

THE PROBABILISTIC METHOD

WEEK 11: APPLICATIONS, RANDOMIZED ALGORITHMS



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CS49/MATH59
FALL 2015

READING QUIZ

What resource is most important to optimize in streaming algorithms?

- (A) runtime
- (B) amount of randomness used
- (C) amount of memory used
- (D) tightness of approximation factor
- (E) none of the above

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ERROR-CORRECTING CODES

[Shannon 48]

10011

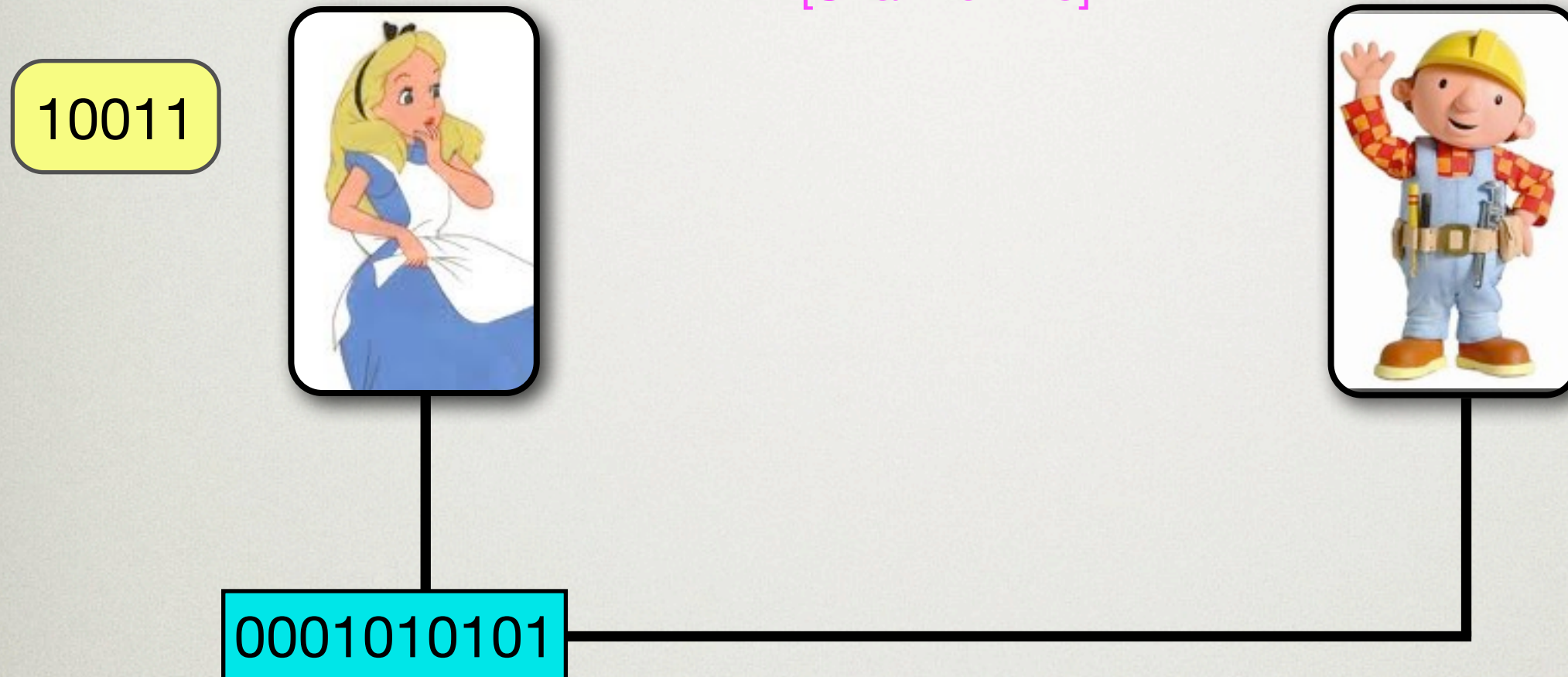


ECC: set $\mathbf{C} \subseteq \{0,1\}^n$, bijection **ENC:** $\{0,1\}^k \rightarrow \mathbf{C}$

- rate $\mathbf{R} := k/n$
- distance: $\min \mathbf{HD}(\mathbf{c}_1, \mathbf{c}_2)$

ERROR-CORRECTING CODES

[Shannon 48]

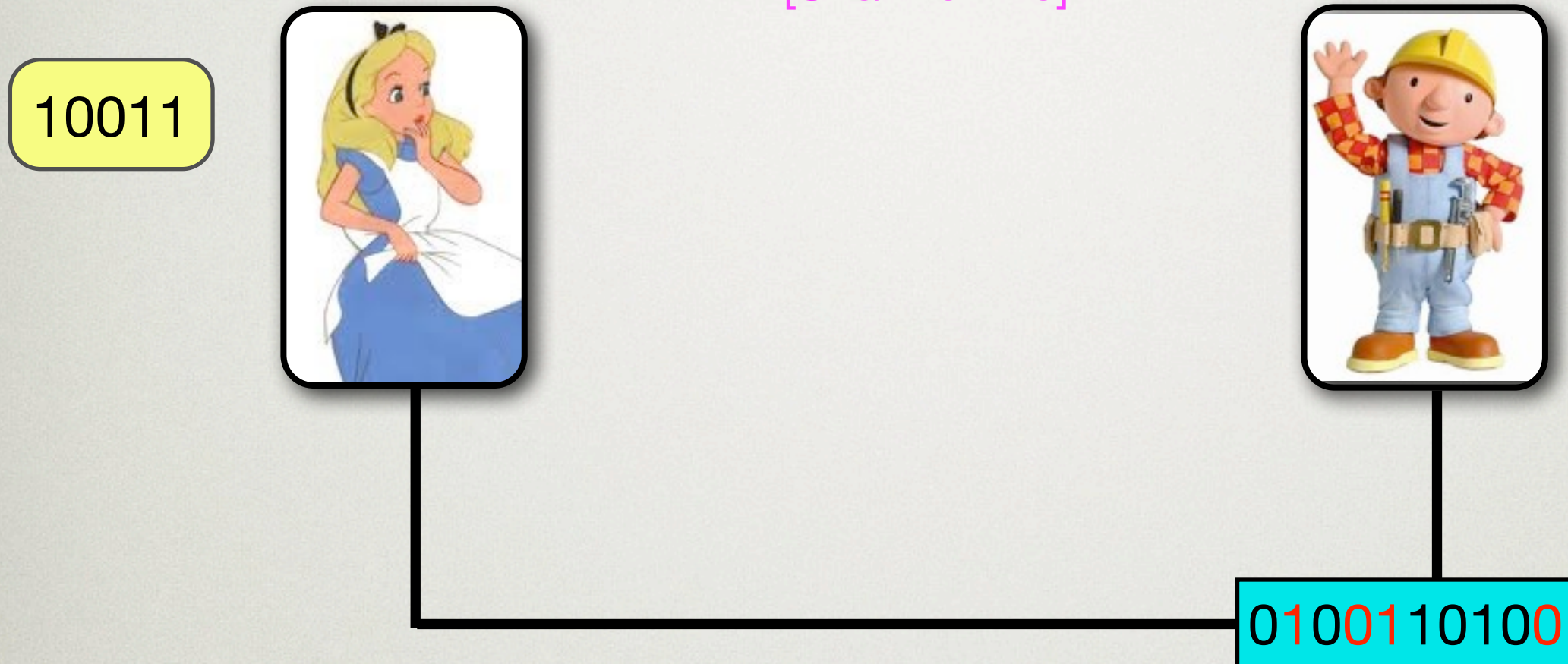


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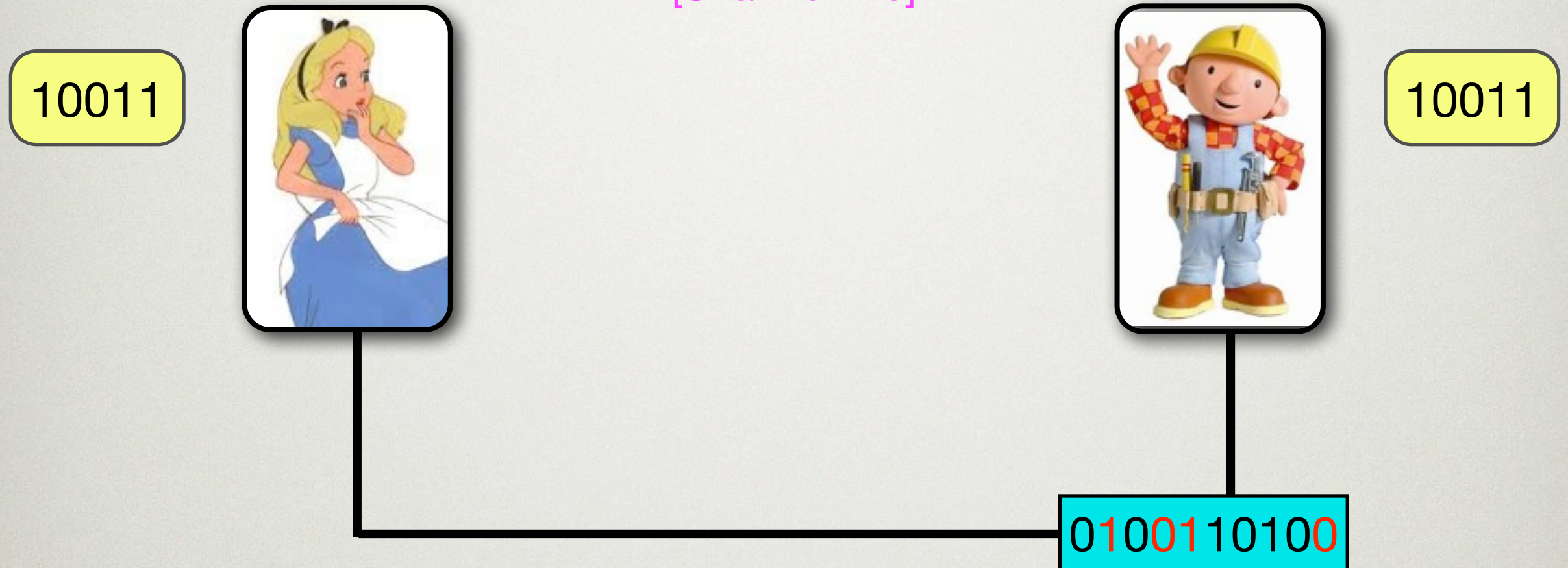


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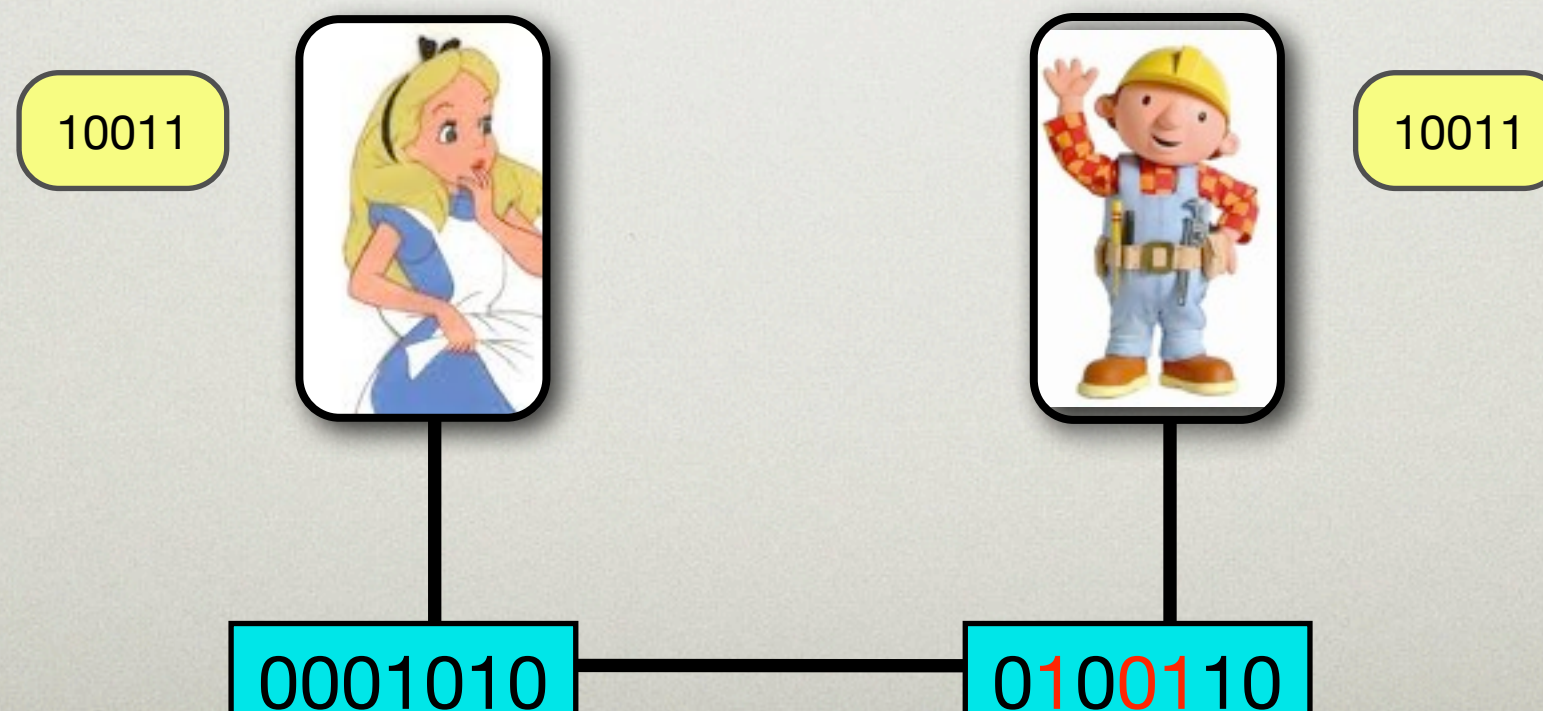


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ERRORS IN ECCs

- each bit flipped w/probability p
- p -fraction of bits flipped
 - random fraction of bits flipped
 - adversarially chosen fraction of bits flipped
- bits erased w/probability p
- bits transposed w/probability p ...



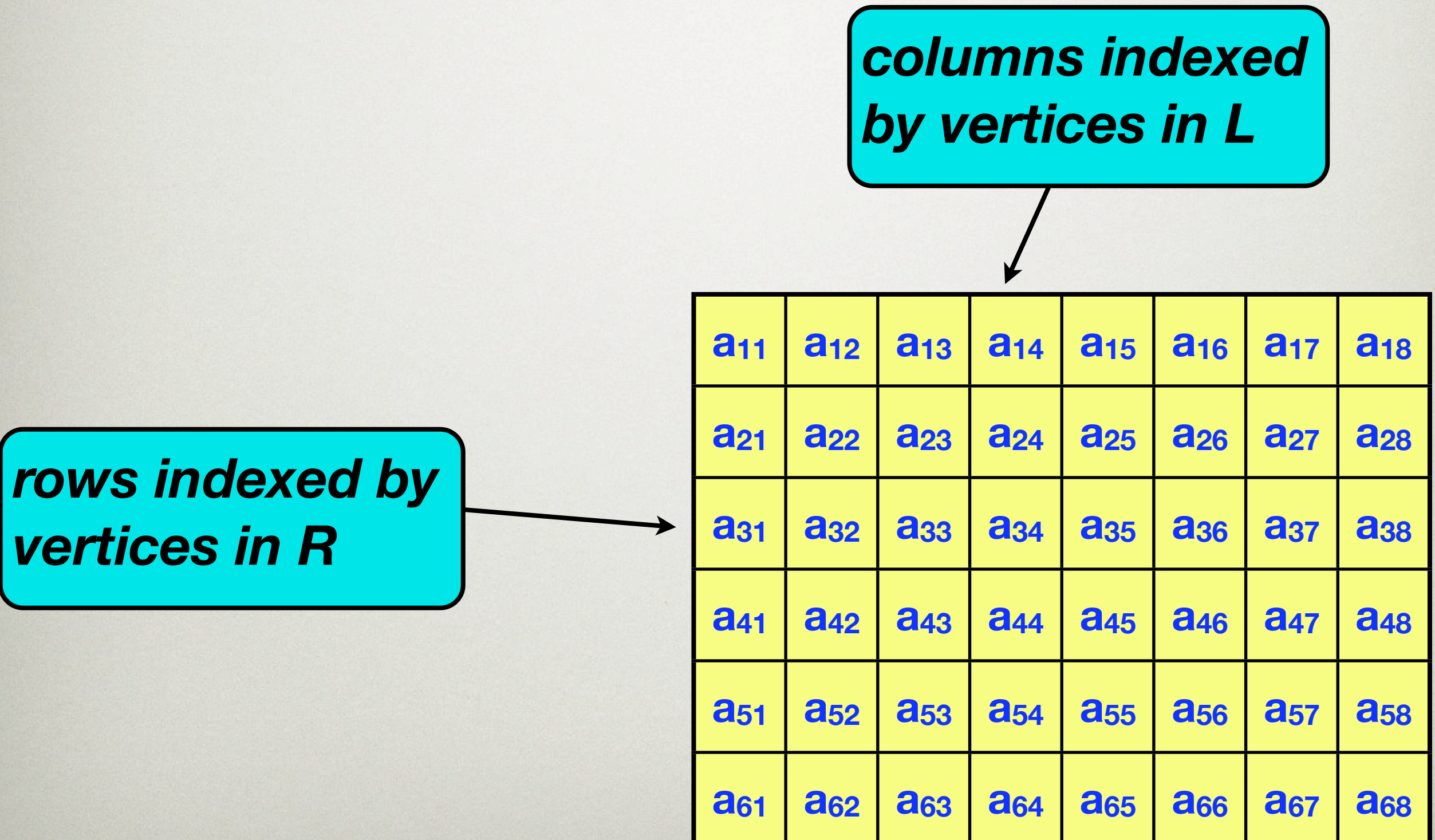
ADJACENCY MATRIX OF MAGIC GRAPHS

a_{11}	a_{12}	a_{13}	a_{14}	a_{15}	a_{16}	a_{17}	a_{18}
a_{21}	a_{22}	a_{23}	a_{24}	a_{25}	a_{26}	a_{27}	a_{28}
a_{31}	a_{32}	a_{33}	a_{34}	a_{35}	a_{36}	a_{37}	a_{38}
a_{41}	a_{42}	a_{43}	a_{44}	a_{45}	a_{46}	a_{47}	a_{48}
a_{51}	a_{52}	a_{53}	a_{54}	a_{55}	a_{56}	a_{57}	a_{58}
a_{61}	a_{62}	a_{63}	a_{64}	a_{65}	a_{66}	a_{67}	a_{68}

ADJACENCY MATRIX OF MAGIC GRAPHS

*columns indexed
by vertices in L*

*rows indexed by
vertices in R*



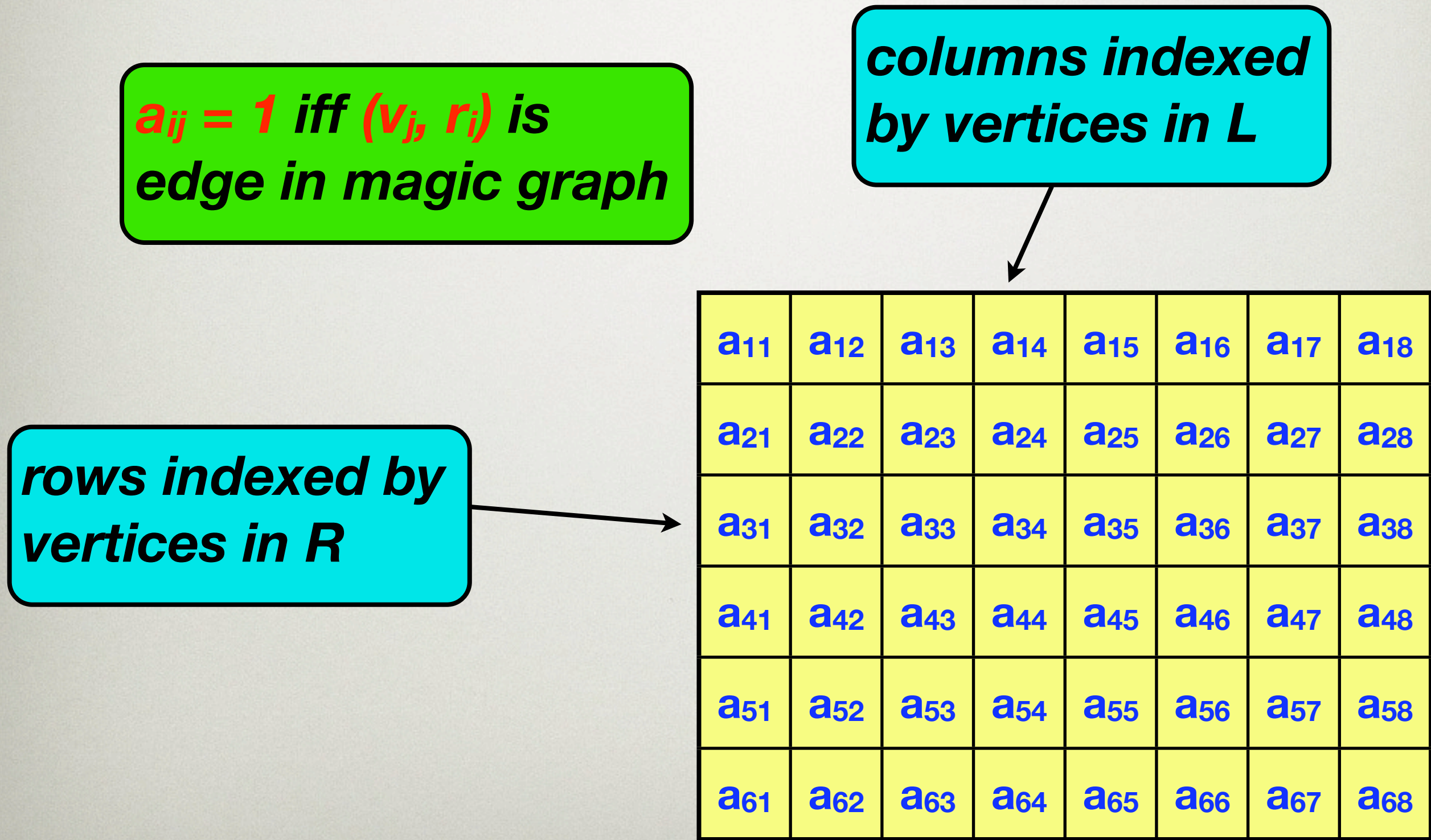
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ADJACENCY MATRIX OF MAGIC GRAPHS

**$a_{ij} = 1$ iff (v_j, r_i) is
edge in magic graph**

***columns indexed
by vertices in L***

***rows indexed by
vertices in R***



a_{11}	a_{12}	a_{13}	a_{14}	a_{15}	a_{16}	a_{17}	a_{18}
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MAGIC GRAPH

MATRIX MULTIPLICATION

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 $*$

x_1
x_2
x_3
x_4
x_5
x_6
x_7
x_8

 $=$

y_1
y_2
y_3
y_4
y_5
y_6

MAGIC GRAPH

MATRIX MULTIPLICATION

a_{11}	a_{12}	a_{13}	a_{14}	a_{15}	a_{16}	a_{17}	a_{18}
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*

=

x_1
x_2
x_3
x_4
x_5
x_6
x_7
x_8

y_1
y_2
y_3
y_4
y_5
y_6

$$y_i = \sum_k a_{ik} * x_k$$

MAGIC GRAPH

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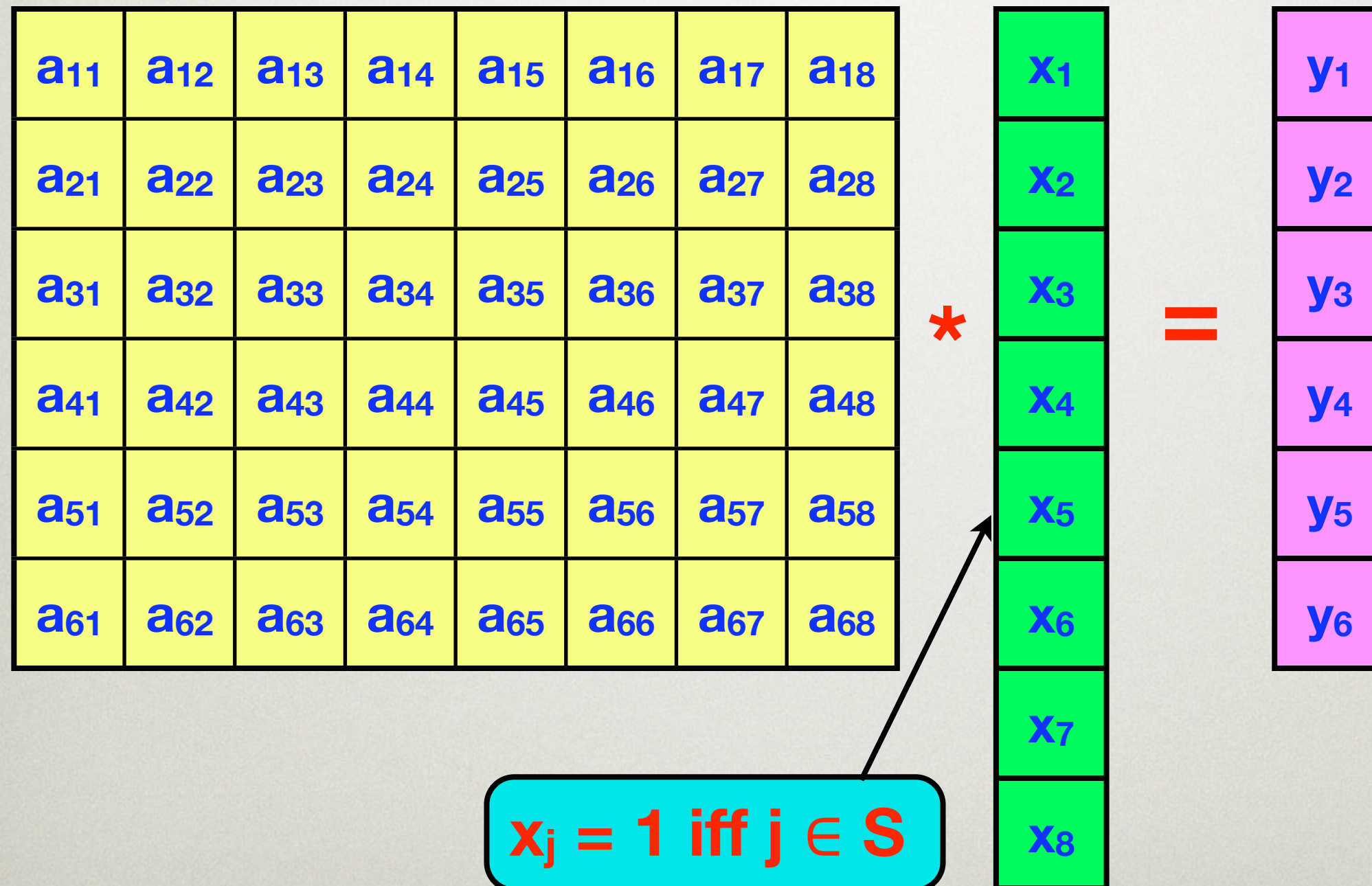
x_1
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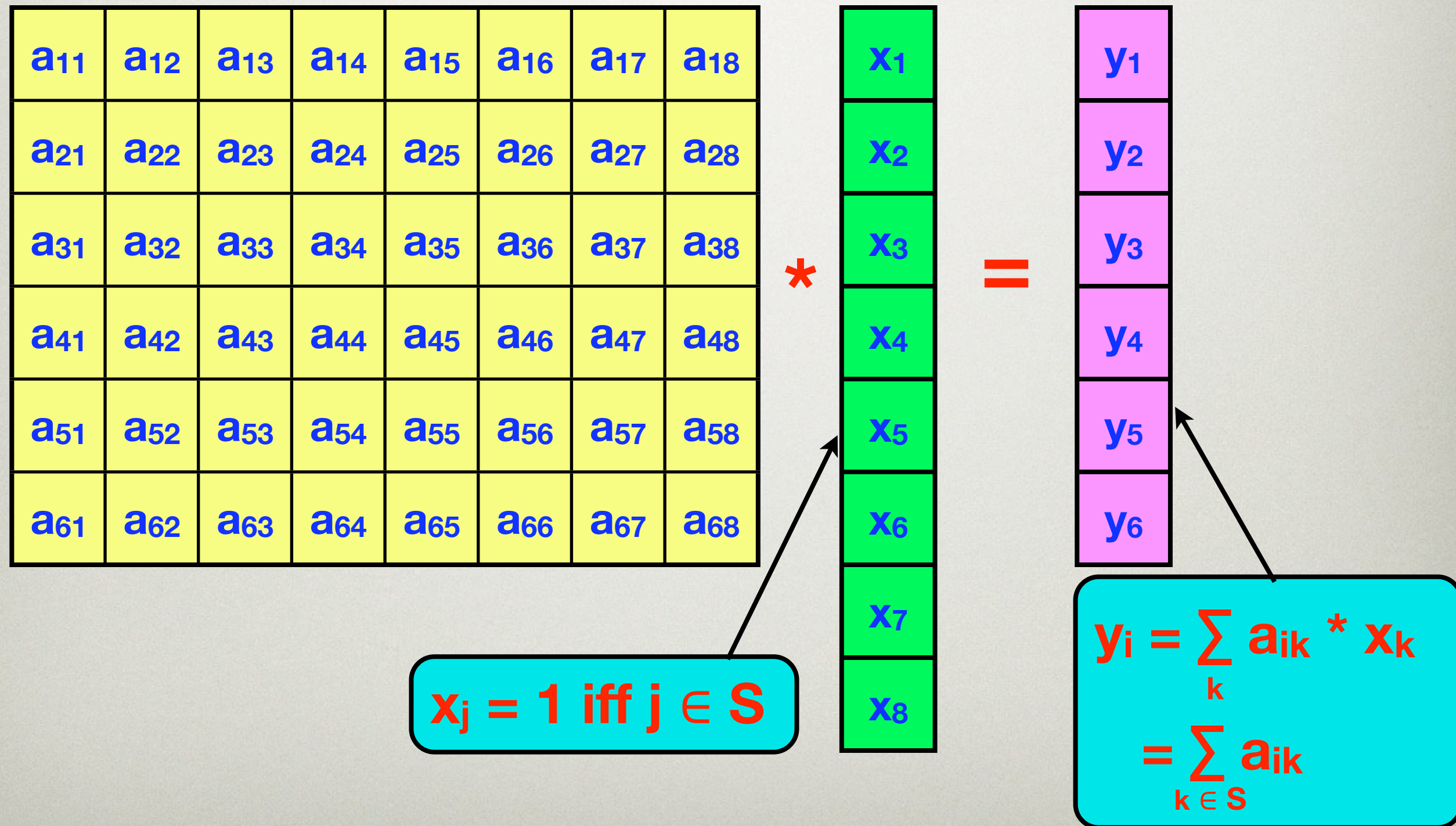
MAGIC GRAPH

MATRIX MULTIPLICATION



MAGIC GRAPH

MATRIX MULTIPLICATION



QUICKSORT

Algorithm quickSort(A, left, right):

Input: array of integers A, indices left, right

Output: nothing, but A[left...right] sorted.

```
if(right > left) {  
    p = partition(A, left, right)  
    quickSort(A, left, p-1)  
    quickSort(A, p+1, right)  
}  
Return;  
}
```


QUICKSORT

Algorithm partition(A, start, end):

Input: array of integers A, range start, end

Output: location of pivot element,
subrange A[left...right] partitioned.

```
pivot = A[end]
```

```
left=start; right=end-1;
```

```
while(right > left) {
```

```
    if(A[left]>=pivot) { left++; }
```

```
    if(A[right] < pivot) { right--; }
```

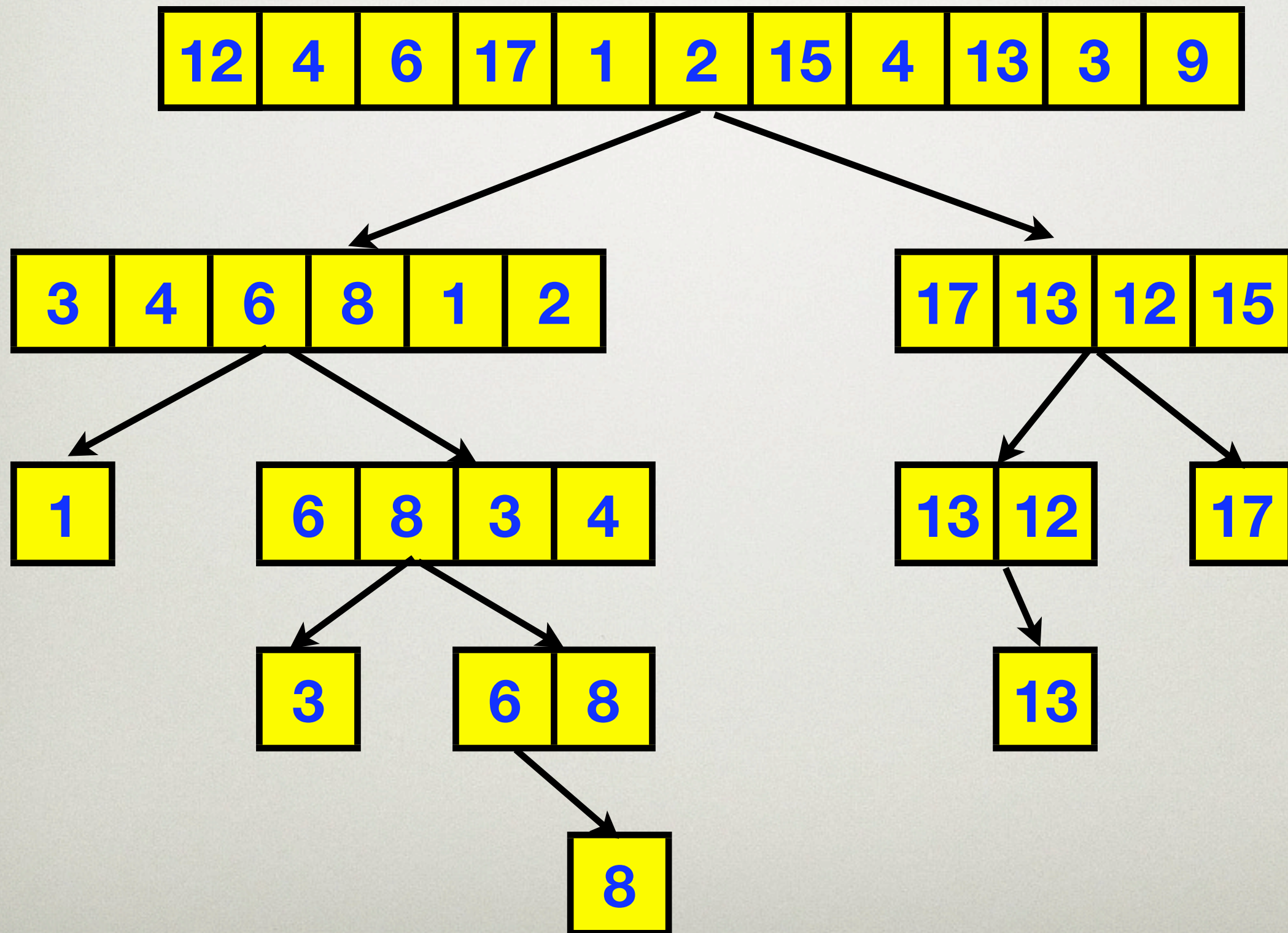
```
    swap(A,left,right)
```

```
}
```

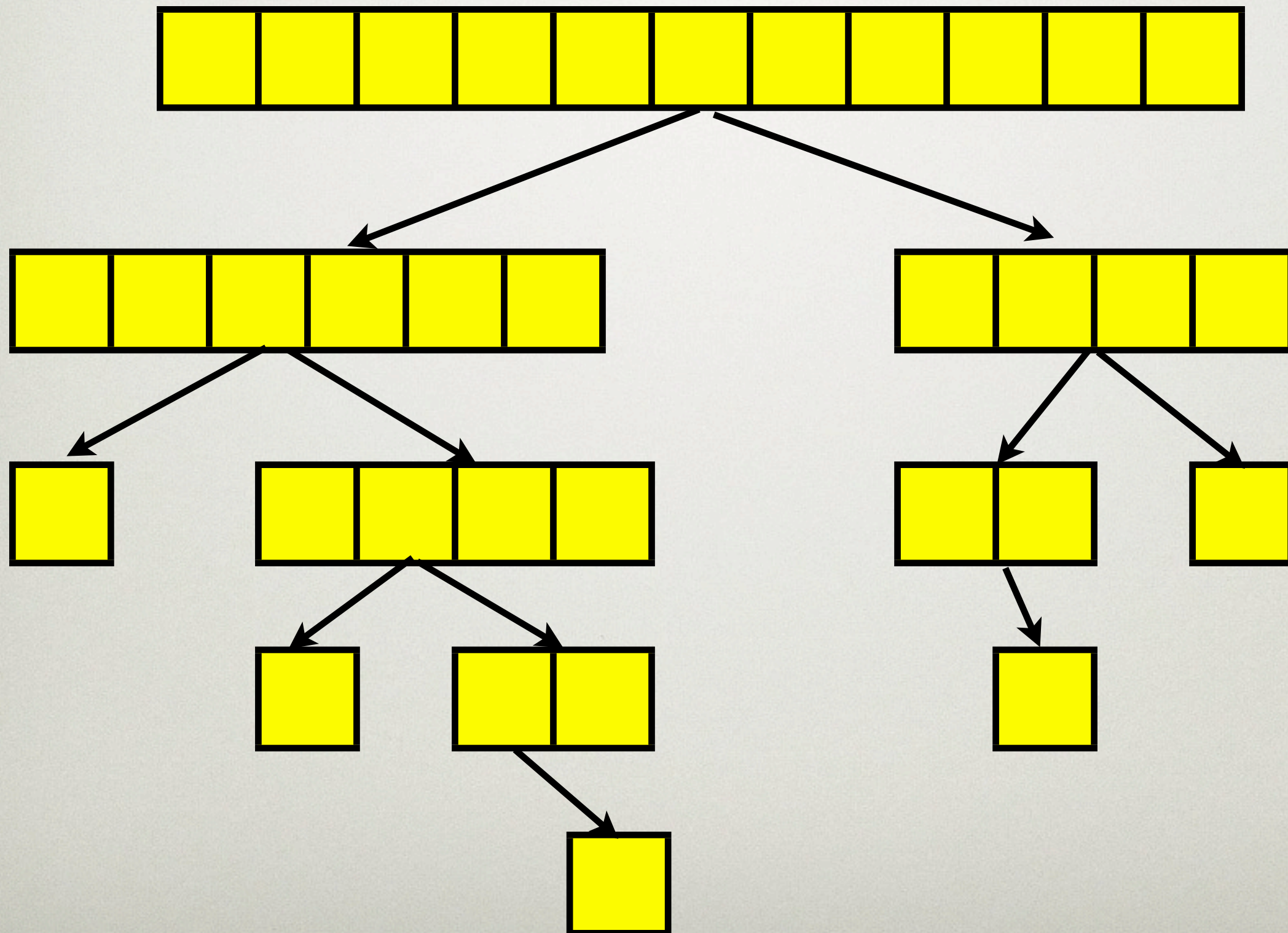
```
swap(A,left,end)
```

```
}
```


QUICKSORT



RANDOMIZED QUICKSORT



THE PROBABILISTIC METHOD



Some of us see the world in terms of expected value. We are very different from the rest of you.

www.chalkboardmanifesto.com