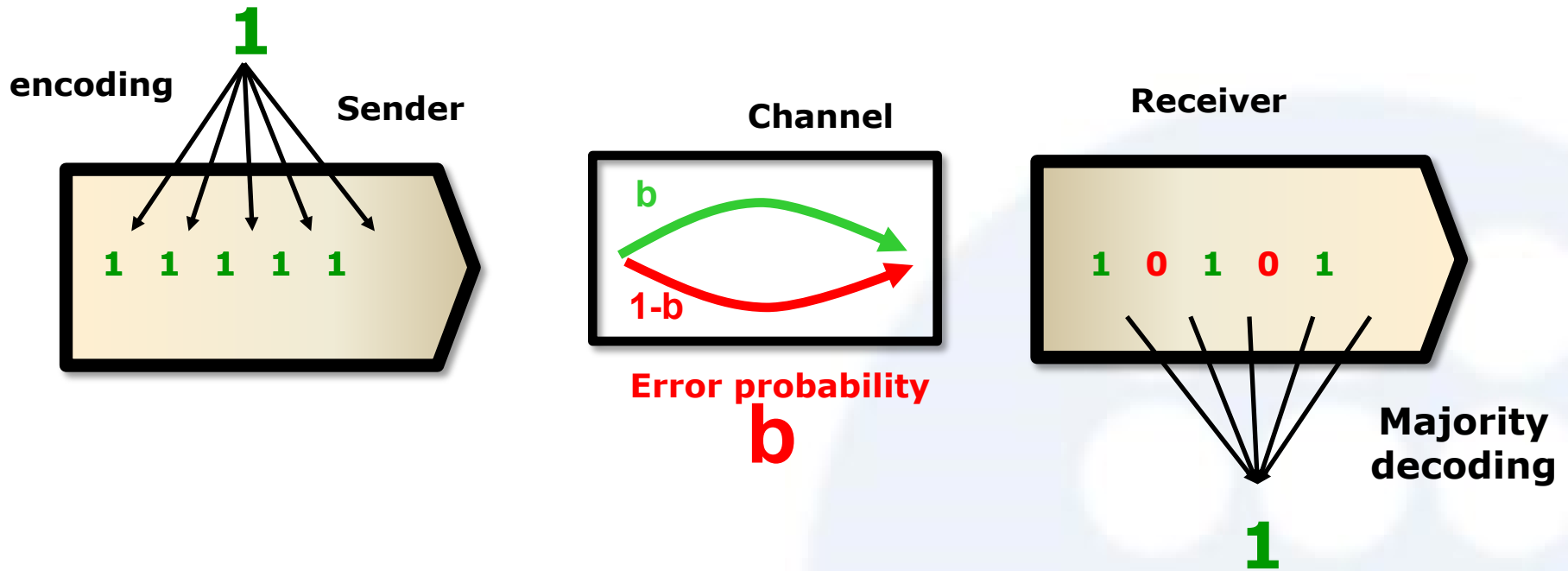
101

110

111

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
1	0	1	1	0	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1

Error Correcting Codes. Code rate.



Separating codes.

Code C

001

0 0 1

1 1 0 1

010

0 1 0

1 0 1 1

011

0 1 1

0 1 1 0

100

1 0 0

0 1 1 1

101

1 0 1

1 0 1 0

110

1 1 0

1 1 0 0

111

1 1 1

0 0 0 1

Separating codes.

Properties of **C** ?

001	0	0	1	1	1	0	1
010	0	1	0	1	0	1	1
011	0	1	1	0	1	1	0
100	1	0	0	0	1	1	1
101	1	0	1	1	0	1	0
110	1	1	0	1	1	0	0
111	1	1	1	0	0	0	1

Separating codes.

Properties of C ?

0 0 1 1 1 0 1

0 1 0 1 0 1 1

0 1 1 0 1 1 0

1 0 0 0 1 1 1

1 0 1 1 0 1 0

1 1 0 1 1 0 0

1 1 1 0 0 0 1

Choose any pair of pairs of codewords

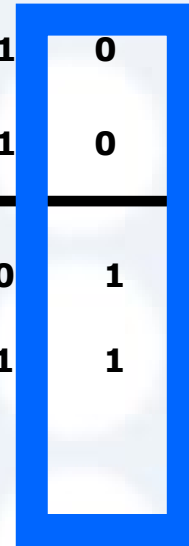
1 0 1 1 0 1 0

0 1 0 1 0 1 1

0 1 1 0 1 1 0

1 1 0 1 1 0 0

Discriminating index



Separating codes.

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
1	0	1	1	0	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1

**(2,2)-separating
code**

Discriminating index

UPC

Separating codes.

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**Dual Hamming code
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Simplex code
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(2,2)-separating codes
of positive rate**

3

Lovász Local Lemma

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Lovasz Local Lemma

Lovász local lemma

Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

- occurs with **probability** at most p
- is **independent** of all the other events except for **at most d** of them.

If **$ep(d+1) \leq 1$**

then there is a **nonzero probability** that none of the events occurs.



**“Nothing
bad
happens”**

**It can be used to proof
existence results**

4

Existence of
separating codes
of positive rate

Existence of (2,2)-separating codes.

**Is there a (2,2)-separating code
such**

$$\frac{\text{information bits}}{\text{sent bits}} > 0$$



Existence of (2,2)-separating codes.

Lovász local lemma

Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

- occurs with **probability** at most p
- is **independent** of all the other events except for **at most** d of them.

If $ep(d+1) \leq 1$

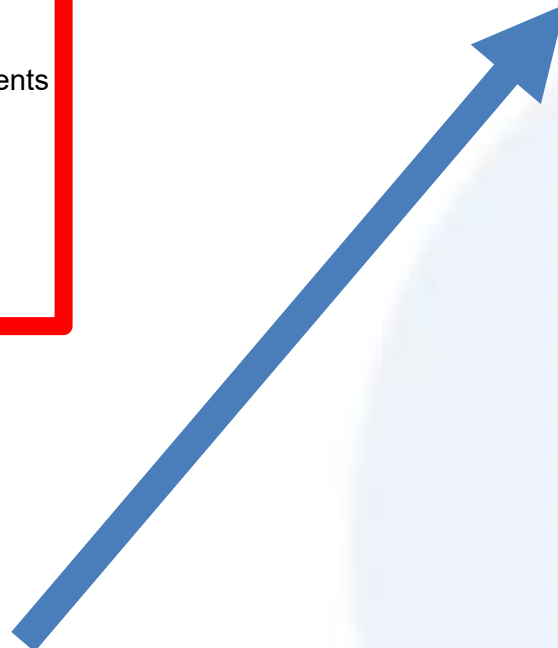
then there is a **nonzero probability** that none of the events occurs.

sets of disjoint pairs of pairs

0011101
0101011
0110110
1000111

Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0



UPC

Existence of (2,2)-separating codes.

Lovász local lemma

Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

- occurs with **probability** at most p
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If $ep(d+1) \leq 1$

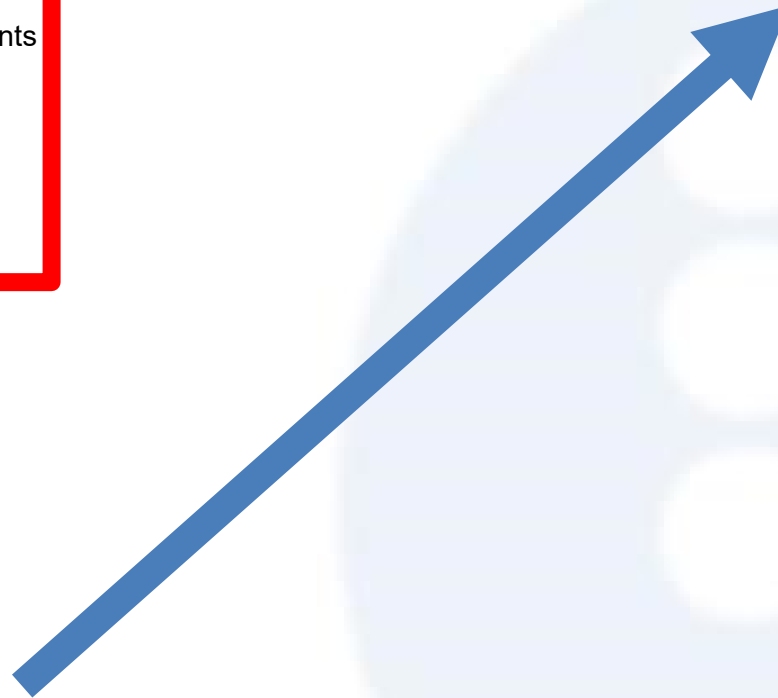
then there is a **nonzero probability** that none of the events occurs.

sets of disjoint pairs of pairs

0011101	0011101
0101011	0101011
0110110	0110110
1000111	0011010

Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0



UPC

Existence of (2,2)-separating codes.

Lovász local lemma

Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

- occurs with **probability** at most p
- is **independent** of all the other events except for **at most** d of them.

If $ep(d+1) \leq 1$

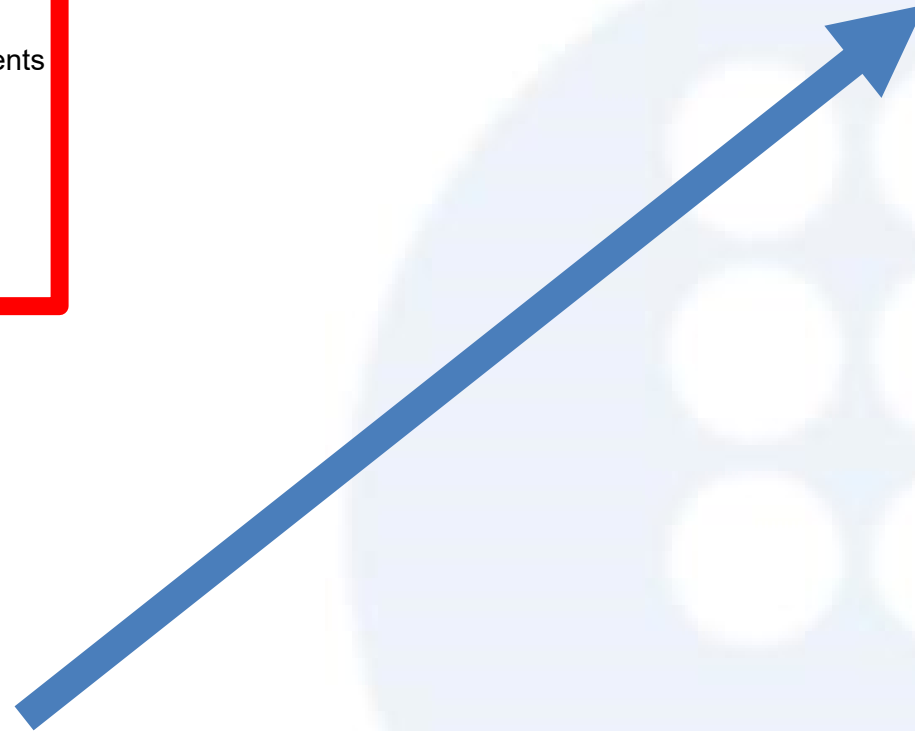
then there is a **nonzero probability** that none of the events occurs.

sets of disjoint pairs of pairs

0011101 0101011	0011101 0101011	0011101 0101011
0110110 1000111	0110110 0011010	1000111 0011010

Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0



UPC

Existence of (2,2)-separating codes.

Lovász local lemma

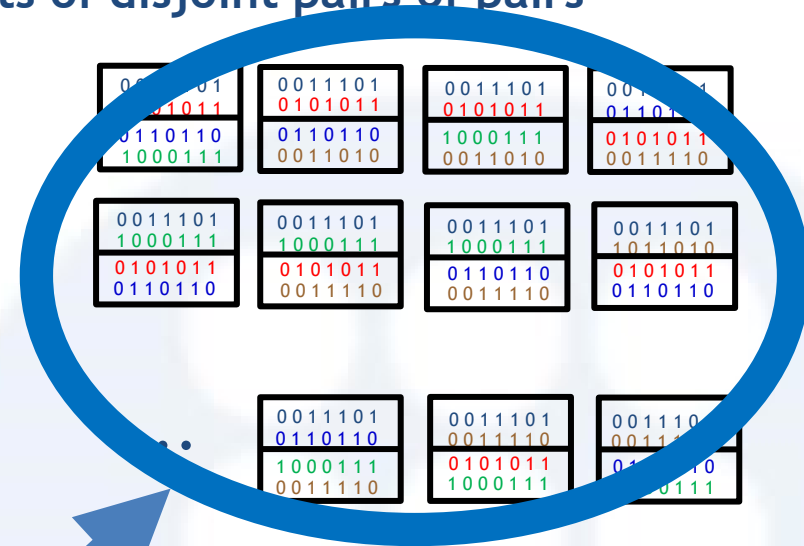
Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

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- is **independent** of all the other events except for **at most d** of them.

If $ep(d+1) \leq 1$

then there is a **nonzero probability** that none of the events occurs.

sets of disjoint pairs of pairs



Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

We would like
all pairs of pairs
separated

Existence of (2,2)-separating codes.

Lovász local lemma

Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

- occurs with **probability** at most p
- is **independent** of all the other events except for **at most d** of them.

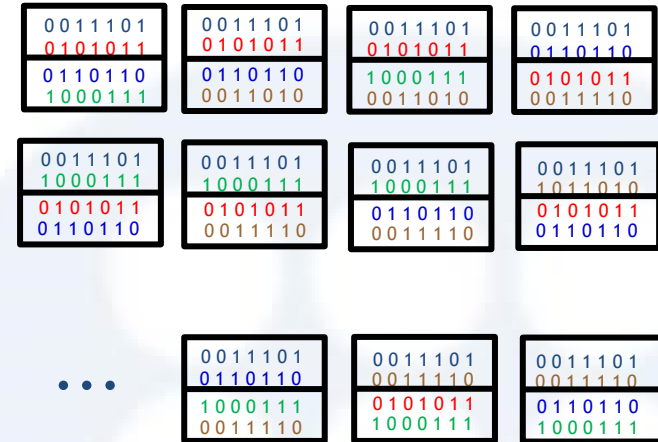
If $ep(d+1) \leq 1$

then there is a **nonzero probability** that none of the events occurs.

Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

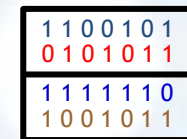
sets of disjoint pairs of pairs



Define the Event

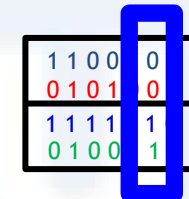
$E(i,j)$

'Bad event'



Not Separated :
No Discriminating index

'Good event'



Separated :

Discriminating index

Existence of (2,2)-separating codes.

Lovász local lemma

Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

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- is **independent** of all the other events except for **at most d** of them.

If $ep(d+1) \leq 1$

then there is a **nonzero probability** that none of the events occurs.

PROBABILITY OF A BAD EVENT

Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

size code

length code

'Bad event'

1	1	0	0	1	0	1
0	1	0	1	0	1	1
1	1	1	1	1	0	0
1	0	0	1	0	1	1

Not Separated :
No Discriminating
index

probability = $(7/8)^{\{\text{length code}\}}$

Existence of (2,2)-separating codes.

Lovász local lemma

Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

- occurs with **probability** at most p
- is **independent** of all the other events except for **at most d** of them.

If $ep(d+1) \leq 1$

then there is a **nonzero probability** that none of the events occurs.

sets of disjoint pairs of pairs



Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

size code

length code

**DEPENDENCE
OF
BAD EVENTS**

Existence of (2,2)-separating codes.

Lovász local lemma

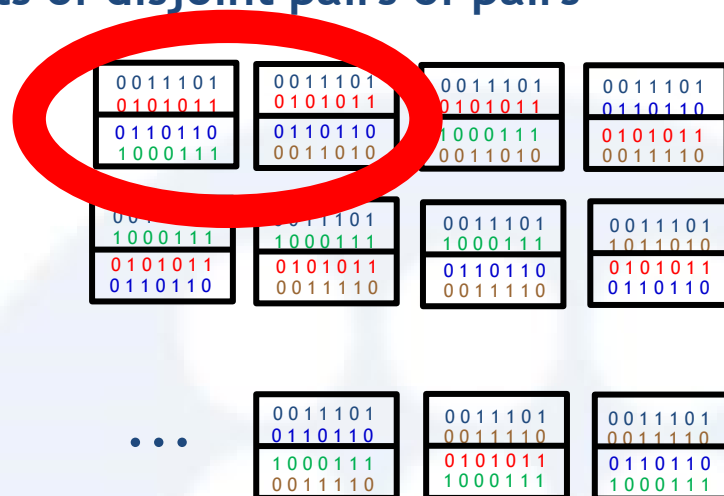
Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

- occurs with **probability** at most p
- is **independent** of all the other events except for **at most** d of them.

If $ep(d+1) \leq 1$

then there is a **nonzero probability** that none of the events occurs.

sets of disjoint pairs of pairs



Dependent

(share at least a row)

Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

size code

length code

Existence of (2,2)-separating codes.

Lovász local lemma

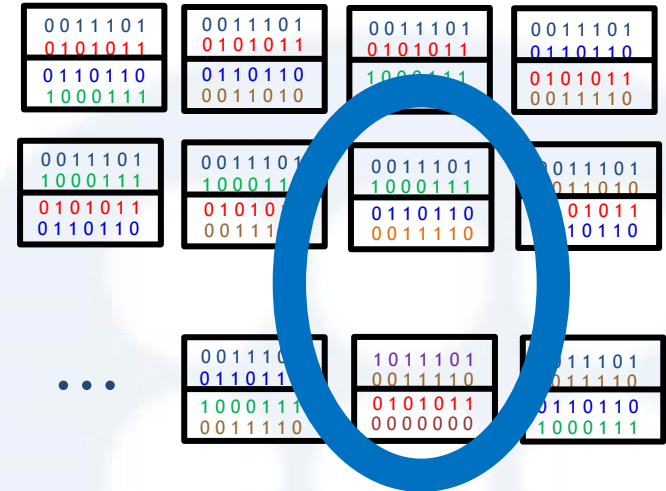
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If $ep(d+1) \leq 1$

then there is a **nonzero probability** that none of the events occurs.

sets of disjoint pairs of pairs



Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

size code

length code

Independent!!

do not share rows

Existence of (2,2)-separating codes.

Lovász local lemma

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If $ep(d+1) \leq 1$

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sets of disjoint pairs of pairs



Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

size code

length code

dependence $< 5\{\text{size code}\}^3$

Existence of (2,2)-separating codes.

Lovász local lemma

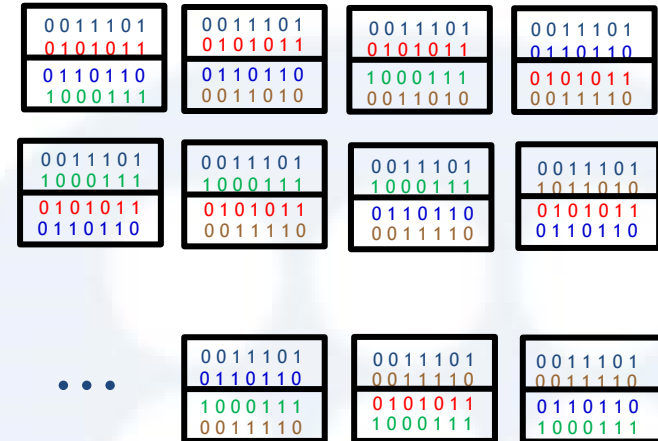
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sets of disjoint pairs of pairs



Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

size code

length code

'Bad event'

1	1	0	0	1	0	1
0	1	0	1	0	1	1
1	1	1	1	1	0	0
1	0	0	1	0	1	1

Not Separated :
No Discriminating
index

$$\text{prob} = (7/8)^{\{\text{length code}\}}$$

$$\text{dependence} < 5\{\text{size code}\}^3$$

Existence of (2,2)-separating codes.

Lovász local lemma

Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

- occurs with **probability** at most p
- is **independent** of all the other events except for **at most d** of them.

If **$ep(d+1) \leq 1$**

then there is a **nonzero probability** that none of the events occurs.

Theorem:

There exist 2-separating codes of size

$$\text{size code} = \text{CONST} \cdot (8/7)^{\text{code length}/3}$$

Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

size code

length code

'Bad event'

1	1	0	0	1	0	1
0	1	0	1	0	1	1
1	1	1	1	1	0	0
1	0	0	1	0	1	1

**Not Separated :
No Discriminating
index**

$$\text{prob} = (7/8)^{\{\text{length code}\}}$$

$$\text{dependence} < 5\{\text{size code}\}^3$$

Existence of (2,2)-separating codes.

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Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

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If $ep(d+1) \leq 1$

then there is a **nonzero probability** that none of the events occurs.

Theorem:

There exist 2-separating codes of size

$$\text{size code} = \text{CONST} \cdot (8/7)^{\text{code length}/3}$$

Proof:

$$e \cdot ((7/8)^{\{\text{length code}\}}) (5\{\text{size code}\}^3) \leq 1$$

Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

size code

length code

'Bad event'

1	1	0	0	1	0	1
0	1	0	1	0	1	1
1	1	1	1	1	1	0
1	0	0	1	0	1	1

Not Separated :
No Discriminating
index

$$\text{prob} = (7/8)^{\{\text{length code}\}}$$

$$\text{dependence} < 5\{\text{size code}\}^3$$

Existence of (2,2)-separating codes.

Lovász local lemma

Let A_1, A_2, \dots, A_k be a sequence of **bad** events such that each event

- occurs with **probability** at most p
- is **independent** of all the other events except for **at most d** of them.

If $ep(d+1) \leq 1$

then there is a **nonzero probability** that none of the events occurs.

Theorem:

There exist 2-separating codes of size

$$\text{size code} = \text{CONST} \cdot (8/7)^{\text{code length}/3}$$

with

$$\frac{\text{information bits}}{\text{sent bits}} > 0$$

positive rate

Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

size code

length code

5

Algorithmic construction

UPC

Algorithmic Construction.

Bernoulli random variables

x_{11} x_{12} x_{13} x_{14} x_{15} x_{16} x_{17}
 x_{21} \dots

SAMPLE

\dots x_{76} x_{77}

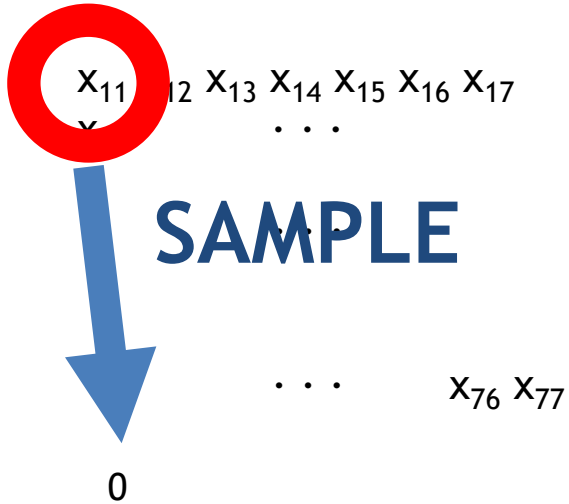
$$\Pr(x_{ij} = 0) = \frac{1}{2}$$

$$\Pr(x_{ij} = 1) = \frac{1}{2}$$

UPC

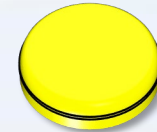
Algorithmic Construction.

Bernoulli random variables



$$\Pr(x_{ij} = 0) = \frac{1}{2}$$

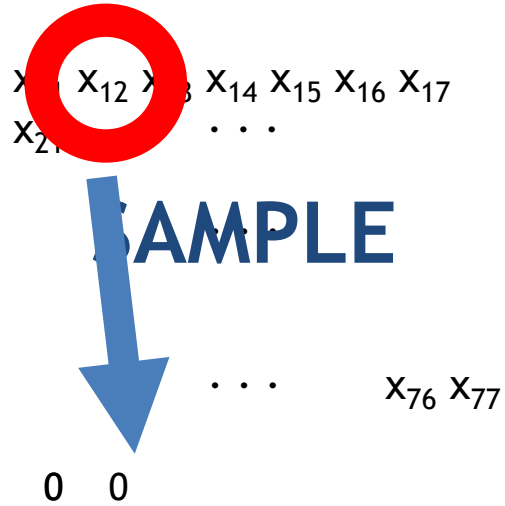
$$\Pr(x_{ij} = 1) = \frac{1}{2}$$



UPC

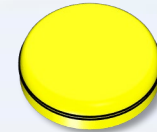
Algorithmic Construction.

Bernoulli random variables



$$\Pr(x_{ij} = 0) = \frac{1}{2}$$

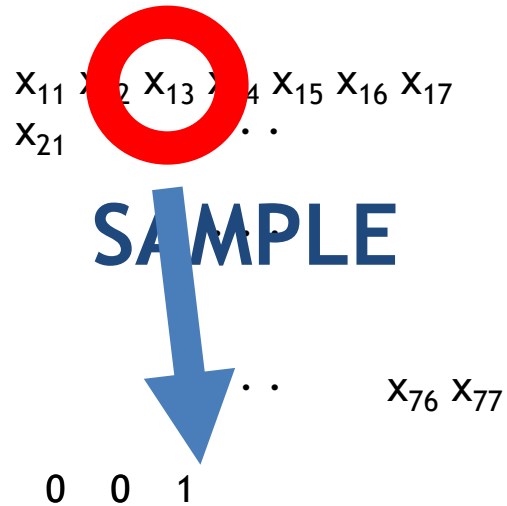
$$\Pr(x_{ij} = 1) = \frac{1}{2}$$



UPC

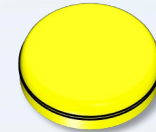
Algorithmic Construction.

Bernoulli random variables



$$\Pr(x_{ij} = 0) = \frac{1}{2}$$

$$\Pr(x_{ij} = 1) = \frac{1}{2}$$



UPC

Algorithmic Construction.

Bernoulli random variables

X_{11} X_{12} X_{13} X_{14} X_{15} X_{16} X_{17}
 X_{21} \dots

SAMPLE

\dots X_{76} X_{77}

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

sets of disjoint pairs of pairs

0011101 0101011	0011101 0101011	0011101 0101011
0110110 1000111	0110110 0011010	1000111 0011010

UPC

Algorithmic Construction.

Bernoulli random variables

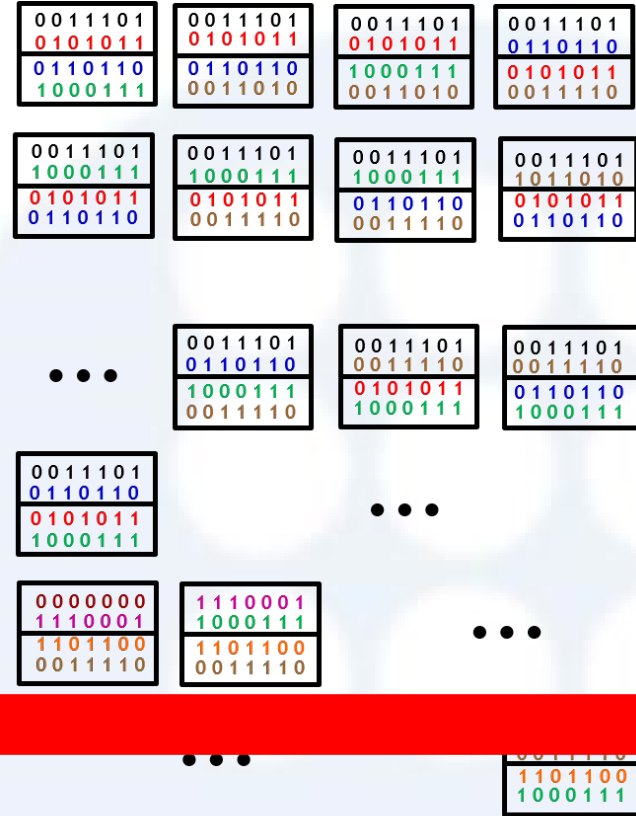
sets of disjoint pairs of pairs

$X_{11} X_{12} X_{13} X_{14} X_{15} X_{16} X_{17}$
 $X_{21} \dots$

SAMPLE

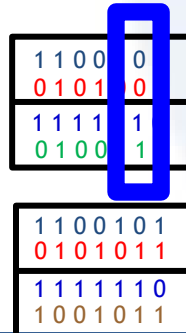
$\dots X_{76} X_{77}$

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0



'Good event'

'Bad event'



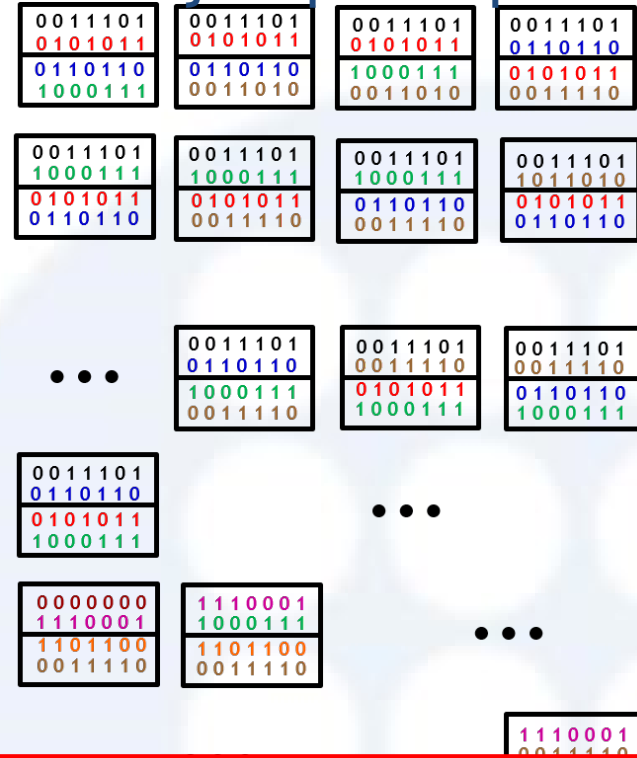
Separated : Discriminating index

Algorithmic Construction.

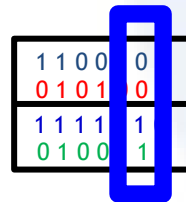
Bernoulli random variables

sets of disjoint pairs of pairs

Avoid all bad events



'Good event'



Separated : Discriminating index

'Bad event'



Not Separated : No Discriminating index

Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$   $\leftarrow$  current assignment
while (bad event  $E_j$  occurs
      in current assignment) {
  RESAMPLE  $E_j$ 
  resample variables in  $E_j$ 
  while (bad event  $E_k$  in
        neighborhood  $E_j$ ) {
    RESAMPLE  $E_k$ 
  }
}
```

**Algorithmic
Lovász Local Lemma**

Moser-Tardos

UPC

Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

X_{11} X_{12} X_{13} X_{14} X_{15} X_{16} X_{17}

X_{21} \dots

\dots

\dots X_{76} X_{77}

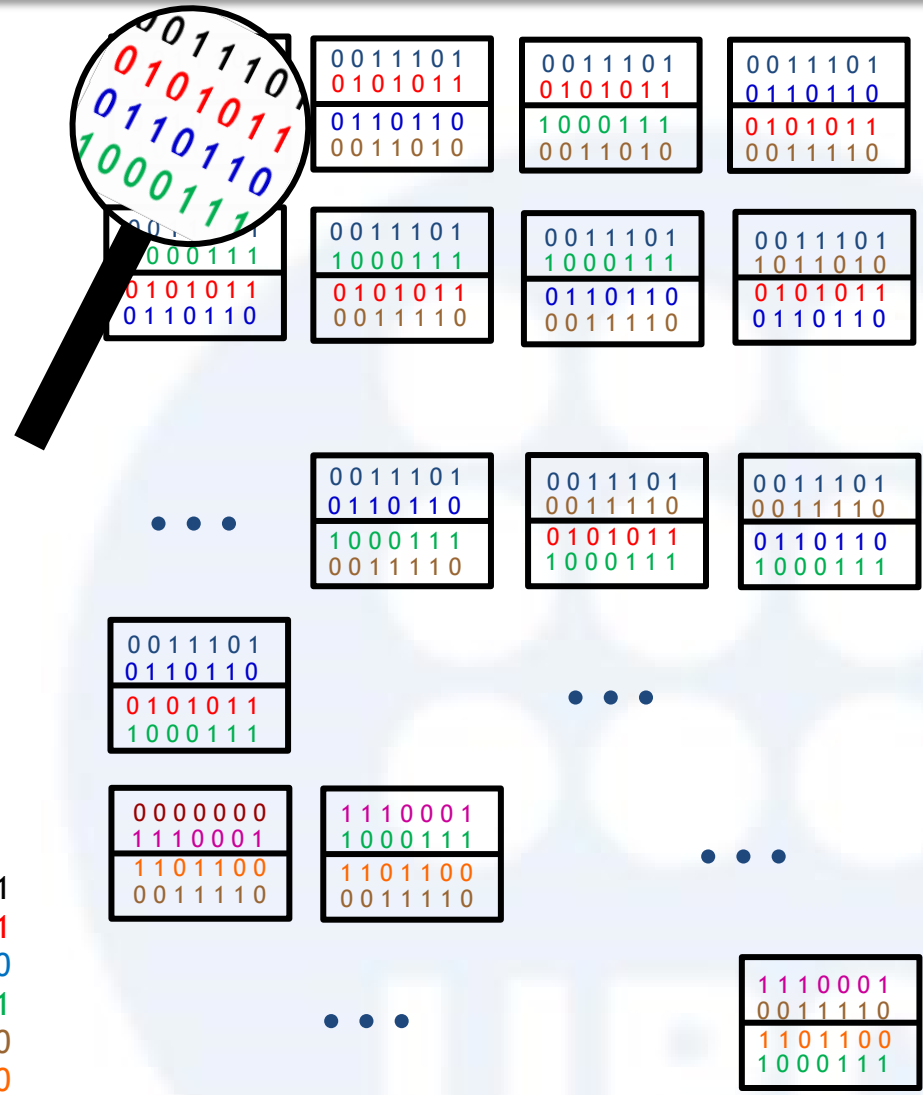
0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

Algorithmic Construction.

Algorithm:

sample $X_{ij} \leftarrow$ current assignment

while (bad event E_j occurs
in current assignment) {

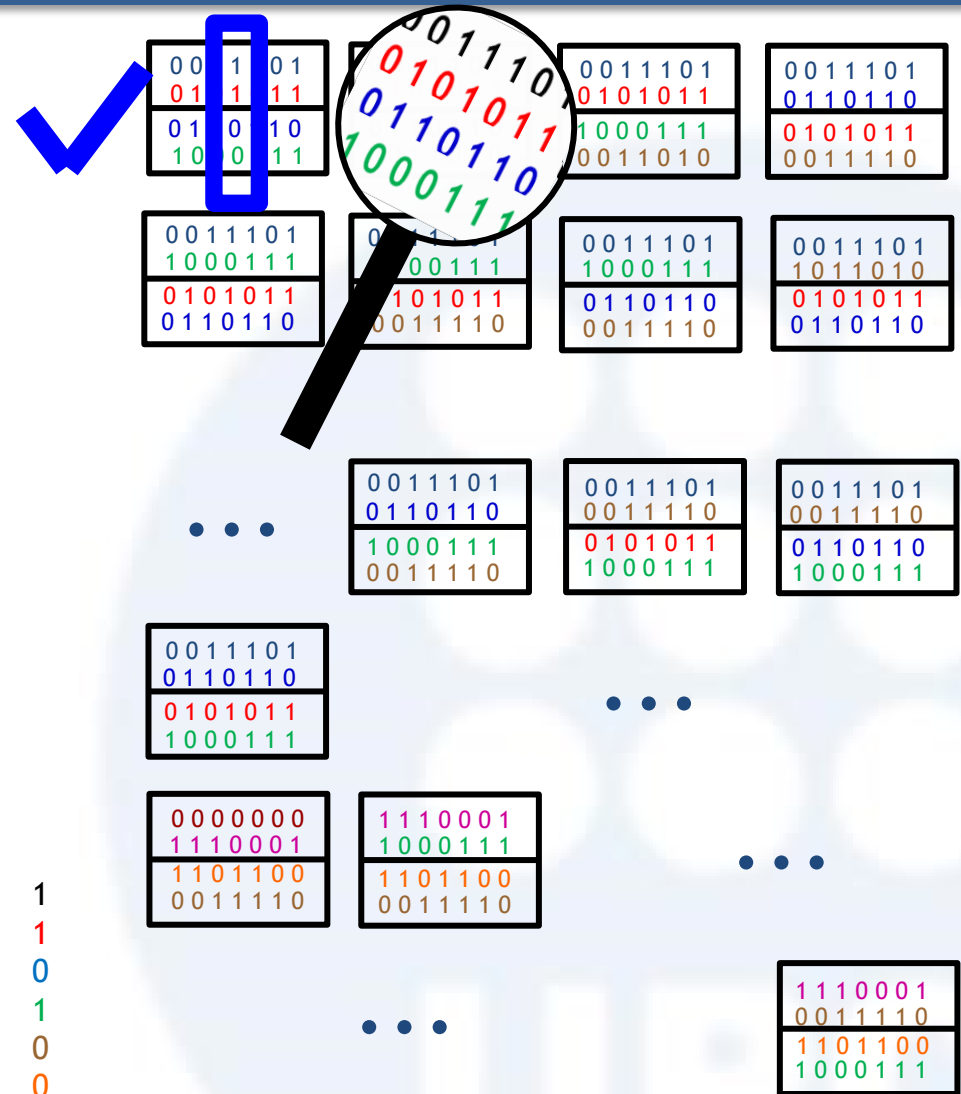


X_{11}	X_{12}	X_{13}	X_{14}	X_{15}	X_{16}	X_{17}
0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
...						
					X_{76}	X_{77}
					0	0
					0	0
					0	0

Algorithmic Construction.

Algorithm:

sample $X_{ij} \leftarrow$ current assignment
 while (bad event E_j occurs
 in current assignment) {

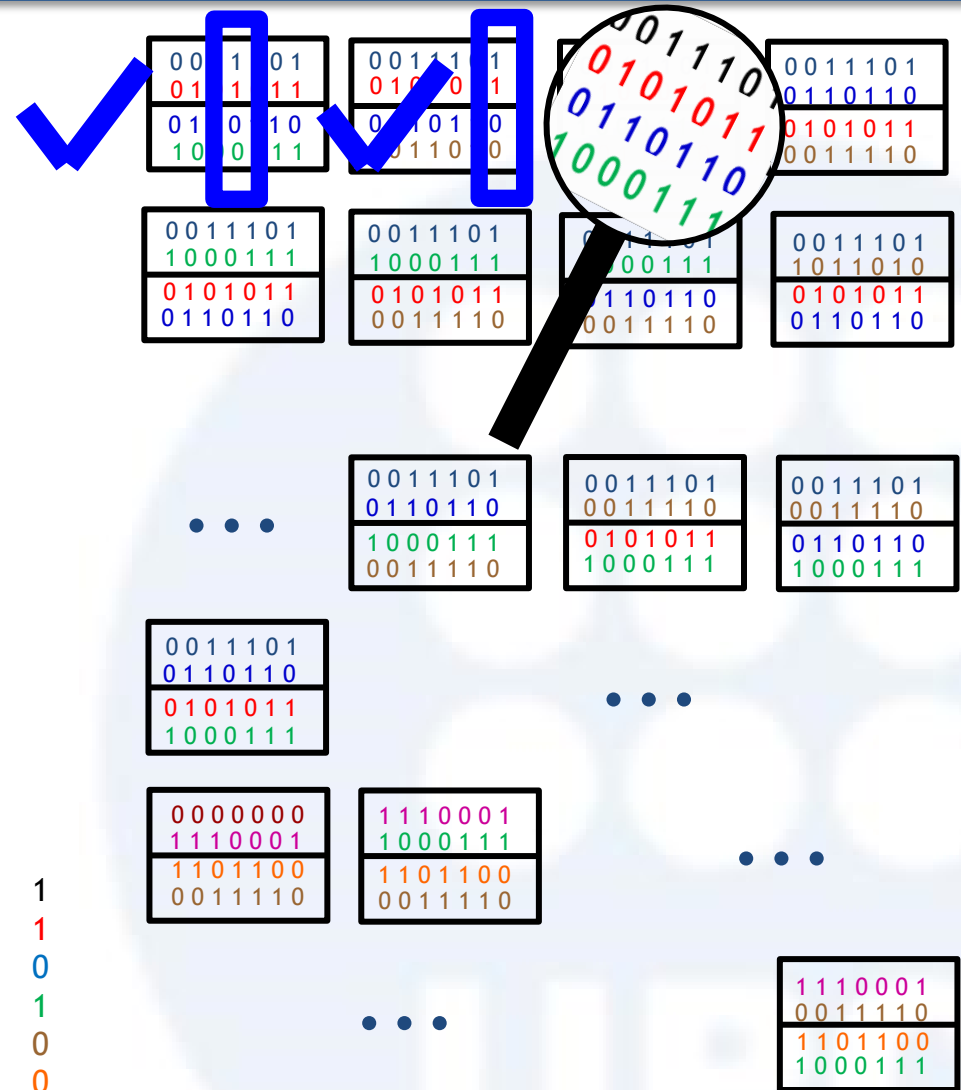


X_{11}	X_{12}	X_{13}	X_{14}	X_{15}	X_{16}	X_{17}	0	0	1	1	1	0	1
X_{21}		...					0	1	0	1	0	1	1
							0	1	1	0	1	1	0
		...					1	0	0	0	1	1	1
							0	0	1	1	1	1	0
							1	1	0	1	1	0	0
							1	1	1	0	0	0	1
		...					0	0	0	0	0	0	0
				X_{76}	X_{77}								

Algorithmic Construction.

Algorithm:

sample $X_{ij} \leftarrow$ current assignment
 while (bad event E_j occurs
 in current assignment) {



X_{11}	X_{12}	X_{13}	X_{14}	X_{15}	X_{16}	X_{17}	0	0	1	1	1	0	1
X_{21}		...					0	1	0	1	0	1	1
							0	1	1	0	1	1	0
		...					1	0	0	0	1	1	1
							0	0	1	1	1	1	0
							1	1	0	1	1	0	0
							1	1	1	0	0	0	1
		...					0	0	0	0	0	0	0
				X_{76}	X_{77}								

Algorithmic Construction.

Algorithm:

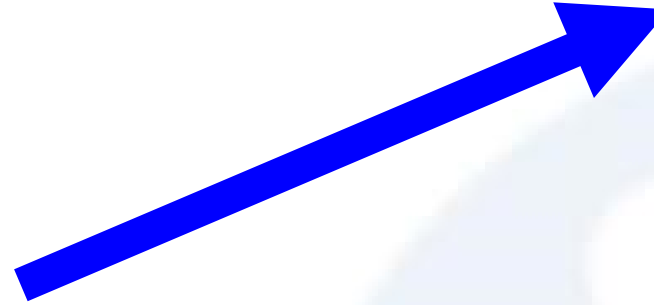
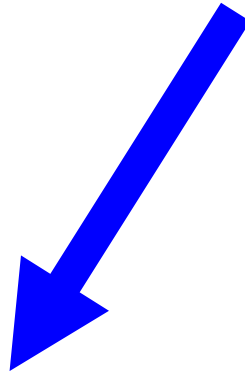
sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

0	0	1	1	1	0	1
0	1	0	1	0	1	1
1	0	0	1	1	1	1
0	0	1	1	1	1	0



X_{11}	X_{12}	X_{13}	X_{14}	X_{15}	X_{16}	X_{17}
X_{21}	X_{22}	X_{23}	X_{24}	X_{25}	X_{26}	X_{27}
...						
X_{41}	X_{42}	X_{43}	X_{44}	X_{45}	X_{46}	X_{47}
X_{51}	X_{52}	X_{53}	X_{54}	X_{55}	X_{56}	X_{57}
...						
				X_{76}	X_{77}	

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

UPC

Algorithmic Construction.

Algorithm:

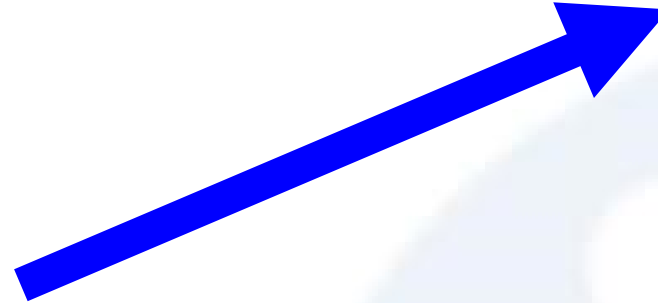
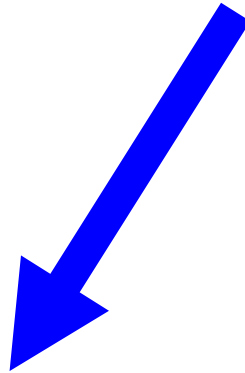
sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

0	0	1	1	1	0	1
0	1	0	1	0	1	1
1	0	0	1	1	1	1
0	0	1	1	0	1	0



X_{11}	X_{12}	X_{13}	X_{14}	X_{15}	X_{16}	X_{17}
X_{21}	X_{22}	X_{23}	X_{24}	X_{25}	X_{26}	X_{27}

0	0	1	1	1	0	1
0	1	0	1	0	1	1

X_{41}	X_{42}	X_{43}	X_{44}	X_{45}	X_{46}	X_{47}
X_{51}	X_{52}	X_{53}	X_{54}	X_{55}	X_{56}	X_{57}

1	0	0	0	1	1	1
0	0	1	1	1	1	0

... X_{76} X_{77}

UPC

Algorithmic Construction.

Algorithm:

sample $X_{ij} \leftarrow$ current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

0	0	1	1	1	0	1
0	1	0	1	0	1	1
1	0	0	1	1	1	1
0	0	1	1	0	1	0

$$\Pr(x_{ij} = 0) = \frac{1}{2}$$



$$\Pr(x_{ij} = 1) = \frac{1}{2}$$



X_{11}	X_{12}	X_{13}	X_{14}	X_{15}	X_{16}	X_{17}
X_{21}	X_{22}	X_{23}	X_{24}	X_{25}	X_{26}	X_{27}

0	0	1	1	1	0	1
0	1	0	1	0	1	1

X_{41}	X_{42}	X_{43}	X_{44}	X_{45}	X_{46}	X_{47}
X_{51}	X_{52}	X_{53}	X_{54}	X_{55}	X_{56}	X_{57}

1	0	0	0	1	1	1
0	0	1	1	1	1	0

... X_{76} X_{77}

Algorithmic Construction.

Algorithm:

sample $X_{ij} \leftarrow$ current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

while (bad event E_k in
neighborhood E_j) {

RESAMPLE E_k

}

}

X_{11}	X_{12}	X_{13}	X_{14}	X_{15}	X_{16}	X_{17}	0	0	1	1	1	0	1
X_{21}		...					0	1	0	1	0	1	1
							0	1	1	0	1	1	0
		...					1	0	0	0	1	1	1
							1	0	1	1	0	1	0
							1	1	0	1	1	0	0
							1	1	1	0	0	0	1
		...					0	0	0	0	0	0	0
					X_{76}	X_{77}							

0011101
0101011
1000111
0011010

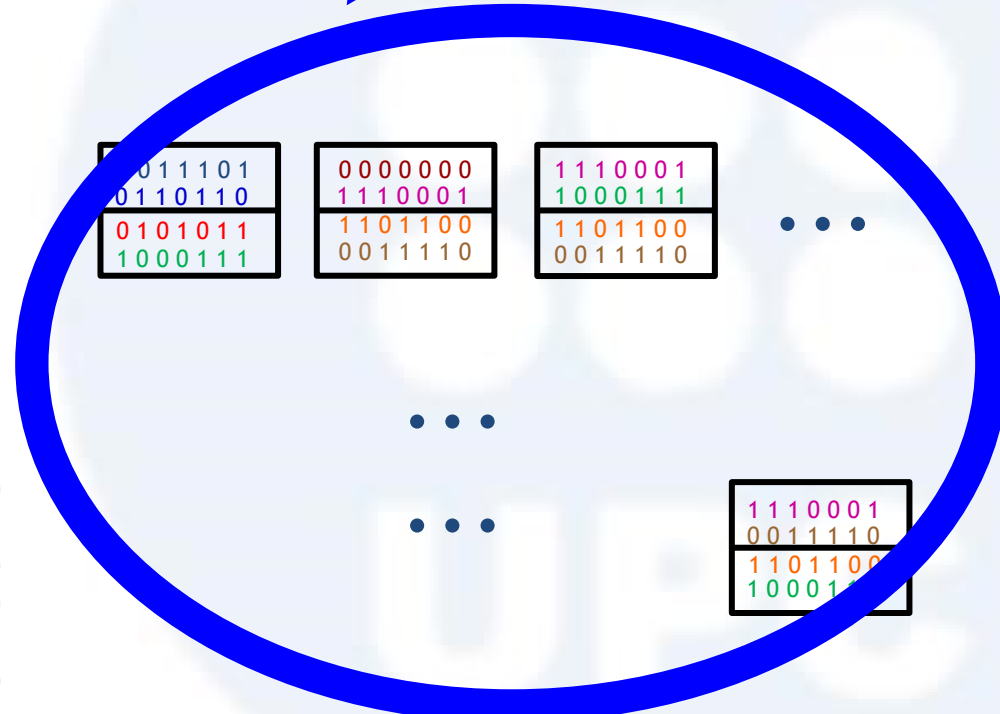
Dependent

0011101
0110110
0101011
1000111

0000000
1110001
1101100
0011110

1110001
1000111
1101100
0011110

1110001
0011110
1101100
1000111



Algorithmic Construction.

Algorithm:

sample $X_{ij} \leftarrow$ current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

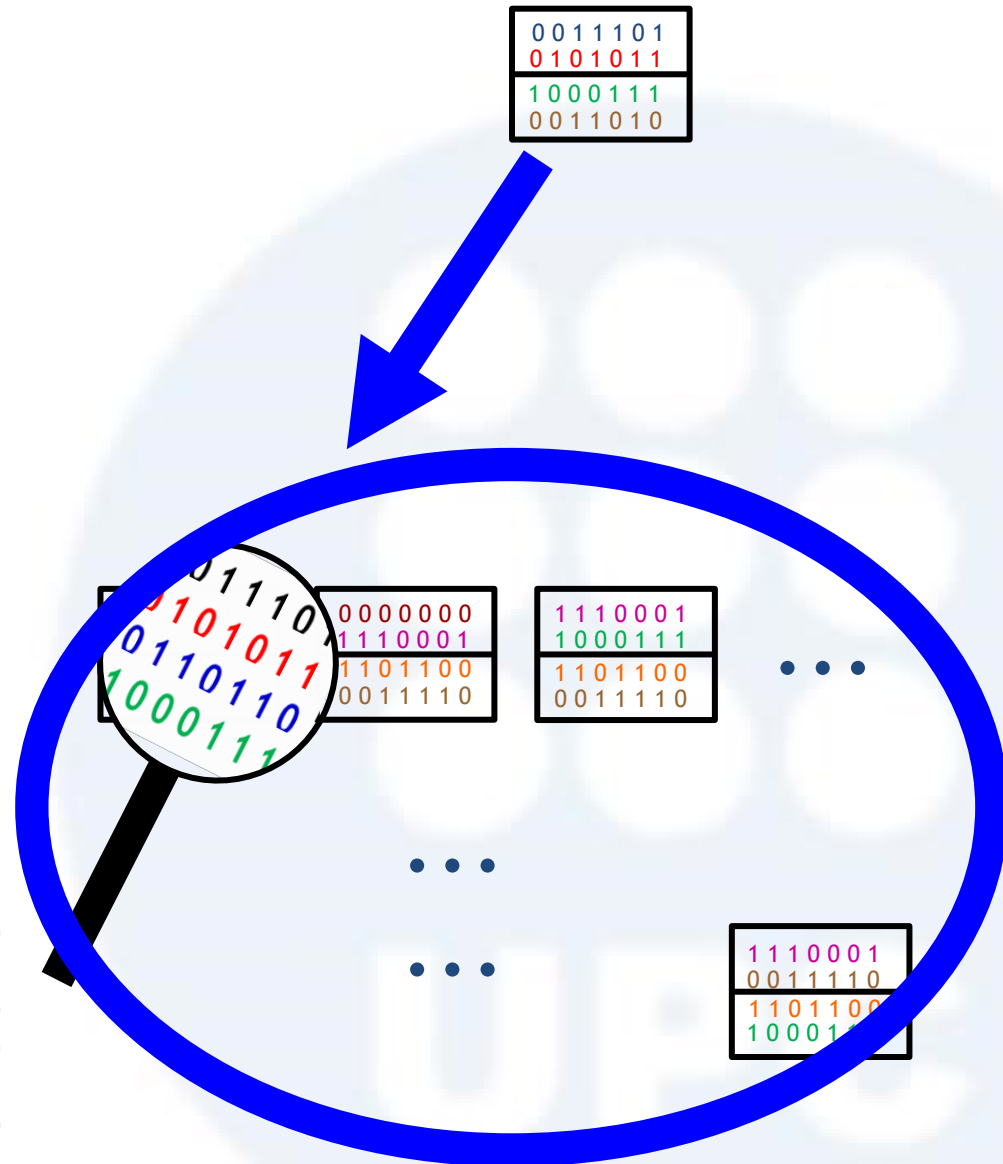
while (bad event E_k in
neighborhood E_j) {

RESAMPLE E_k

}

}

X_{11}	X_{12}	X_{13}	X_{14}	X_{15}	X_{16}	X_{17}	0	0	1	1	1	0	1
X_{21}		...					0	1	0	1	0	1	1
							0	1	1	0	1	1	0
		...					1	0	0	0	1	1	1
							1	0	1	1	0	1	0
							1	1	0	1	1	0	0
							1	1	1	0	0	0	1
		...					0	0	0	0	0	0	0
					X_{76}	X_{77}							



Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$  <- current assignment
while (bad event  $E_j$  occurs
      in current assignment) {
  RESAMPLE  $E_j$ 
  resample variables in  $E_j$ 
  while (bad event  $E_k$  in
        neighborhood  $E_j$ ) {
    RESAMPLE  $E_k$ 
  }
}
```

Theorem

For every **code length** > 0 ,

there is a randomized algorithm,

such that

the probability of it lasting for at least N rounds

is inverse exponential in N , and
that outputs a 2-separating code of size

size code = $\text{CONST} \cdot (8/7)^{\text{code length}/3}$

UPC

Sketch of the proof

UPC

Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

while (bad event E_k in
neighborhood F_j) {

RESAMPLE E_k

}

}

✓ Directly compute the probability of having
at least n RESAMPLE phases.

UPC

Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$  <- current assignment
while (bad event  $E_j$  occurs
      in current assignment) {
  RESAMPLE  $E_j$ 
  resample variables in  $E_j$ 
  while (bad event  $E_k$  in
        neighborhood  $E_j$ ) {
    RESAMPLE  $E_k$ 
  }
}
```

✓ **Directly compute the probability of having at least n RESAMPLE phases.**

✓ **In the literature most of the approaches compute the expectation of the number of RESAMPLE phases.**

UPC

Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$  <- current assignment
while (bad event  $E_j$  occurs
      in current assignment) {
  RESAMPLE  $E_j$ 
  resample variables in  $E_j$ 
  while (bad event  $E_k$  in
        neighborhood  $E_j$ ) {
    RESAMPLE  $E_k$ 
  }
}
```

✓ **Directly compute the probability of having at least n RESAMPLE phases.**

✓ **In the literature most of the approaches compute the expectation of the number of RESAMPLE phases.**



✓ **Probability of at least n RESAMPLE phases is inverse exponential to n**

Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$  <- current assignment
while (bad event  $E_j$  occurs
      in current assignment) {
  RESAMPLE  $E_j$ 
  resample variables in  $E_j$ 
  while (bad event  $E_k$  in
        neighborhood  $E_j$ ) {
    RESAMPLE  $E_k$ 
  }
}
```

We want to show this

✓ **Directly compute the probability of having at least n RESAMPLE phases.**

✓ **In the literature most of the approaches compute the expectation of the number of RESAMPLE phases.**

✓ **Probability of at least n RESAMPLE phases is inverse exponential to n**



Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$   $\leftarrow$  current assignment
while (bad event  $E_j$  occurs
      in current assignment) {
  RESAMPLE  $E_j$ 
  resample variables in  $E_j$ 
  while (bad event  $E_k$  in
        neighborhood  $E_j$ ) {
    RESAMPLE  $E_k$ 
  }
}
```

✓ Directly compute the probability of having at least n RESAMPLE phases.

✓ In the literature most of the approaches compute the expectation of the number of RESAMPLE phases.

Probability of at least n RESAMPLE phases is inverse exponential to n

We want to show this

We want to upper bound this probability

UPC

Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$  <- current assignment
while (bad event  $E_j$  occurs
      in current assignment) {
  RESAMPLE  $E_j$ 
  resample variables in  $E_j$ 
  while (bad event  $E_k$  in
        neighborhood  $E_j$ ) {
    RESAMPLE  $E_k$ 
  }
}
```

✓ Directly compute the probability of having at least n RESAMPLE phases.

✓ In the literature most of the approaches compute the expectation of the number of RESAMPLE phases.

Probability of at least n RESAMPLE phases is inverse exponential to n

We want to upper bound this probability

we draw a picture of how the resamplings occur

Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$  <- current assignment
```

```
while (bad event  $E_j$  occurs  
in current assignment) {
```

```
  RESAMPLE  $E_j$ 
```

```
  resample variables in  $E_j$ 
```

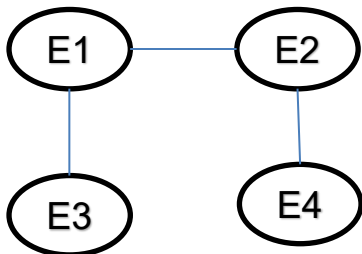
```
  while (bad event  $E_k$  in  
  neighborhood  $\epsilon$ ) {
```

```
    RESAMPLE  $E_k$ 
```

```
  }
```

```
}
```

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

UPC

Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$  <- current assignment
```

```
while (bad event  $E_j$  occurs  
in current assignment) {
```

```
  RESAMPLE  $E_j$ 
```

```
  resample variables in  $E_j$ 
```

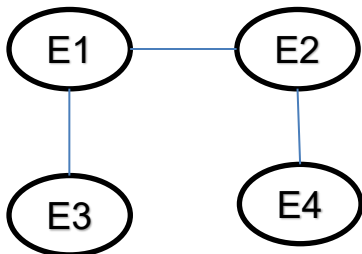
```
  while (bad event  $E_k$  in  
  neighborhood) {
```

```
    RESAMPLE  $E_k$ 
```

```
  }
```

```
}
```

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:



Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$  <- current assignment
```

```
while (bad event  $E_j$  occurs  
in current assignment) {
```

```
  RESAMPLE  $E_j$ 
```

```
  resample variables in  $E_j$ 
```

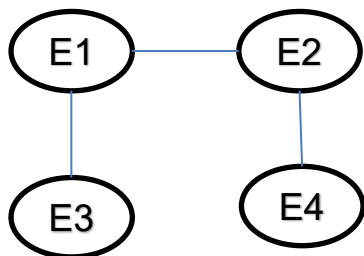
```
  while (bad event  $E_k$  in  
  neighborhood) {
```

```
    RESAMPLE  $E_k$ 
```

```
  }
```

```
}
```

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:

time



UPC

Algorithmic Construction.

Algorithm:

```
sample  $X_i$  <- current assignment
```

```
while (bad event  $E_j$  occurs  
in current assignment) {
```

```
  RESAMPLE  $E_j$ 
```

```
  resample variables in  $E_j$ 
```

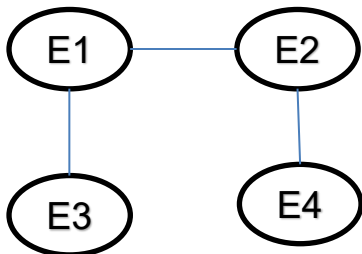
```
  while (bad event  $E_k$  in  
  neighborhood  $\epsilon$ ) {
```

```
    RESAMPLE  $E_k$ 
```

```
  }
```

```
}
```

We need to know how the events
depend on each other



**we want to draw a picture
of how the resamplings occur**

Example of an execution:

Phase 1 (E1)

Event₁ occurs (fail)

time

UPC

Algorithmic Construction.

Algorithm:

```
sample  $X_i$  <- current assignment  
while (bad event  $E_j$  occurs  
in current assignment) {  
  RESAMPLE  $E_j$   
  resample variables in  $E_j$   
  while (bad event  $E_k$  in  
  neighborhood of  $E_j$ ) {  
    RESAMPLE  $E_k$   
  }  
}
```

**we want to draw a picture
of how the resamplings occur**

Example of an execution:

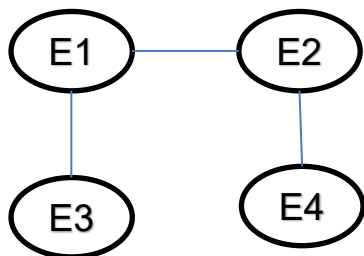
Phase 1 (E1)

Event₁ occurs (fail)

RESAMPLE E₁

time

**We need to know how the events
depend on each other**



Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

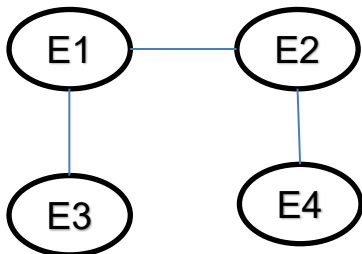
while (bad event E_k in
neighborhood) {

RESAMPLE E_k

}

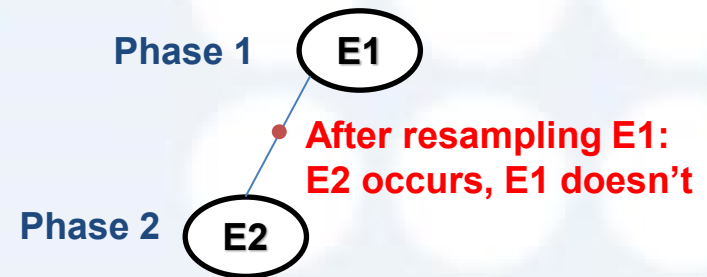
}

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:



time

Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

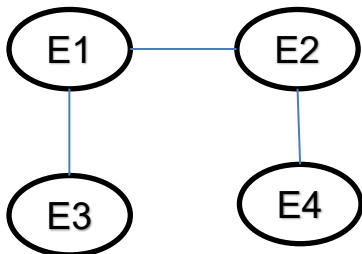
while (bad event E_k in
neighborhood) {

RESAMPLE E_k

}

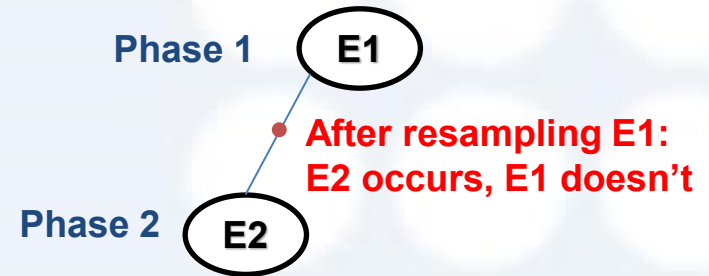
}

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:



**Do as before !!
Resample E2**

time

Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

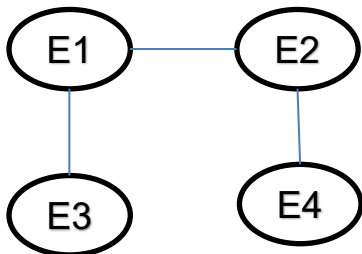
while (bad event E_k in
neighborhood) {

RESAMPLE E_k

}

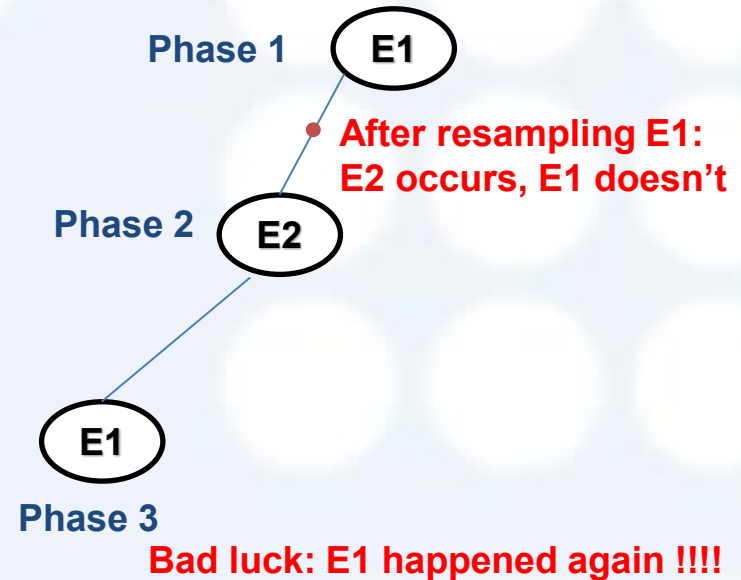
}

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:



Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

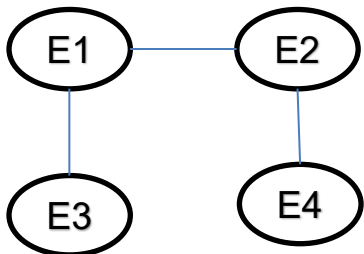
while (bad event E_k in
neighborhood) {

RESAMPLE E_k

}

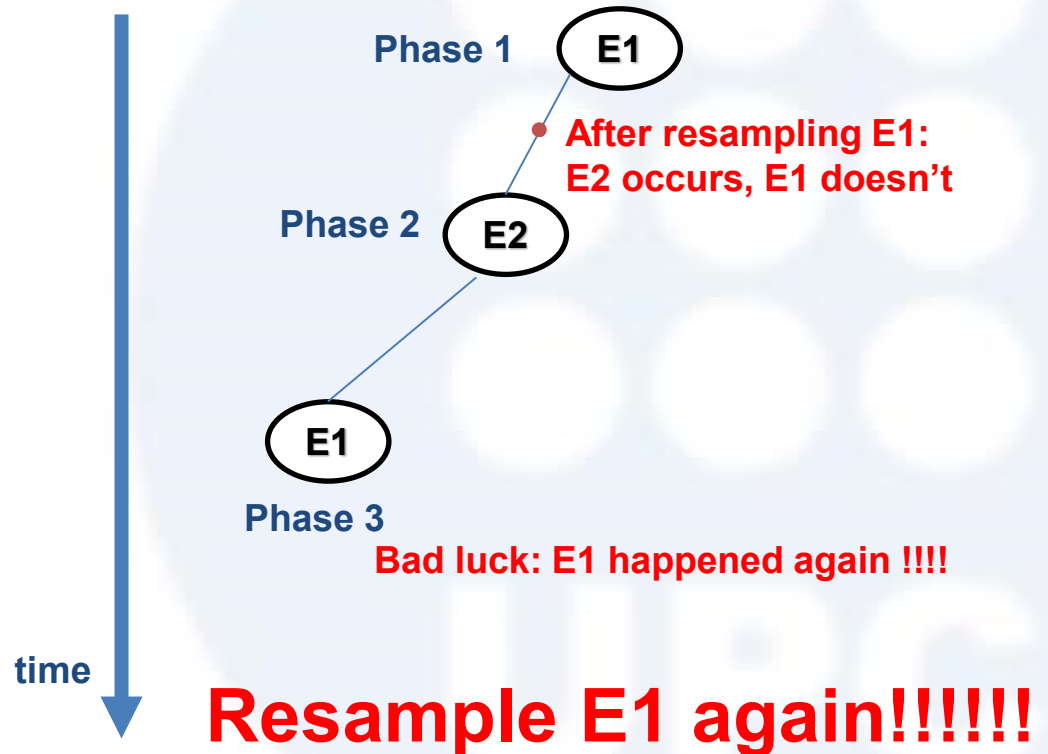
}

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:



Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

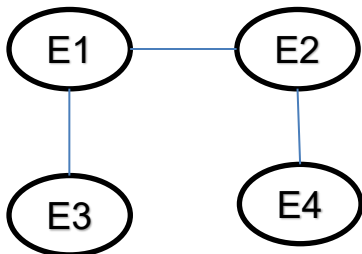
while (bad event E_k in
neighborhood) {

RESAMPLE E_k

}

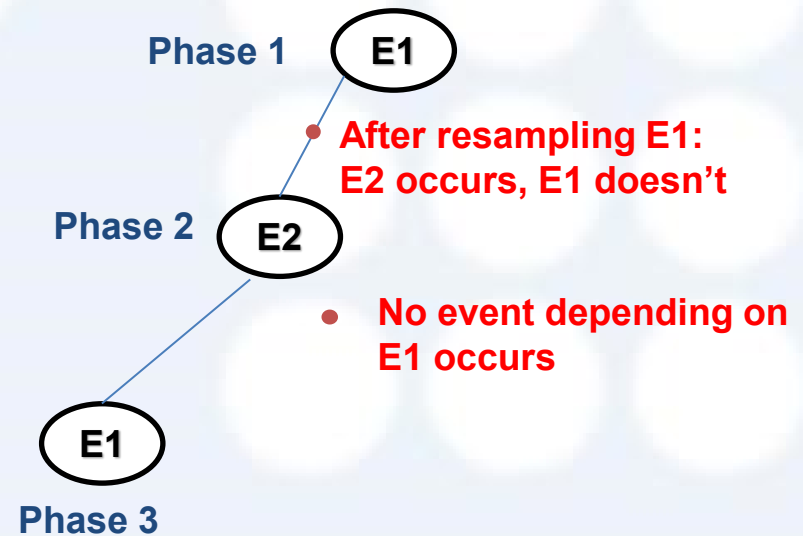
}

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:



Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

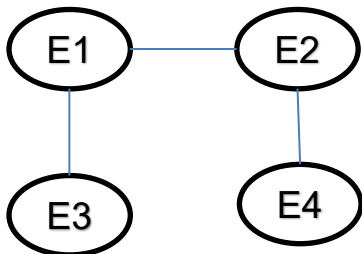
while (bad event E_k in
neighborhood) {

RESAMPLE E_k

}

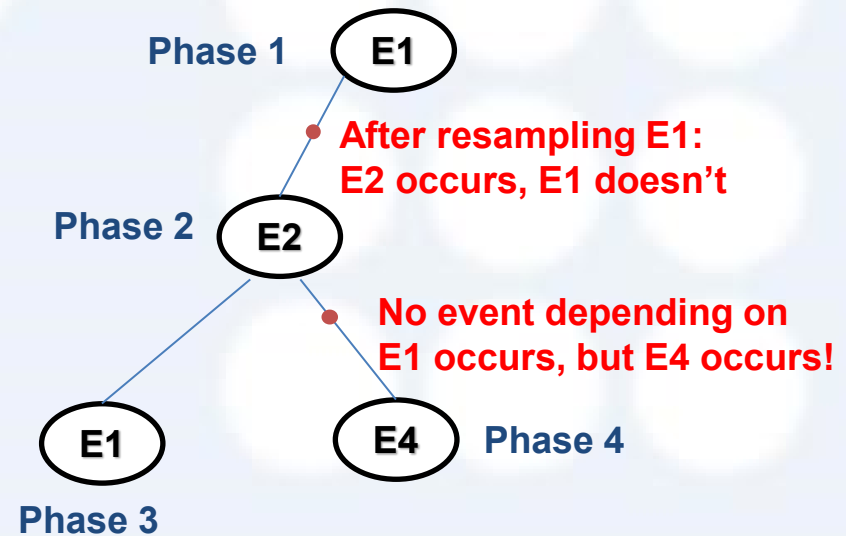
} [Redacted]

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:



Resample E4 !

Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

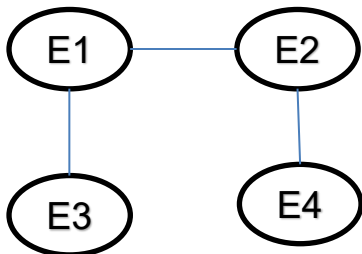
while (bad event E_k in
neighborhood) {

RESAMPLE E_k

}

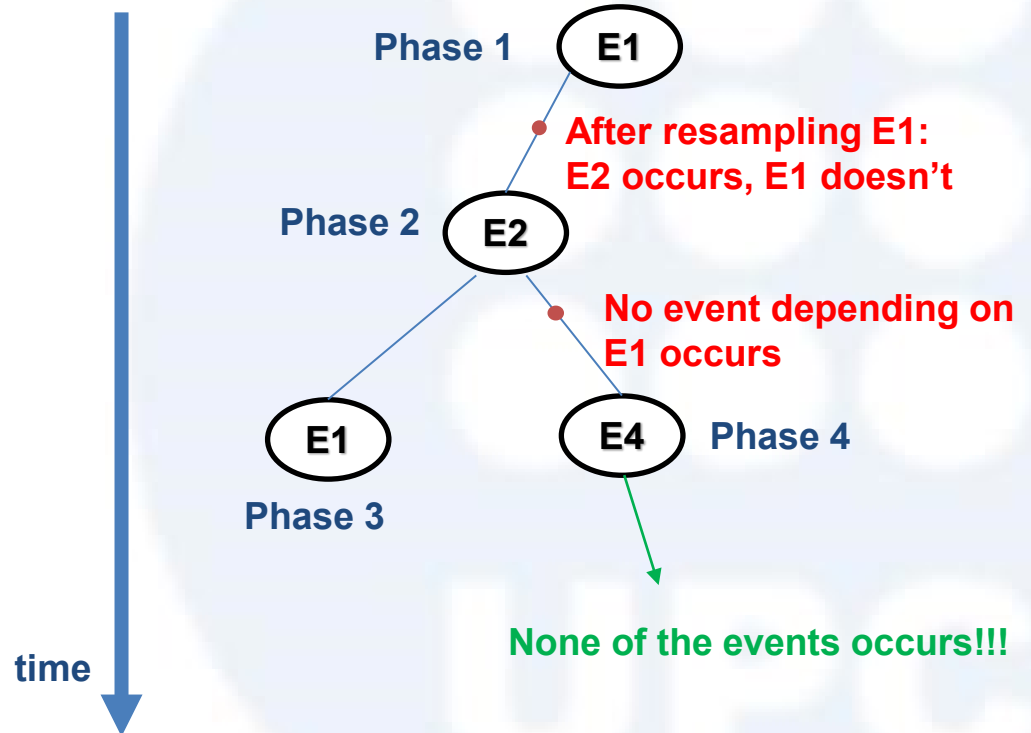
} [REDACTED]

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:



Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

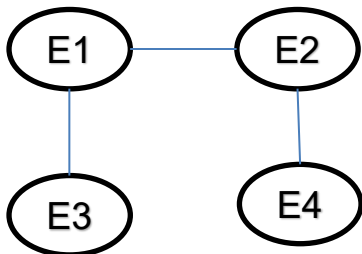
while (bad event E_k in
neighborhood {

RESAMPLE E_k

}

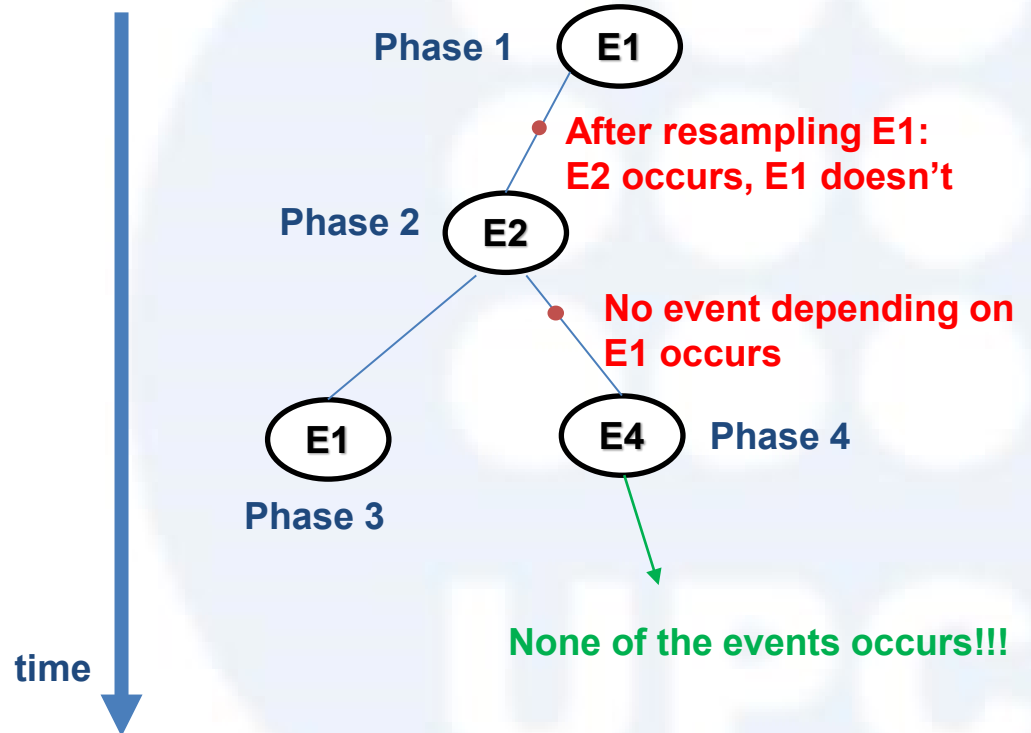
} [Redacted]

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:



Algorithmic Construction.

Algorithm:

sample X_{ij} \leftarrow current assignment

while (bad event E_j occurs
in current assignment) {

RESAMPLE E_j

resample variables in E_j

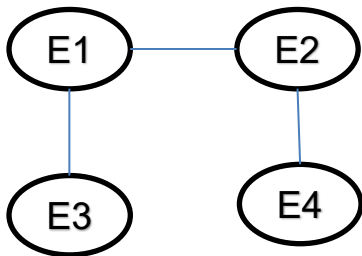
while (bad event E_k in
neighborhood) {

RESAMPLE E_k

}

}

**We need to know how the events
depend on each other**



**we want to draw a picture
of how the resamplings occur**

Example of an execution:

**The proof follows because
the number of forests
with such trees is finite**

time

Phase 3

None of the events occurs!!!

Algorithmic Construction.

Algorithm:

```
sample  $X_{ij}$  <- current assignment
while (bad event  $E_j$  occurs
      in current assignment) {
  RESAMPLE  $E_j$ 
  resample variables in  $E_j$ 
  while (bad event  $E_k$  in
        neighborhood  $E_j$ ) {
    RESAMPLE  $E_k$ 
  }
}
```

Theorem

For every **code length** > 0 ,

there is a randomized algorithm,

such that

the probability of it lasting for at least N rounds

is inverse exponential in N , and
that outputs a 2-separating code of size

size code = $\text{CONST} \cdot (8/7)^{\text{code length}/3}$

UPC

Summary

1. **Given a lower bound for separating codes (using the Lovasz Local Lemma)**
2. **The lower bound shows there exist codes of positive rate**
3. **Given algorithmic constructions (best rate known).**

Algoritmos para códigos separadores

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Algorithmic Aspects On The Construction Of Separating Codes

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1. **Error Correcting Codes. Code rate.**
2. **Separating codes.**
3. **Lovasz Local Lemma.**
4. **Existence of Separating Codes of positive rate.**
5. **Algorithmic Constructions.**
6. **Algorithmic Constructions of polynomial complexity**

5

Construction
of
polynomial complexity

Algorithm:

```
sample  $X_{ij}$  <- current assignment
while (bad event  $E_j$  occurs
      in current assignment) {
  RESAMPLE  $E_j$ 
  resample variables in  $E_j$ 
  while (bad event  $E_k$  in
        neighborhood  $E_j$ ) {
    RESAMPLE  $E_k$ 
  }
}
```

X_{11}	X_{12}	X_{13}	X_{14}	X_{15}	X_{16}	X_{17}	0	0	1	1	1	0	1
X_{21}		...					0	1	0	1	0	1	1
							0	1	1	0	1	1	0
		...					1	0	0	0	1	1	1
							0	0	1	1	1	1	0
							1	1	0	1	1	0	0
							1	1	1	0	0	0	1
		...			X_{76}	X_{77}	0	0	0	0	0	0	0

If we want a code with positive rate

go over the approximately $2^{\text{CONST} \cdot \text{code length}^{4/3}}$ events

check all the approximately $5^{\text{CONST} \cdot \text{code length}}$ events

size code = $\text{CONST} \cdot (8/7)^{\text{code length}/3}$

The number of checkings
is exponential
in the input size



Lovász local lemma

Let A_1, A_2, \dots, A_k be a sequence of events such that each event

- occurs with probability at most p
- is independent of all the other events except for at most d of them.

If $ep(d+1) \leq 1$

then there is a nonzero probability that none of the events occurs.

We want constructions of polynomial complexity in the input size (code length)

Theorem:

For every $\text{code_length} > 0$ and every $a > 0$
There exist 2-separating codes of size

Code

0	0	1	1	1	0	1
0	1	0	1	0	1	1
0	1	1	0	1	1	0
1	0	0	0	1	1	1
0	0	1	1	1	1	0
1	1	0	1	1	0	0
1	1	1	0	0	0	1
0	0	0	0	0	0	0

size code = $\text{CONST} \cdot (\text{code_length})^{a/3}$

UPC

We want constructions of polynomial complexity in the input size (code length)

Algorithm:

```

sample  $X_{ij}$  <- current assignment
while (bad event  $E_j$  occurs
      in current assignment) {
  RESAMPLE  $E_j$ 
  resample variables in  $E_j$ 
  while (bad event  $E_k$  in
        neighborhood  $E_j$ ) {
    RESAMPLE  $E_k$ 
  }
}

```

go over approximately **polynomial number of events**

check approximately **polynomial number of events**

$$\text{size code} = \text{CONST} \cdot (\text{code_length})^{a/3}$$

The number of checkings is polynomial in the input size

X_{11}	X_{12}	X_{13}	X_{14}	X_{15}	X_{16}	X_{17}	0	0	1	1	1	0	1
X_{21}		...					0	1	0	1	0	1	1
							0	1	1	0	1	1	0
		...					1	0	0	0	1	1	1
							0	0	1	1	1	1	0
							1	1	0	1	1	0	0
							1	1	1	0	0	0	1
					X_{76}	X_{77}	0	0	0	0	0	0	0

rate
tending to zero

but

With
better rate
than

Dual Hamming
code
Haddamard code
Simplex code

0	1
1	1
1	0
1	1
1	0
0	0
0	1
0	0

go over approximately polynomial number of events

check approximately polynomial number of events

$$\text{size code} = \text{CONST} \cdot (\text{code_length})^{a/3}$$

The number of checkings
is polynomial
in the input size