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# ALGORITHMS AND DATA STRUCTURES I

*Course 12*

*Backtracking*

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# Previous Course

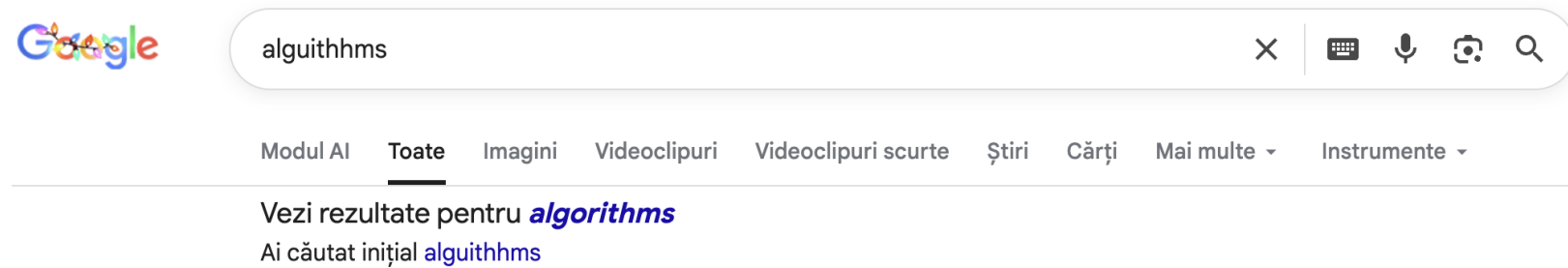
- What is dynamic programming?
- Main steps in applying dynamic programming
- Recurrence relationships: top-down vs. bottom-up development
- Applications
- Memoization technique

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# Today Course

- What is the backtracking technique ?
- Application examples:
  1. Generation of permutations
  2. The problem of placing queens on the chessboard
  3. Coloring the maps
  4. Finding routes that connect two locations
  5. The maze problem

# Motivation



How do you decide that I intended to write **algorithms** instead of **alguithhms**?

A measure of dissimilarity between words is evaluated

# What is the backtracking technique ?

- It is a **systematic search strategy** in the solution space of a problem
- It is used especially for solving problems whose requirement is to determine configurations that satisfy certain restrictions ( **constraint satisfaction problems** ).
- Most of the problems that can be solved using the backtracking technique fall under following template :  
" To find a subset  $S$  of the Cartesian product  $A_1 \times A_2 \times \dots \times A_n$  ( $A_k$  – finite sets ) having the property that each element  $(s_1, s_2, \dots, s_n)$  of  $S$  satisfies certain restrictions "
- **Example**: generating all permutations of the array  $\{1, 2, \dots, n\}$   $A_k = \{1, 2, \dots, n\}$  for each  $k=1..n$  and  $s_i \neq s_j$  for any  $i \neq j$   
(restriction : distinct components)

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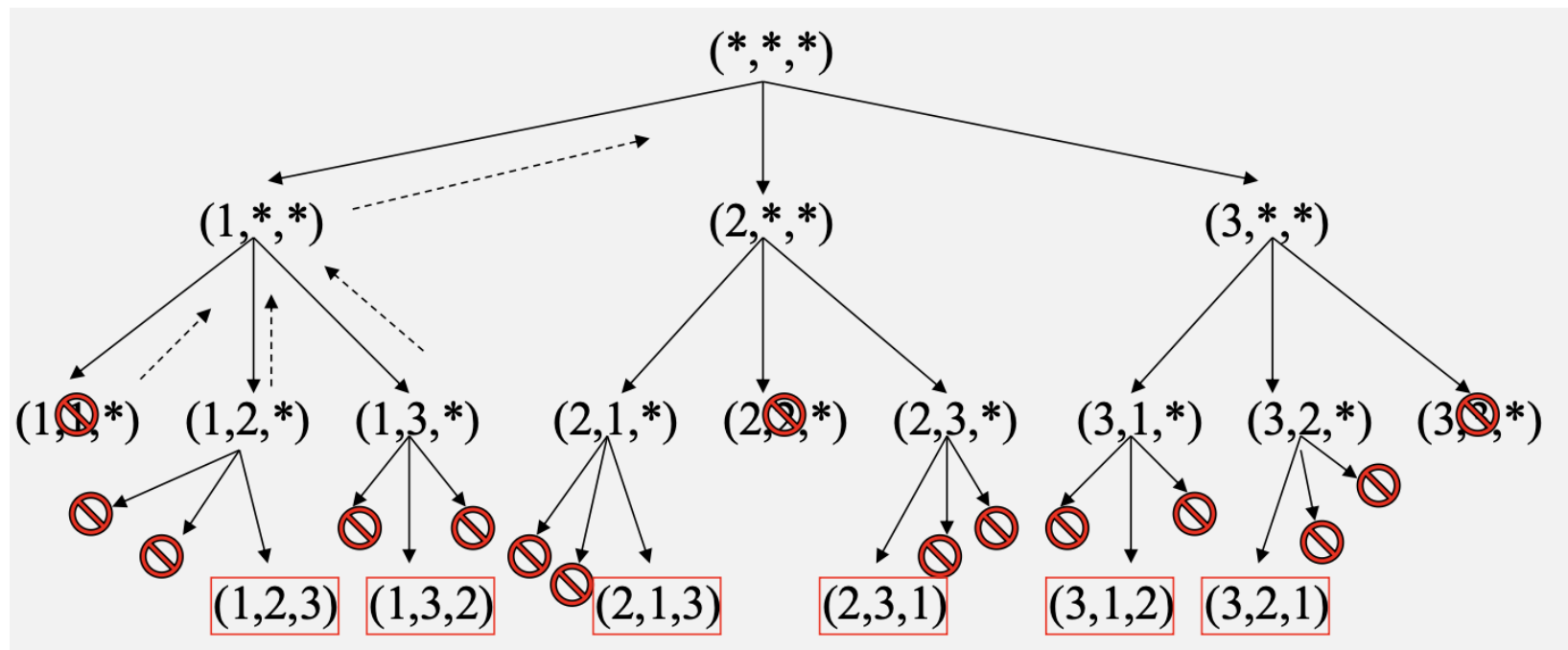
# What is the backtracking technique ?

The basic idea :

- The solutions are **built incrementally** by successively finding suitable values for the components of a **potential solution** (at each step one component is completed; a solution in which only part of the components are completed is called partial solution )
- Each **partial solution** is evaluated to determine if it is **valid** (promising). If a partial solution violates partial constraints, it is deemed invalid, and will never lead to a solution that satisfies all constraints of the problem
- If none of the values corresponding to a component leads to a valid partial solution, then it **returns** to the **previous component** and another value is tried for it .

# What is the return search technique ?

- **Example:** the traversal tree of the solution space in the case of the permutation generation problem (  $n=3$  )



- **Remark :** visiting nodes is similar to tree-depth traversal

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# General structure of the algorithm

Steps in designing the algorithm:

1. Representation of the solutions is chosen
2. The search space is identified and the sets  $A_1, \dots, A_n$  are determined, plus the order in which they are completed
3. The conditions that the partial solutions must satisfy in order to be valid are deduced, as restrictions. These conditions are called continuation conditions
4. The criterion is established on the basis of which it is decided whether a partial solution is considered a final solution

# General structure of the algorithm

Steps in designing the algorithm:

1. **Representation of the solutions** is chosen: each permutation is a vector  $s=(s_1,s_2,...s_n)$  that respects  $s_i \neq s_j$  for any  $i \neq j$
2. **The search space is identified and the sets  $A_1, ..., A_n : \{1, ..., n\}$** , Each set is iterated in the natural order of the elements (from 1 to n)
3. **Continuation conditions** : a partial solution  $(s_1,s_2,...,s_k)$  satisfy  $s_k \neq s_i$  for any  $i < k$
4. **Criterion for deciding whether a partial solution is final** :  $k=n$  (all components were set)

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# General structure of the algorithm

Notations:

- $(s_1, s_2, \dots, s_k)$  partial solution
- $k$  – index in  $s$
- $A_k = \{a^k_1, \dots, a^k_{m_k}\}$
- $m_k = \text{card}(A_k)$
- $i_k$  – index in  $A_k$

# General structure of the algorithm

The recursive variant :

- We assume that  $A_1, \dots, A_n$  and  $s$  are global variables
- Let  $k$  be the component to be completed

The algorithm is called by  $BT\_rec(1)$

$BT\_rec(k)$

IF " $(s_1, \dots, s_{k-1})$  is a final solution "

THEN " process final solution "

ELSE

FOR  $j \leftarrow 1, m_k$  DO

$s_k \leftarrow a^k_j$

IF " $(s_1, \dots, s_k)$  is valid "

THEN  $BT\_rec(k+1)$  ENDIF


ENDFOR

ENDIF

Try all possible  
values



Complete next  
component



# Application 1 : generating permutations

*Function that checks if a partial solution is valid*

```
valid(s[1..k])  
  FOR i ← 1,k-1 DO  
    IF s[k]=s[i]  
      THEN RETURN FALSE  
    ENDIF  
  ENDFOR  
  RETURN TRUE
```

*Recursive variant:*

```
perm_rec(k)  
  IF k=n+1 THEN WRITE s[1..n]  
  ELSE  
    FOR i ← 1,n DO  
      s[k] ← i  
      IF valid(s[1..k])=True  
        THEN perm_rec(k+1)  
      ENDIF  
    ENDFOR  
  ENDIF
```

# General structure of the algorithm

## The iterative variant

Looking for a value for the component  $k$  which leads to a valid partial solution

If such a value exists then it is checked if we reached a final solution

If a solution is found, then it can be processed, and the next value of the same component is computed next

If it is not a final solution, move on to the next component

If there are no more valid values involving the current component, return to the previous component

Backtracking( $A_1, A_2, \dots, A_n$ )

$k \leftarrow 1; i_k \leftarrow 0$  // traversal index  $A_k$

WHILE  $k > 0$  DO

$i_k \leftarrow i_k + 1$

$v \leftarrow \text{False}$

WHILE  $v = \text{False}$  AND  $i_k \leq m_k$  DO

$s_k \leftarrow a^k_{i_k}$

IF " $(s_1, \dots, s_k)$  is valid" THEN  $v \leftarrow \text{True}$

ELSE  $i_k \leftarrow i_k + 1$  ENDIF ENDWHILE

IF  $v = \text{True}$  THEN

IF " $(s_1, \dots, s_k)$  is a final solution "

THEN " process final solution "

ELSE  $k \leftarrow k + 1; i_k \leftarrow 0$  ENDIF

ELSE  $k \leftarrow k - 1$  ENDIF

ENDWHILE

# Application 1 : generating permutations

Backtracking( $A_1, A_2, \dots, A_n$ )

$k \leftarrow 1; i_k \leftarrow 0$  // traversal index  $A_k$

WHILE  $k > 0$  DO

$i_k \leftarrow i_k + 1$

$v \leftarrow \text{False}$

WHILE  $v = \text{False}$  AND  $i_k \leq m_k$  DO

$s_k \leftarrow a_{i_k}^k$

IF "( $s_1, \dots, s_k$ ) is valid" THEN  $v \leftarrow \text{True}$

ELSE  $i_k \leftarrow i_k + 1$  ENDIF ENDWHILE

IF  $v = \text{True}$  THEN

IF "( $s_1, \dots, s_k$ ) is a final solution "

THEN " process final solution "

ELSE  $k \leftarrow k + 1; i_k \leftarrow 0$  ENDIF

ELSE  $k \leftarrow k - 1$  ENDIF

ENDWHILE

Permutations( $n$ )

$k \leftarrow 1; s[k] \leftarrow 0$

WHILE  $k > 0$  DO

$s[k] \leftarrow s[k] + 1$

$v \leftarrow \text{False}$

WHILE  $v = \text{False}$  AND  $s[k] \leq n$  DO

IF ( $s[1..k]$ )

THEN  $v \leftarrow \text{True}$

ELSE  $s[k] \leftarrow s[k] + 1$  ENDIF ENDWHILE

IF  $v = \text{True}$  THEN

IF  $k = n$

THEN WRITE  $s[1..n]$

ELSE  $k \leftarrow k + 1; s[k] \leftarrow 0$  ENDIF

ELSE  $k \leftarrow k - 1$  ENDIF

ENDWHILE

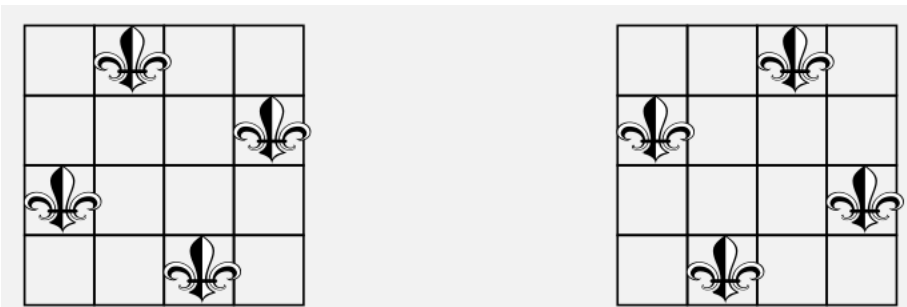
# Application 2 : N-Queens Problem

**Problem:** Determine all the possibilities of placing  $n$  queens on a chessboard of size  $n \times n$  such that they do not attack each other:

- each line contains exactly one queen
- each column contains exactly one queen
- each diagonal contains at most one queen

Remark. It is a classical problem proposed by Max Bezzel (1850) and studied by several mathematicians of the time (Gauss, Cantor)

Example: if  $n \leq 3$  has no solution ; if  $n = 4$  there are 2 solutions



As it increases  $n$ , the number of solutions increases ( for  $n = 8$  are 92 solutions )

# Application 2 : N-Queens Problem

## 1. Representation of the solution :

- let's consider that queen  $k$  is always placed on line  $k$  (the queens are identical) . Thus for each queen it is sufficient to identify the column on which it will be placed. The solution will thus be represented by a table  $(s_1, \dots, s_n)$  where  $s_k$  = index of the column on which queen  $k$  is placed

## 2. The sets $A_1, \dots, A_n : \{1, 2, \dots, n\}$ . Every set will be processed in the natural order of elements (from 1 to $n$ )

## 3. Continuation conditions : a partial solution $(s_1, s_2, \dots, s_k)$ must satisfy the problem restrictions

- no more than one queen on each line, column or diagonally

## 4. Criterion for deciding whether a partial solution is final : $k = n$ (all queens have been placed)

# Application 2 : N-Queens Problem

3. Continuation conditions : Let  $(s_1, s_2, \dots, s_k)$  be a partial solution . It is valid if :

- The queens are on different lines – the condition is implicitly satisfied due to the way of representation used (queen  $i$  is always placed on line  $i$ )
- The queens are on different columns:

$$s_i \neq s_j \text{ for any } i \neq j$$

(it is enough to verify that  $s_k \neq s_i$  for any  $1 \leq i \leq k-1$  )

- Queens are on different diagonals:

$$|i-j| \neq |s_i - s_j| \text{ for any } i \neq j$$

(it is enough to check  $|k-i| \neq |s_k - s_i|$  for any  $1 \leq i \leq k-1$  )

# Application 2 : N-Queens Problem

## Remark:

Two queens  $i$  and  $j$  are on the same diagonal if:

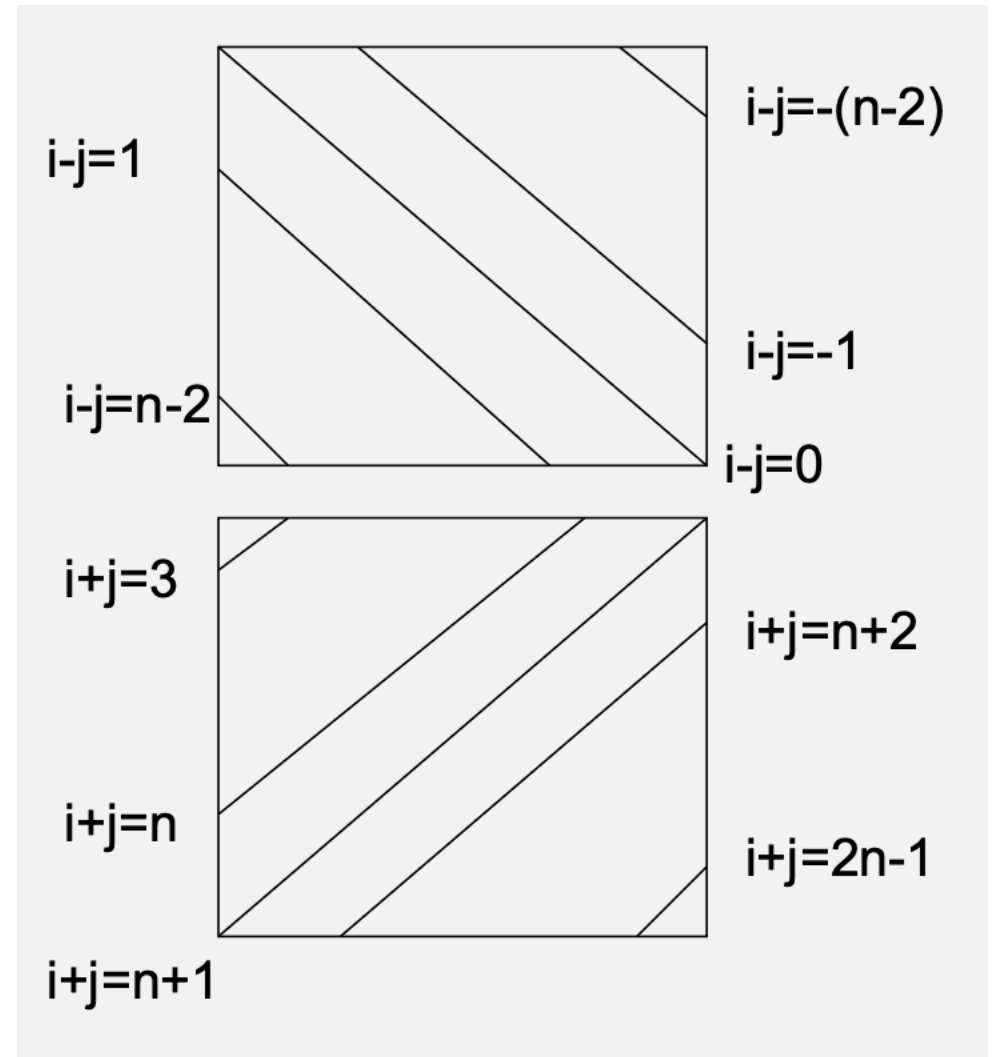
$i - s_i = j - s_j$  equivalent with  $i - j = s_i - s_j$

or

$i + s_i = j + s_j$  equivalent with  $i - j = s_j - s_i$

This means that

$$|i - j| = |s_i - s_j|$$



# Application 2 : N-Queens Problem

## Recursive algorithm

```
queen(s)
  IF k=n+1 THEN WRITE s[1..n]
  ELSE
    FOR i ← 1,n DO
      s[k] ← i
      IF Validate(s[1..k])=True
        THEN queen(k+1)
      ENDIF
    ENDFOR
  ENDIF
```

## Validation algorithm

```
Validate(s[1..k])
  FOR i ← 1,k-1 DO
    IF s[k]=s[i] OR |i-k|=|s[i]-s[k]|
      THEN RETURN False
    ENDIF
  ENDFOR
  RETURN True
```

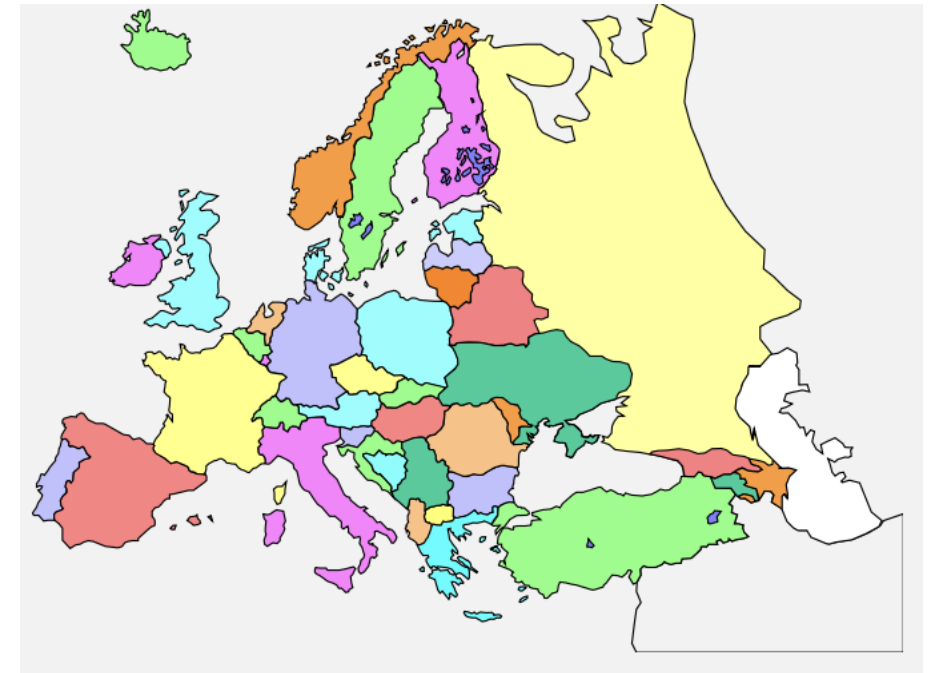
Call: Queen(1)

# Application 3 : map coloring problem

**Problem** : Consider a geographic map that contains  $n$  countries.

Given  $m$  colors ( $4 \leq m < n$ ), assign a color to each country, so that any two neighbouring countries are colored differently.

**Mathematical inspiration** : any map can be colored using no more than 4 colors (result proved in 1976 by Appel and Haken – one of the first results obtained using the computer-aided proof technique)



# Application 3 : map coloring problem

- **Problem** : Consider a geographic map that contains  $n$  countries. Given  $4 \leq m < n$  colors, assign a color to each country so that any two neighboring countries are colored differently.
- **Formalization of the problem**: Consider how the "neighborhood" relationship is specified by a matrix  $N$  having the elements :

$$N(i, j) = \begin{cases} 0 & \text{if } i \text{ and } j \text{ are not neighboring countries} \\ 1 & \text{if } i \text{ and } j \text{ are neighboring countries} \end{cases}$$

- **Goal**: Determine an array  $S = (s_1, \dots, s_n)$  with  $s_k$  in  $\{1, \dots, m\}$ , specifying the associated color for country  $k$  and such that for all pairs  $(i, j)$  with  $N(i, j) = 1$ , the elements  $s_i$  and  $s_j$  are different ( $s_i \neq s_j$ )

# Application 3 : map coloring problem

## 1. Representation of the solution

- $S=(s_1, \dots, s_n)$  where  $s_k$  is the associated color for country  $k$

## 2. The sets $A_1, \dots, A_n : \{1, 2, \dots, m\}$ .

- Every set will be processed in the natural order of the elements (indexing starts from 1 to  $m$ )

## 3. Continuation conditions: a partial solution $(s_1, s_2, \dots, s_k)$ must satisfy

- $s_i \neq s_j$  for all pairs  $(i, j)$  for which  $N(i, j)=1$ . For each  $k$ , it is enough to verify that  $s_k \neq s_j$  for all values  $j$  in  $\{1, 2, \dots, k-1\}$  satisfy  $N(i, k)=1$

## 4. Criterion to decide whether a partial solution is a final solution :

- $k = n$  (all countries have been colored)

# Application 3 : map coloring problem

## Recursive algorithm

Coloring(k)

IF  $k=n+1$  THEN WRITE  $s[1..n]$

ELSE

FOR  $i \leftarrow 1, m$  DO

$s[k] \leftarrow i$

IF  $\text{valid}(s[1..k])=\text{True}$  THEN Coloring( $k+1$ )

ENDIF

ENDFOR

ENDIF

## Validation algorithm

$\text{valid}(s[1..k])$

FOR  $i \leftarrow 1, k-1$  DO

IF  $N[i,k]=1$  AND  $s[i]=s[k]$

THEN RETURN False

ENDIF

ENDFOR

RETURN True

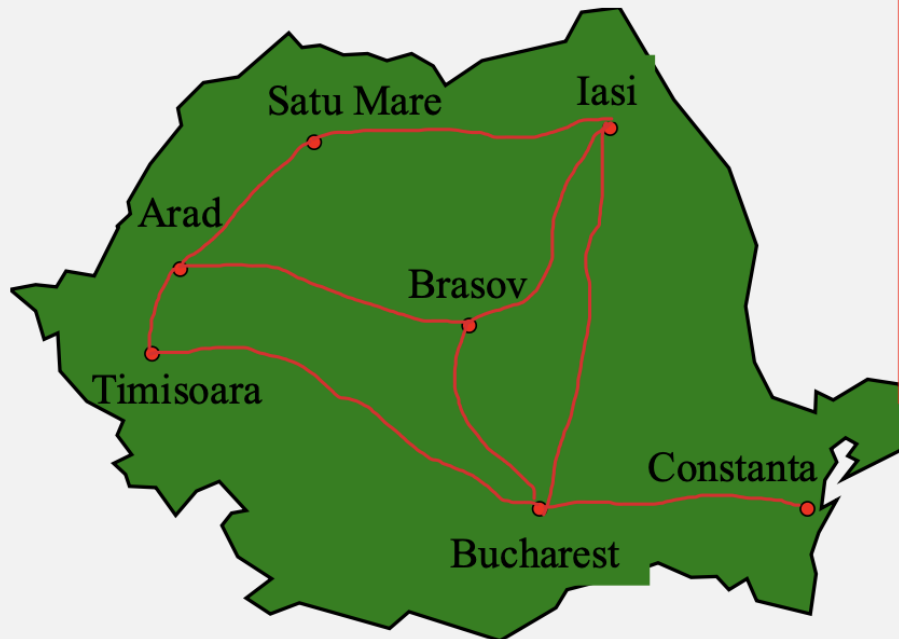
Call: Coloring(1)

# Application 4 : route finding

- Consider a set of cities and the network of roads that connect them.
- Determine all the routes that connect two given times (a route cannot pass through the same place twice).

Cities :

1. Arad
2. Braşov
3. Bucharest
4. Constanta
5. Iasi
6. Satu-Mare
7. Timisoara



Routes from Arad  
to Constanta

1->7->3->4

1->2->3->4

1->6->5->3->4

1->6->5->2->3->4

# Application 4 : route finding

**Formalization of the problem:** The road network is specified by matrix C:

$$C(i, j) = \begin{cases} 0 & \text{no direct road from city } i \text{ to city } j \\ 1 & \text{direct road from city } i \text{ to city } j \end{cases}$$

**Goal:** Find all the routes  $S=(s_1, \dots, s_m)$  - where  $s_k$  in  $\{1, \dots, n\}$  specifies the city visited at stage  $k$  - so that  $s_1$  is the source city  $s_m$  is the destination city

- $s_i \neq s_j$  for any  $i \neq j$  ( don't pass through the same city twice )
- $C(s_k, s_{k+1})=1$  ( there is a direct road between a city and the next visited city )

# Application 4 : route finding

## 1. Representation of the solution

$S=(s_1, \dots, s_m)$  with  $s_k$  representing the city visited at stage  $k$  ( $m$  = number of stages; not known from the beginning)

## 2. The sets $A_1, \dots, A_n : \{1, 2, \dots, n\}$ .

- Every set will be processed in the natural order of the elements (indexing starts from 1 to  $n$ )

## 3. Continuation conditions: a partial solution $(s_1, s_2, \dots, s_k)$ must satisfy :

- $s_k \neq s_j$  for any  $j$  in  $\{1, 2, \dots, k-1\}$  (the times are distinct)
- $C(s_{k-1}, s_k)=1$  (you can go directly from  $s_{k-1}$  to  $s_k$ )

## 4. The criterion for deciding whether a partial solution is a final solution :

- $s_k$  = the city of destination

# Application 4 : route finding

## Recursive algorithm

```
routes(k)
  IF s[k-1]="destination city" THEN
    WRITE s[1..k-1]
  ELSE
    FOR j ← 1,n DO
      s[k] ← j
      IF valid(s[1..k])=True THEN
        routes(k+1)
      ENDIF
    ENDFOR
  ENDIF
```

**Call:** ( s[1] - starting point / source city )

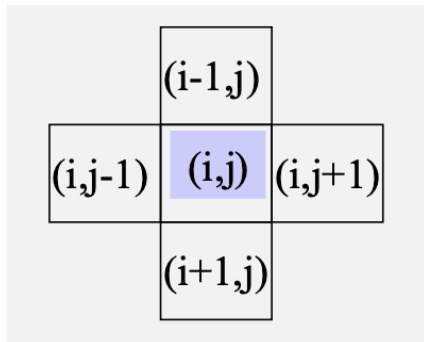
- Routes(2)

## Validation algorithm

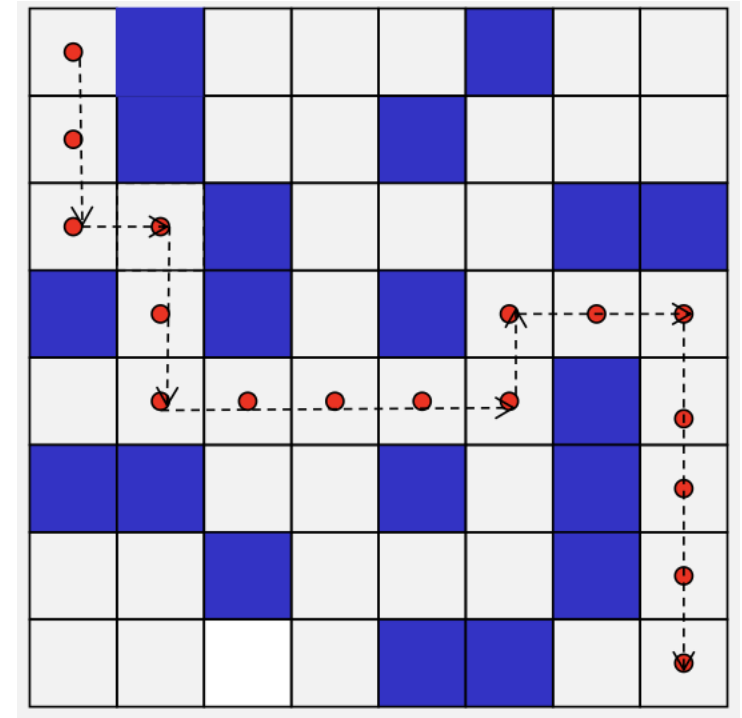
```
valid(s[1..k])
  IF C[s[k-1],s[k]]=0 THEN
    RETURN False
  ENDIF
  FOR i ← 1,k-1 DO
    IF s[i]=s[k] THEN
      RETURN False
    ENDIF
  ENDFOR
  RETURN True
```

# Application 5 : the maze problem

- **Problem.** Consider a maze defined on a  $n \times n$  grid . Find all paths starting from  $(1,1)$  and ending in  $(n,n)$
- **Remark.** Only free cells can be visited. From a cell  $(i,j)$  it is possible to move to one of the neighboring cells:



- **Remark :** cells on the border have fewer neighbours



# Application 5 : the maze problem

Formalization of the problem. The maze is stored in a  $n \times n$  matrix

$$M(i, j) = \begin{cases} 0 & \text{free cell} \\ 1 & \text{cell is visited} \end{cases}$$

Goal: Find  $S = (s_1, \dots, s_m)$  with  $s_k$  in  $\{1, \dots, n\} \times \{1, \dots, n\}$  indices corresponding to the cell visited at stage  $k$

- $s_1$  is the starting cell:  $(1, 1)$
- $s_m$  is the destination cell:  $(n, n)$
- $s_k \neq s_q$  for any  $k \neq q$  (a cell is visited at most once)
- $M(s_k) = 0$  (only free cells can be visited)
- $s_{k-1}$  and  $s_k$  are neighboring cells

# Application 5 : the maze problem

## 1. Representation of the solution

$S=(s_1, \dots, s_n)$  with  $s_k$  representing the indices of the cell visited at stage  $k$

## 2. The sets $A_1, \dots, A_n$ are subsets of the set

$\{1, 2, \dots, n\} \times \{1, 2, \dots, n\}$ . For each cell  $(i, j)$  there is a set of 4 neighbors:  $(i, j-1)$ ,  $(i, j+1)$ ,  $(i-1, j)$ ,  $(i+1, j)$

## 3. Continuation conditions: $(s_1, s_2, \dots, s_k)$ is a partial solution if:

- $s_k \neq s_q$  for any  $q$  in  $\{1, 2, \dots, k-1\}$  (never visit same cell)
- $M(s_k) = 0$  (cell is free)
- $s_{k-1}$  and  $s_k$  are neighboring cells

## 4. Condition that a partial solution $(s_1, \dots, s_k)$ is a final solution :

- $s_k = (n, n)$  (the maze destination has been reached)

# Application 5 : the maze problem

## Recursive algorithm

maze(s)

IF  $s[k-1].i = n$  and  $s[k-1].j = n$  THEN WRITE  $s[1..k]$

ELSE // all neighbors are tried

$s[k].i \leftarrow s[k-1].i - 1$ ;  $s[k].j \leftarrow s[k-1].j$

IF valid( $s[1..k]$ )=True THEN maze (k+1) ENDIF

$s[k].i \leftarrow s[k-1].i + 1$ ;  $s[k].j \leftarrow s[k-1].j$

IF valid( $s[1..k]$ )=True THEN maze (k+1) ENDIF

$s[k].i \leftarrow s[k-1].i$ ;  $s[k].j \leftarrow s[k-1].j - 1$

IF valid( $s[1..k]$ )=True THEN maze (k+1) ENDIF

$s[k].i \leftarrow s[k-1].i$ ;  $s[k].j \leftarrow s[k-1].j + 1$

IF valid( $s[1..k]$ )=True THEN maze (k+1) ENDIF

ENDIF

Remark:

$s[k]$  is a structure with two fields:

- $s[k].i$  represents the first component of the index pair
- $s[k].j$  represents the second component of the index pair

# Application 5 : the maze problem

## Validation algorithm

valid(s[1..k])

IF s[k].i < 1 OR s[k].i > n OR s[k].j < 1 OR s[k].j > n // 'cell is out of grid' check

THEN RETURN False

ENDIF

IF M[s[k].i, s[k].j] = 1 THEN RETURN False ENDIF // 'cell is not free' check

FOR q ← 1, k-1 DO // 'cell is already visited' check

IF s[k].i = s[q].i AND s[k].j = s[q].j THEN RETURN False ENDIF

ENDFOR

RETURN True

Algorithm Call:

s[1].i := 1; s[1].j := 1

maze(2)

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# Summary

- The backtracking technique is applied to constraint satisfaction problems (when it is desired to generate all configurations that satisfy certain properties).
- The systematic traversal of the solution space guarantees correctness.
- Based on exhaustive search, the complexity of the method depends on the size of the solution space (usually  $n!$ ,  $2^n$  in the case of combinatorial problems that require the construction of solutions with  $n$  components). It can be practically applied to problems where  $n$  is at most in the order of tens.
- It can also be used to solve optimization problems with constraints (for example, to find configurations that minimize a cost), in which case partial solutions are considered viable if they do not exceed the cost of the best configuration already constructed (the variant known as branch-and-bound).

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# Q&A

