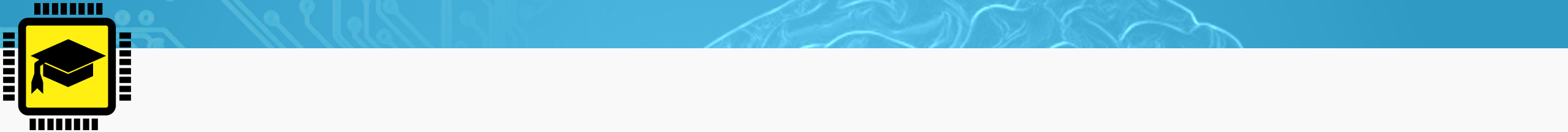


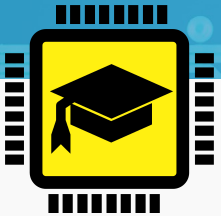


Structuri de date și algoritmi

Tehnica Dynamic Programming

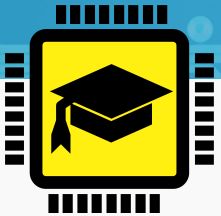
Lect. Dr. Ing. Cristian Chilipirea – cristian.chilipirea@mta.ro





Șirul Fibonacci

$$f(n) = f(n - 1) + f(n - 2)$$

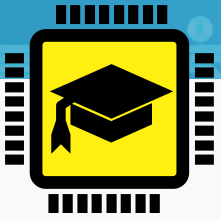


Șirul Fibonacci

$$f(n) = f(n - 1) + f(n - 2)$$

$$f(0) = 0, f(1) = 1$$

Secvența: 0 1 1 2 3 5 8 13 21 34 ...

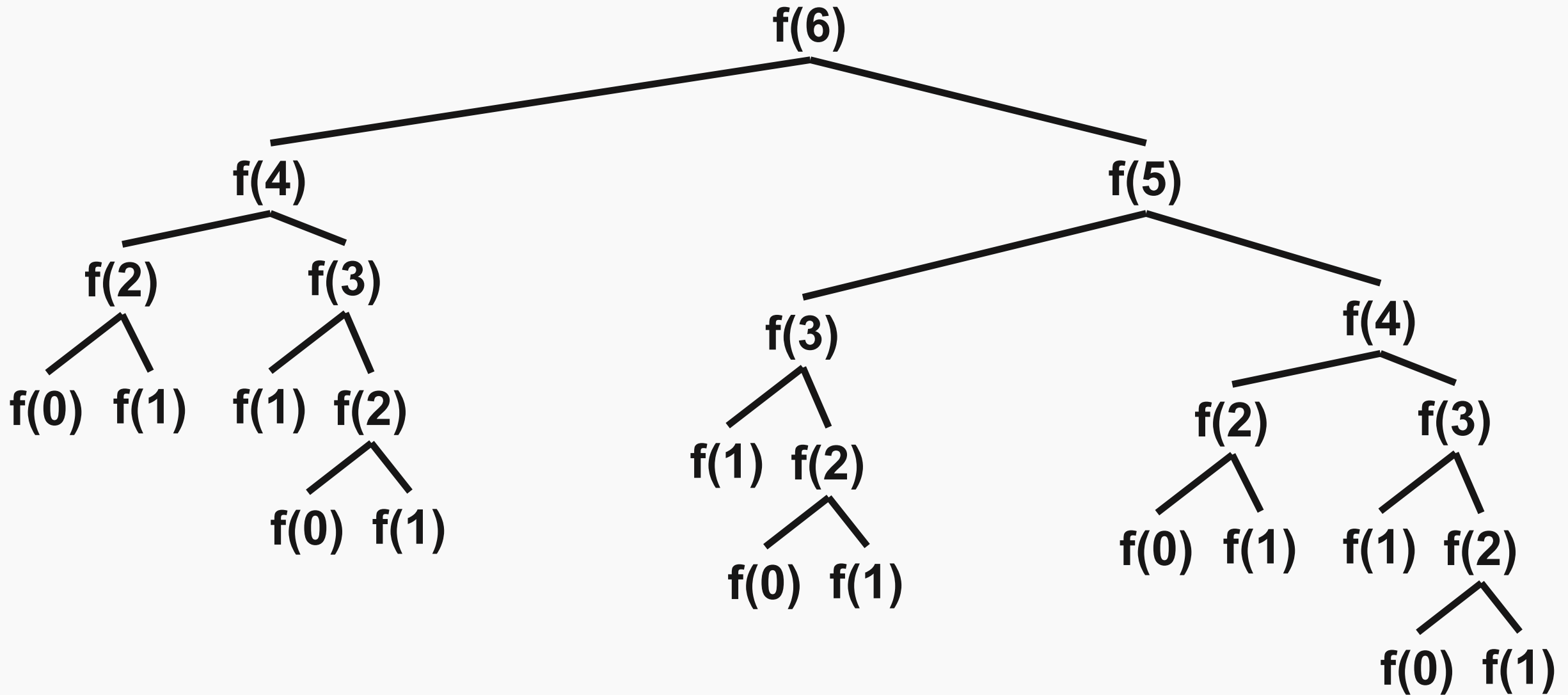


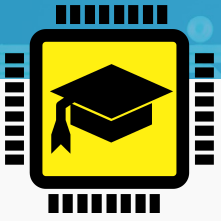
Fibonacci Recursiv (Divide et Impera)

```
int fibonacci(int n)
{
    if (n <= 1)
        return n;
    return fibonacci(n - 1) + fibonacci(n - 2);
}
```

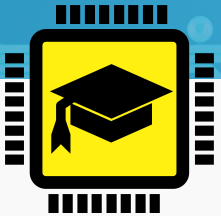


Apeluri



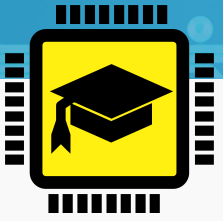


Complexitate?

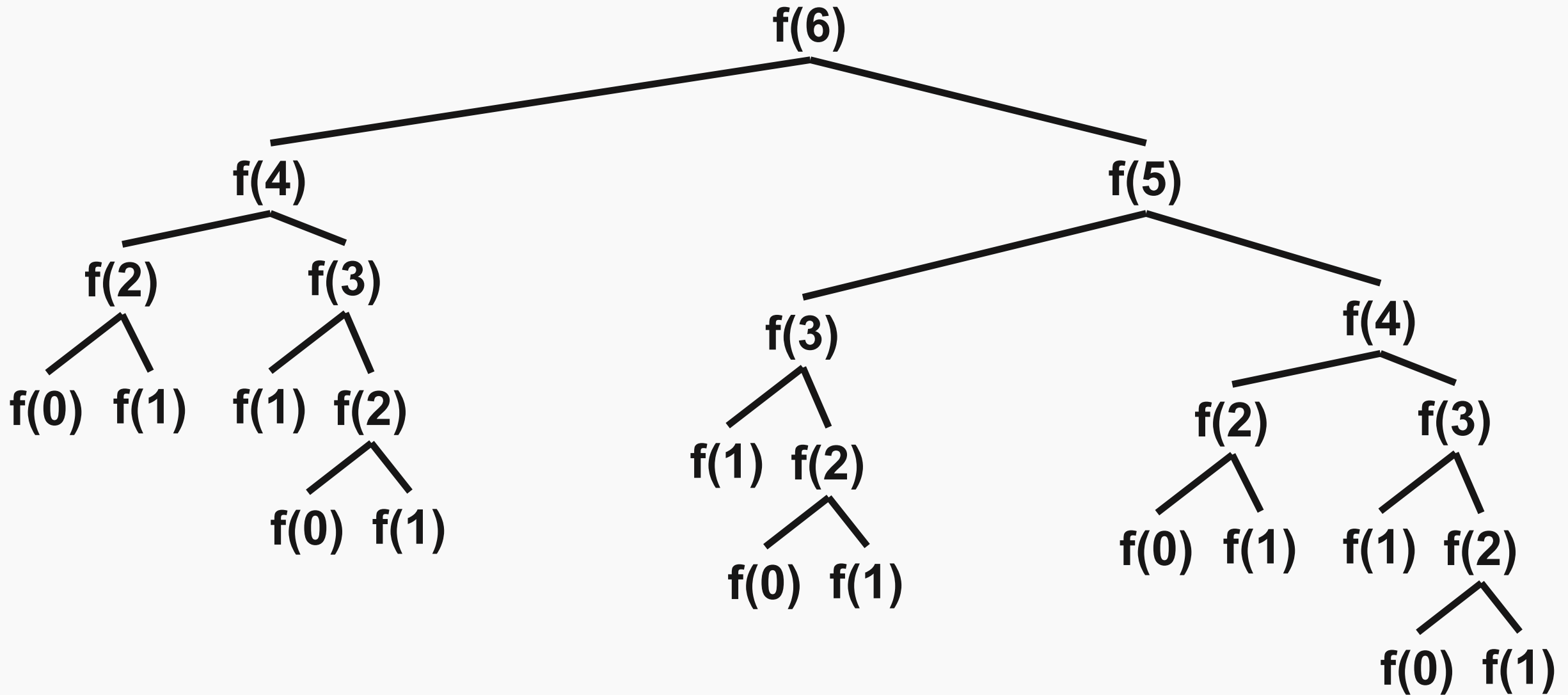


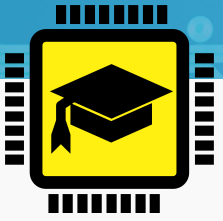
Complexitate?

$$F(n) = \frac{\varphi^n - (-\varphi)^{-n}}{\sqrt{5}}, \varphi = \frac{1 + \sqrt{5}}{2} \rightarrow \theta(\varphi^n)$$

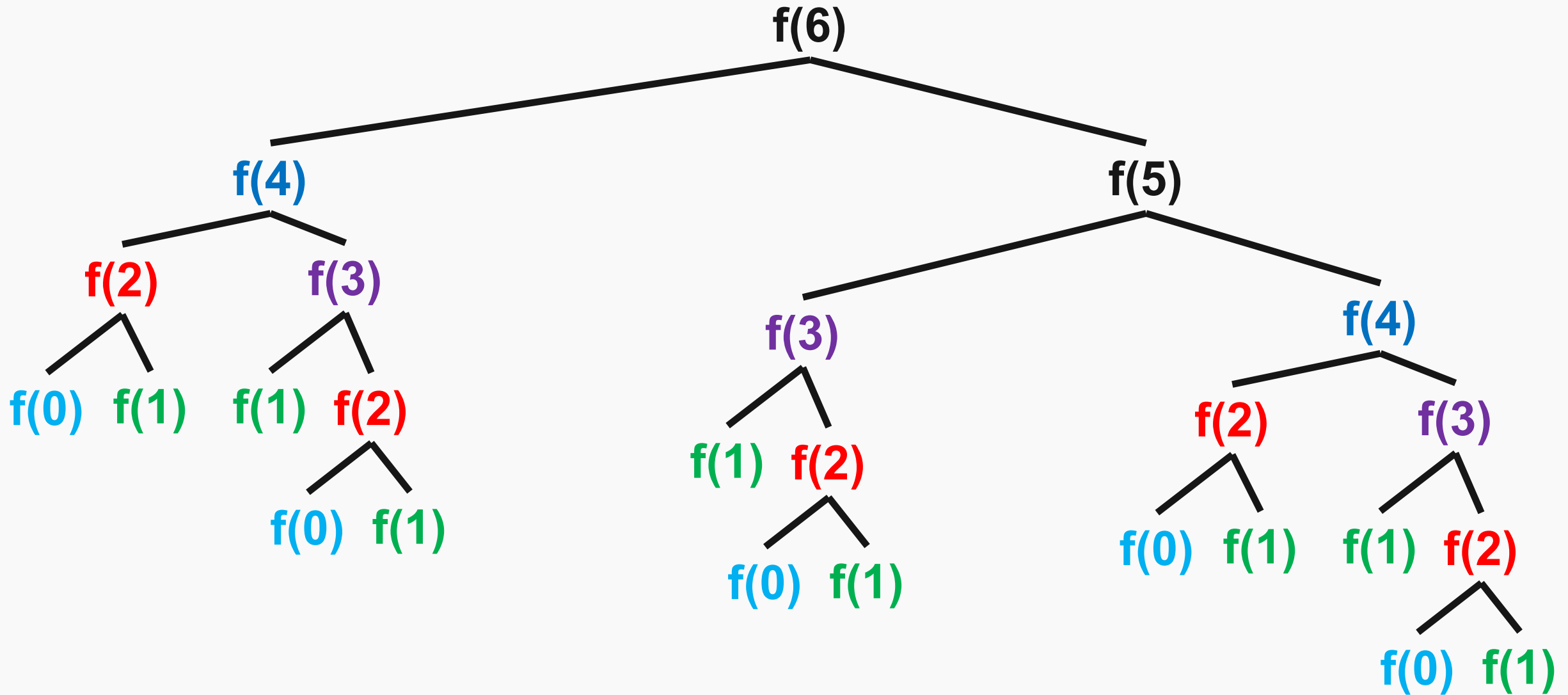


Apeluri



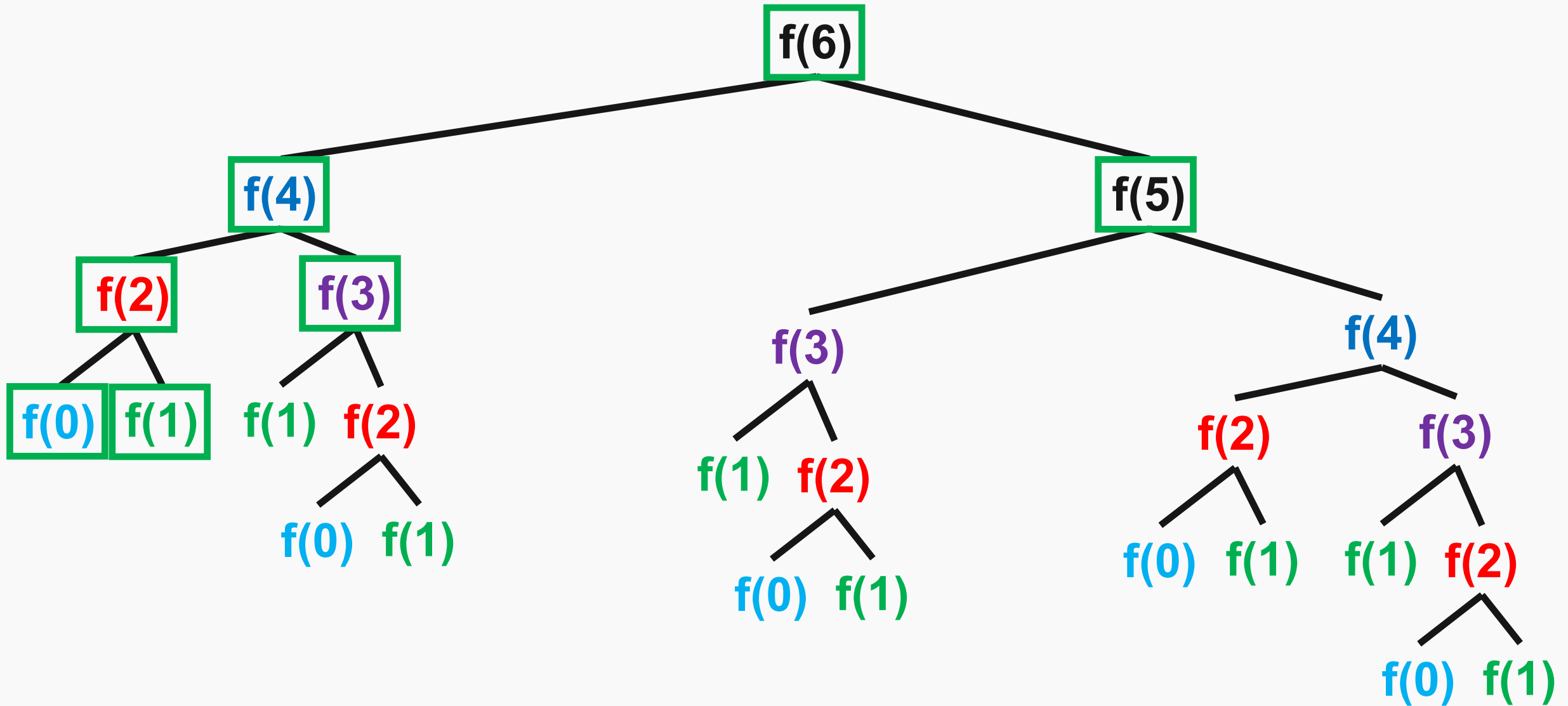


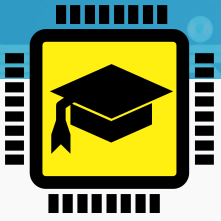
Apeluri



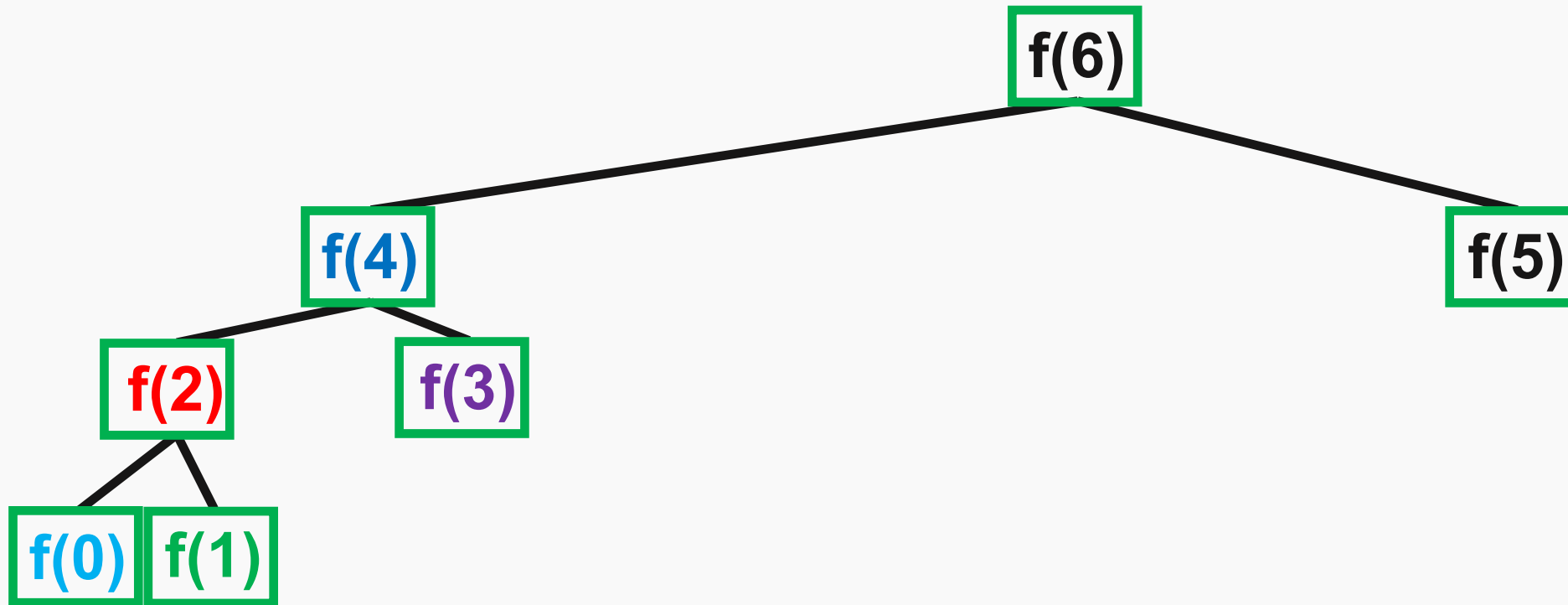


Apeluri





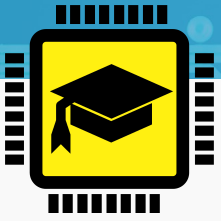
Apeluri



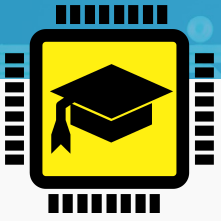


Implementare Bottom-up (Programare Dinamică)

```
int F[1000];
int fibonacci(int n)
{
    F[0] = 0;
    F[1] = 1;
    for (int i = 2; i <= n; i++)
        F[i] = F[i - 1] + F[i - 2];
    return F[n];
}
```

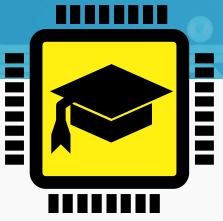


Complexitate?



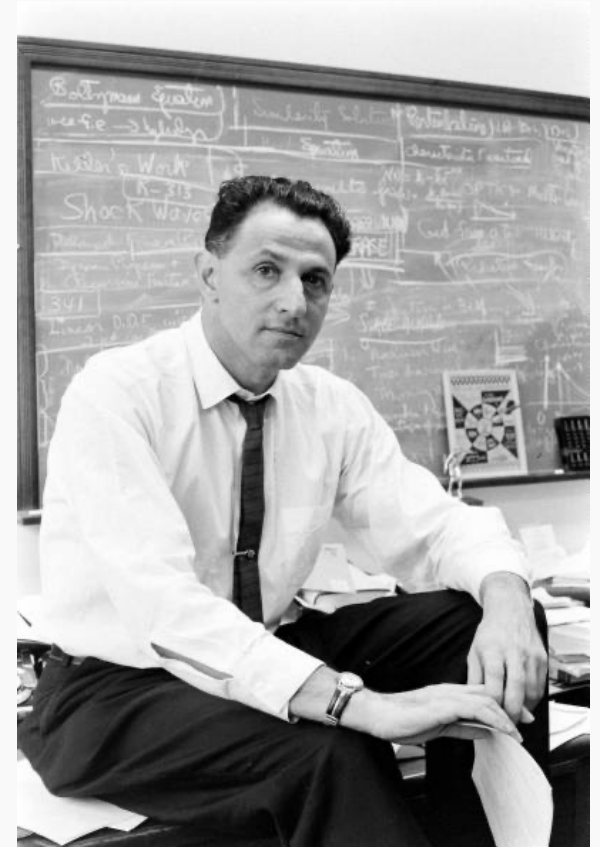
Complexitate?

$$\theta(n)$$

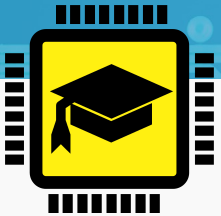


Programare dinamică

1. Identificarea subproblemelor.
2. Determinarea unei **relații de recurență** pentru descompunere.
3. Alegerea unor structuri care să rețină soluțiile subproblemelor.
4. Rezolvarea recurenței în mod bottom-up (în ordinea crescătoare a dimensiunilor subproblemelor)

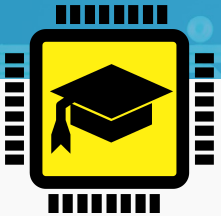


Richard Bellman



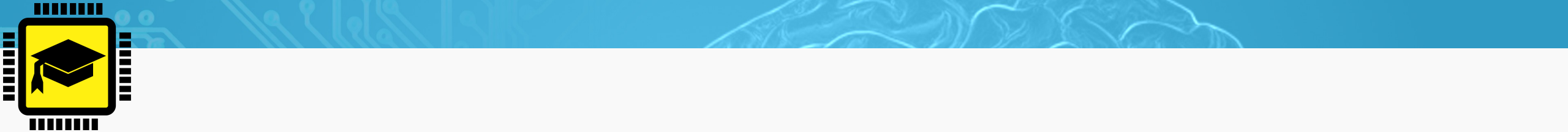
Programare dinamică

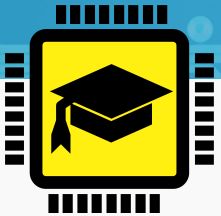
- Pentru probleme de optimizare (găsire maxim/minim)
- Probleme ce pot fi rupte în subprobleme
- Subproblemele trebuie să fie **independente**.
 - O subproblemă nu poate afecta o alta.
- Subproblemele trebuie să fie overlapping
 - Să apară aceeași subproblemă de mai multe ori.
 - Altfel putem folosi doar Divide et Impera.



Memoization

- Programarea dinamică poate funcționa și top-down, păstrând recursivitatea, dar se va adăuga un mecanism de păstrare și refolosire a soluțiilor parțiale.

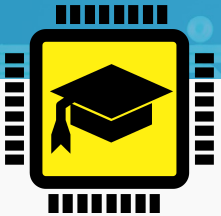




Rod cutting

- Se dă o tijă de o mărime N .
- Tija trebuie tăiată în una sau mai multe bucăți pentru a **maximiza** profitul obținut pentru bucăți.
- Bucățile au preț diferit în funcție de mărimea tijei.

| | | | | | | | | | | |
|---------|---|---|---|---|----|----|----|----|----|----|
| Lungime | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| Preț | 1 | 5 | 8 | 9 | 10 | 17 | 17 | 20 | 24 | 30 |



Rod cutting

| | | | | | | | | | | |
|---------|---|---|---|---|----|----|----|----|----|----|
| Lungime | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| Preț | 1 | 5 | 8 | 9 | 10 | 17 | 17 | 20 | 24 | 30 |

9



1

8



5

5



8

1



1

1

5



1

5

1



5

1

1



1

1

1

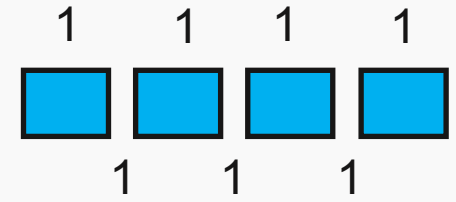
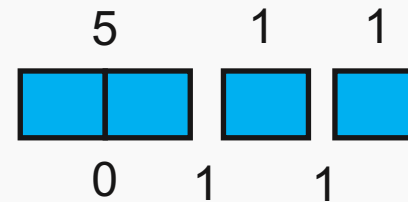
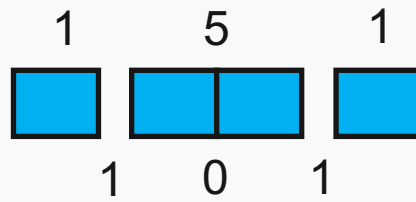
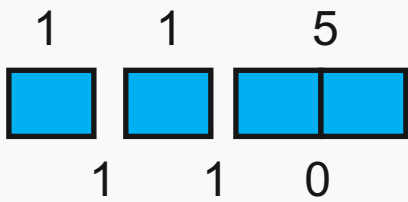
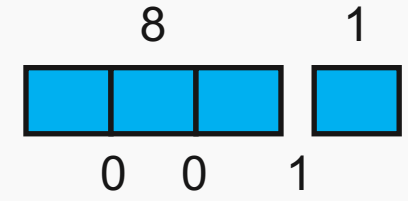
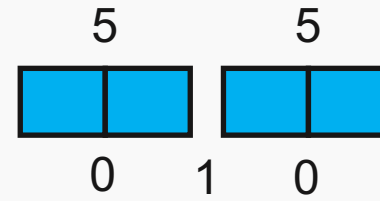
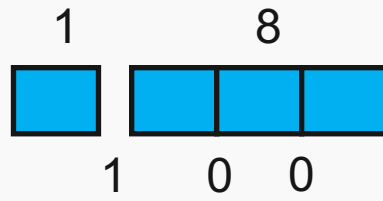
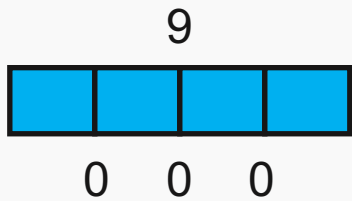
1

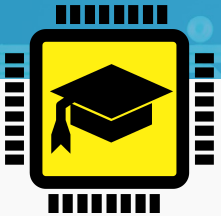




Rod cutting

| | | | | | | | | | | |
|---------|---|---|---|---|----|----|----|----|----|----|
| Lungime | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| Preț | 1 | 5 | 8 | 9 | 10 | 17 | 17 | 20 | 24 | 30 |

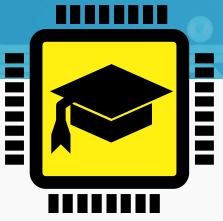




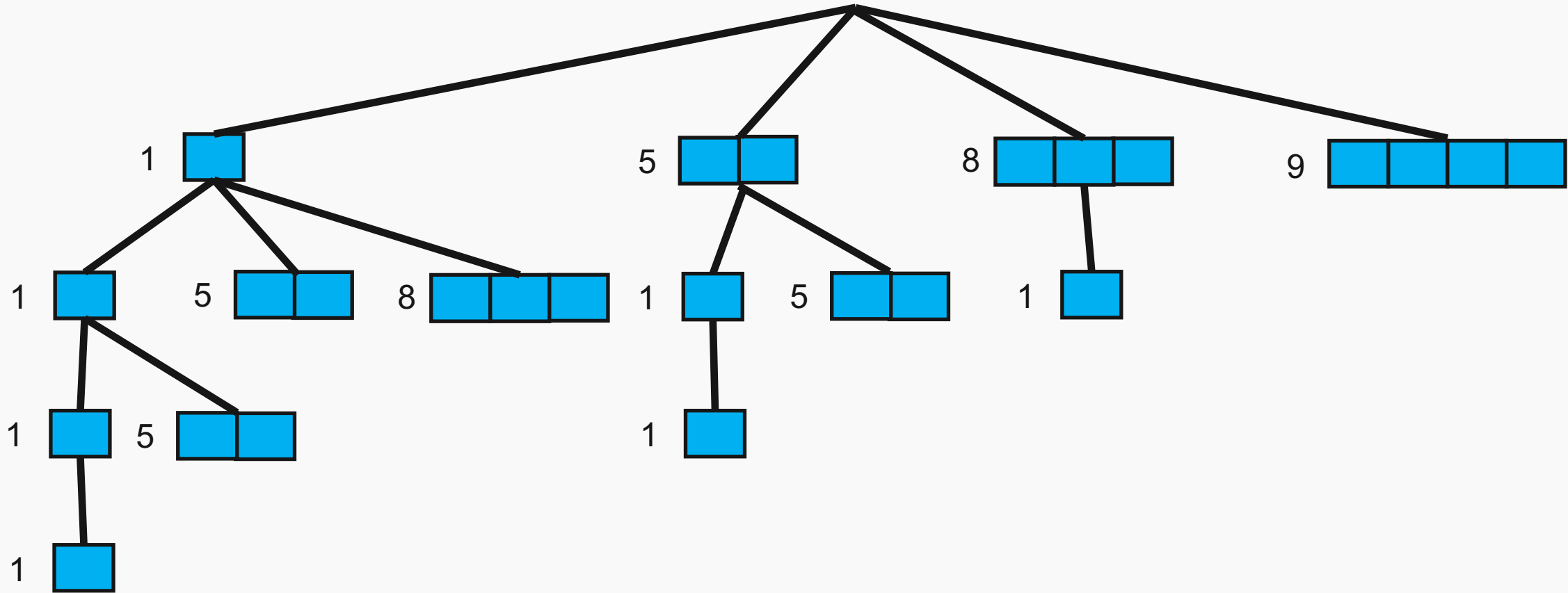
Implementare recursivă - Rod cutting

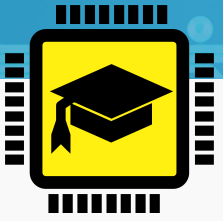
```
int p[11] = {0, 1, 5, 8, 9, 10, 17, 17, 20, 24, 30};
```

```
int cutrod(int n)
{
    if (n == 0)
        return 0;
    int q = -1;
    for (int i = 1; i <= n; i++)
        q = fmax(q, p[i] + cutrod(n - i));
    return q;
}
```



Rod cutting

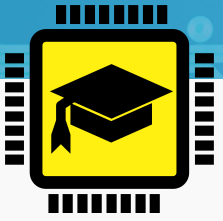




Implementare Rod cutting – programare dinamică

```
int p[11] = {0, 1, 5, 8, 9, 10, 17, 17, 20, 24, 30};
int r[11] = {-1, -1, -1, -1, -1, -1, -1, -1, -1, -1, -1};

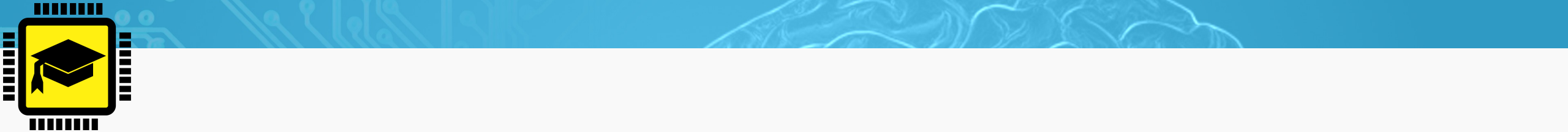
int memoizedcutrod(int n)
{
    if (r[n] >= 0)
        return r[n];
    int q;
    if (n == 0)
        q = 0;
    else {
        q = -1;
        for (int i = 1; i <= n; i++)
            q = fmax(q, p[i] + memoizedcutrod(n - i));
    }
    r[n] = q;
    return q;
}
```

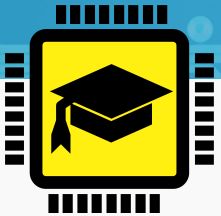


Implementare Rod cutting – programare dinamică

```
int p[11] = {0, 1, 5, 8, 9, 10, 17, 17, 20, 24, 30};
```

```
int dpcutrod(int n)
{
    int r[11];
    r[0] = 0;
    for (int j = 1; j <= n; j++) {
        int q = -1;
        for (int i = 1; i <= j; i++)
            q = fmax(q, p[i] + r[j - i]);
        r[j] = q;
    }
    return r[n];
}
```





Largest Common Subsequence

O secvență dintr-un șir de caractere : o mulțime de caractere (nu neapărat consecutive) aflate în ordine (de la stânga la dreapta) în șirul de caractere dat.

s p r i n g t i m e
p i o n e e r

h o r s e b a c k
s n o w f l a k e

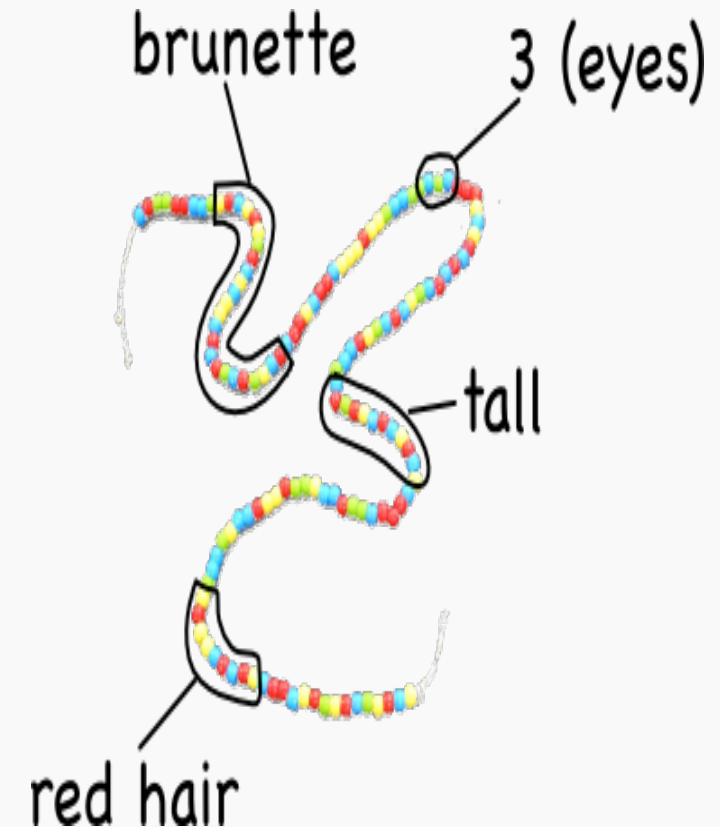
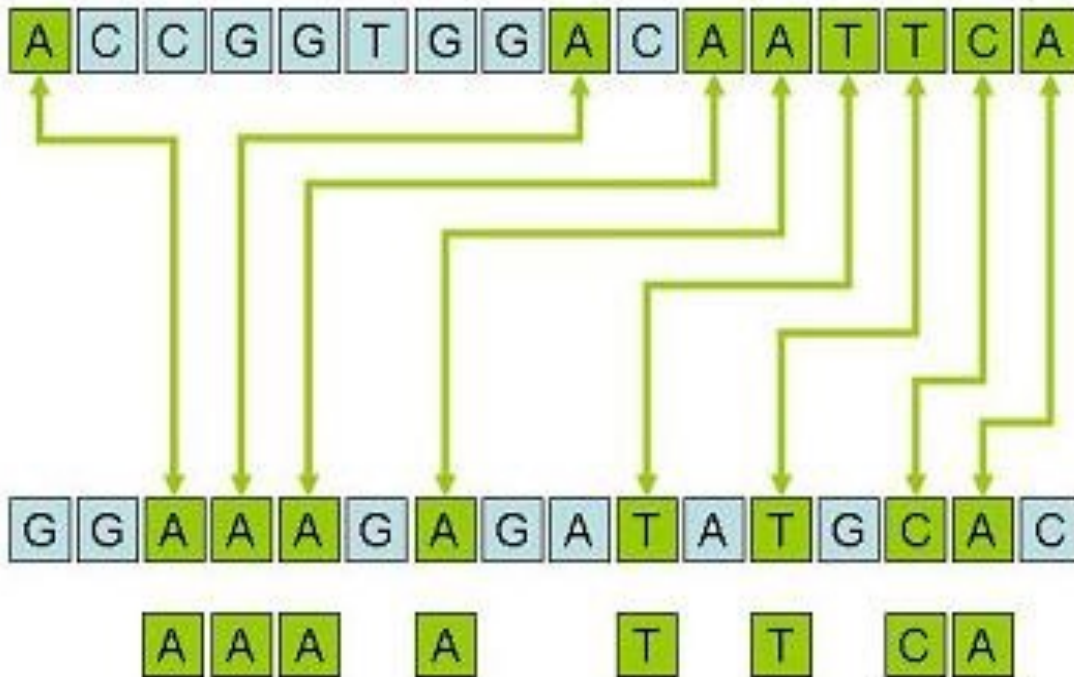
m a e l s t r o m
b e c a l m

h e r o i c a l l y
s c h o l a r l y



Compararea secvențelor ADN

O secvență ADN este compusă din patru tipuri diferite de molecule organice : adenină (A), citozină (C),
guanină (G) și timină (T).





Abordare Naivă : $O(2^n nm)$

X și Y șiruri de caractere de lungimi n și m ($n \leq m$)

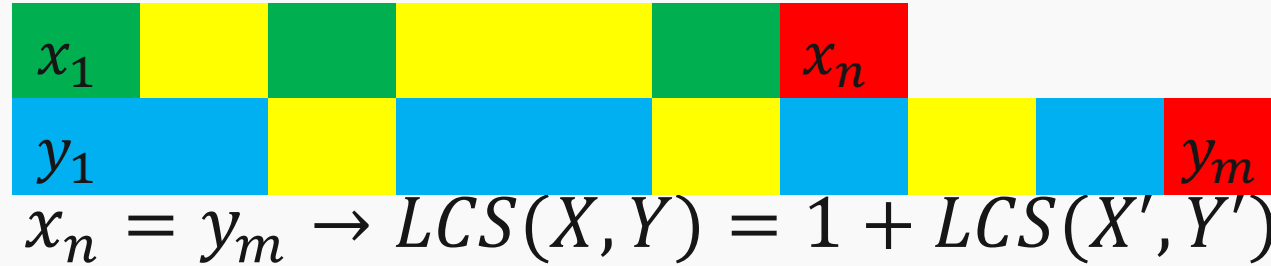
1) Generarea tuturor secvențelor din X (2^n)

2) Verificarea prezenței unei secvențe în șirul Y.

```
bool verify (char* s, int l, char* Y, int m){  
    int last=-1,i,j;  
    for(i=0;i<l;i++){  
        for(j=last+1;j<m;j++){  
            if(s[i]==Y[j])    {last=j; break;}  
        }  
        if(j==m) return false; // caracterul nu a fost gasit  
    }  
    return true;  
}
```



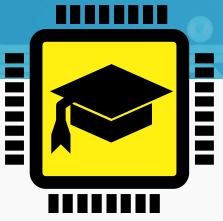
Relația de recurență



$$x_n \neq y_m \rightarrow LCS(X, Y) = \max \begin{cases} LCS(X', Y) \\ LCS(X, Y') \end{cases}$$

$$LCS(i, j) = LCS\{X(1 \dots i), Y(1 \dots j)\}$$

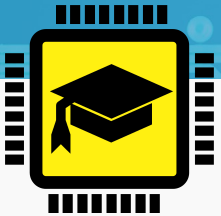
$$LCS(m, n) = \begin{cases} 1 + LCS(m-1, n-1) & \text{daca } x_n = y_m \\ \max(LCS(m, n-1), LCS(m-1, n)) & \text{altfel} \end{cases}$$



Relatia de Recurență : Tabel LCS

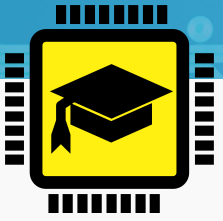
Calculul valorilor din tabel: pe linii, de sus în jos

| | X | | x_1 | x_2 | ... | ... | ... | x_{n-1} | x_n |
|-----------|-------------|---|-------|-------|-----|-----|-----|-----------|-------|
| Y | $LCS(i, j)$ | 0 | 1 | 2 | ... | ... | ... | $n - 1$ | n |
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| y_1 | 1 | 0 | | | | | | | |
| y_2 | 2 | 0 | | | | | | | |
| ... | ... | 0 | | | | | | | |
| ... | ... | 0 | | | | | | | |
| y_{m-1} | $m - 1$ | 0 | | | | | | | |
| y_m | m | 0 | | | | | | | |



Exemplu : $X=ABCD A$ și $Y=ACBDEA$

| | X | | A | B | C | D | A |
|---|-------------|---|---|---|---|---|---|
| Y | $LCS(i, j)$ | 0 | 1 | 2 | 3 | 4 | 5 |
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| A | 1 | 0 | 1 | 1 | 1 | 1 | 1 |
| C | 2 | 0 | 1 | 1 | 2 | 2 | 2 |
| B | 3 | 0 | 1 | 2 | 2 | 2 | 2 |
| D | 4 | 0 | 1 | 2 | 2 | 3 | 3 |
| E | 5 | 0 | 1 | 2 | 2 | 3 | 3 |
| A | 6 | 0 | 1 | 2 | 2 | 3 | 4 |



Memorarea Deciziilor Luate

- Trei tipuri de mutări posibile la calculul unui element : diagonală (cazul 1), stânga sau sus (cazul 2).
- Determinarea secvenței prin parcurgerea mutărilor

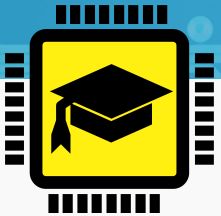
| | | A B C D A | | | | |
|----------------------------|---|-----------|---|---|---|---|
| A C B D E A | | 0 | 0 | 0 | 0 | 0 |
| | A | 0 | 1 | 1 | 1 | 1 |
| | C | 0 | 1 | 1 | 2 | 2 |
| | B | 0 | 1 | 2 | 2 | 2 |
| | D | 0 | 1 | 2 | 2 | 3 |
| | E | 0 | 1 | 2 | 2 | 3 |
| | A | 0 | 1 | 2 | 3 | 4 |

LCS - "ACDA"



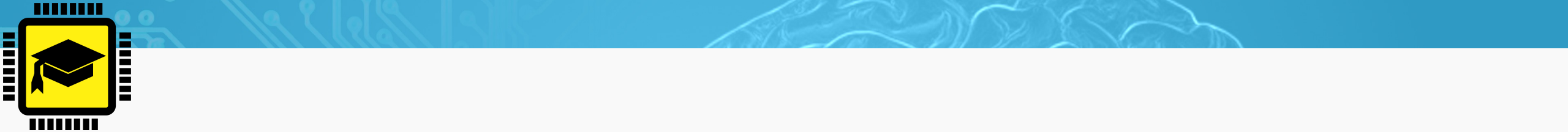
Egalitate Caz 2 \Rightarrow Sus : A C D A

| | X | | A | B | C | D | A |
|---|-------------|---|---|---|---|---|---|
| Y | $LCS(i, j)$ | 0 | 1 | 2 | 3 | 4 | 5 |
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| A | 1 | 0 | 1 | 1 | 1 | 1 | 1 |
| C | 2 | 0 | 1 | 1 | 2 | 2 | 2 |
| B | 3 | 0 | 1 | 2 | 2 | 2 | 2 |
| D | 4 | 0 | 1 | 2 | 2 | 3 | 3 |
| E | 5 | 0 | 1 | 2 | 2 | 3 | 3 |
| A | 6 | 0 | 1 | 2 | 2 | 3 | 4 |



Egalitate Caz 2 \Rightarrow Stanga : A B D A

| | X | | A | B | C | D | A |
|---|-------------|---|---|---|---|---|---|
| Y | $LCS(i, j)$ | 0 | 1 | 2 | 3 | 4 | 5 |
| | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| A | 1 | 0 | 1 | 1 | 1 | 1 | 1 |
| C | 2 | 0 | 1 | 1 | 2 | 2 | 2 |
| B | 3 | 0 | 1 | 2 | 2 | 2 | 2 |
| D | 4 | 0 | 1 | 2 | 2 | 3 | 3 |
| E | 5 | 0 | 1 | 2 | 2 | 3 | 3 |
| A | 6 | 0 | 1 | 2 | 2 | 3 | 4 |

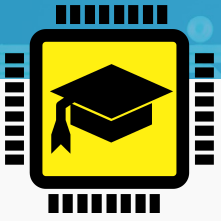




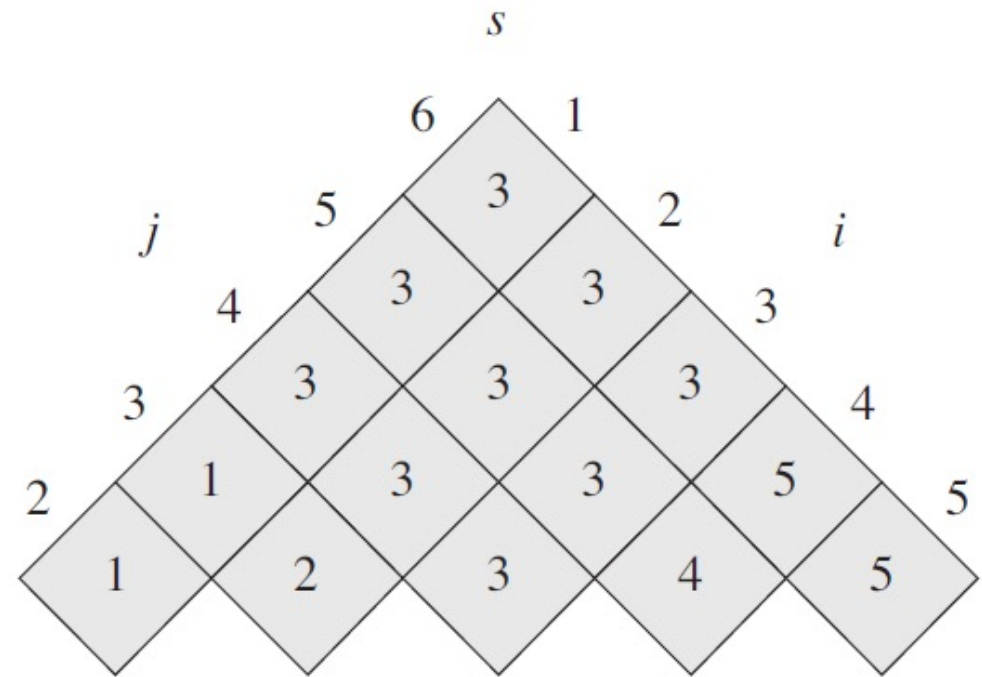
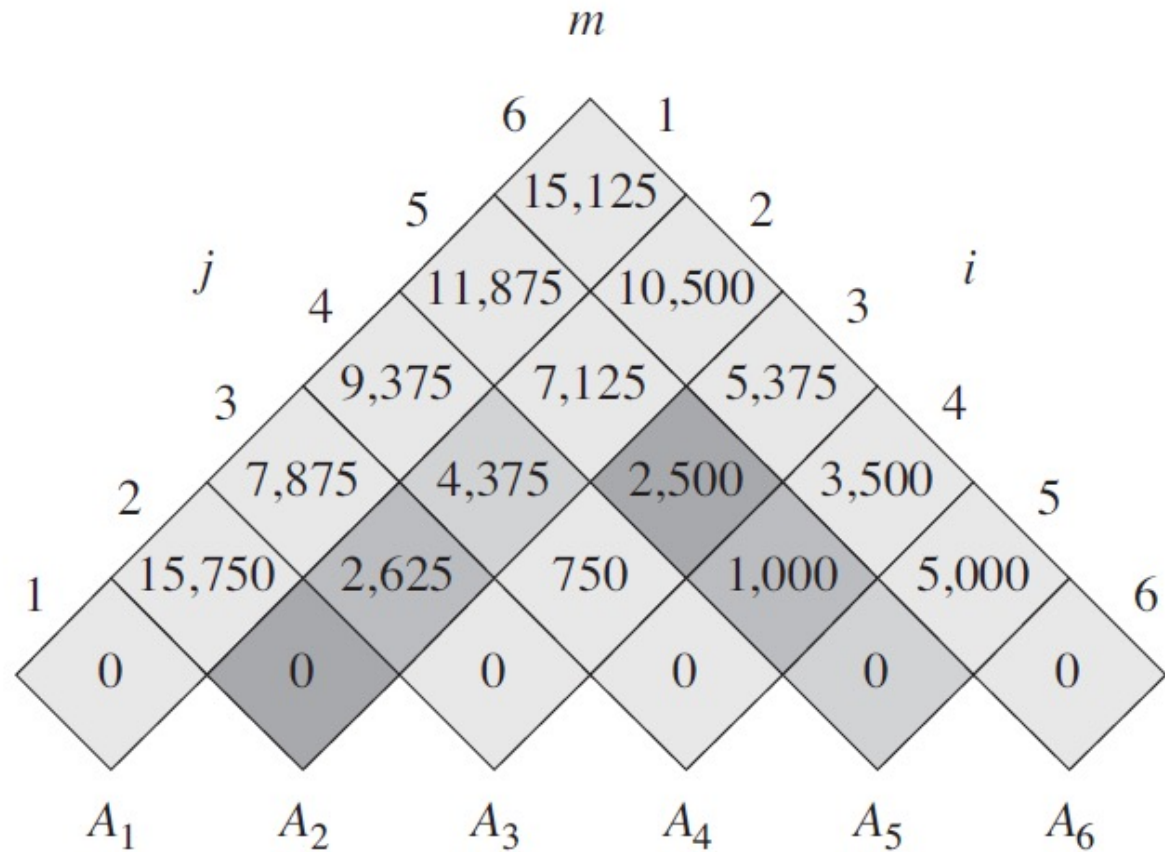
Matrix-chain multiplication

- $(A_1(A_2(A_3A_4)))$
- $(A_1((A_2A_3)A_4))$
- $((A_1A_2)(A_3A_4))$
- $((A_1(A_2A_3))A_4)$
- $((((A_1A_2)A_3)A_4))$

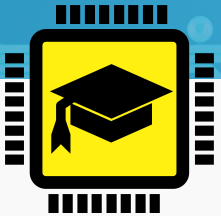
| matrix | A_1 | A_2 | A_3 | A_4 | A_5 | A_6 |
|-----------|----------------|----------------|---------------|---------------|----------------|----------------|
| dimension | 30×35 | 35×15 | 15×5 | 5×10 | 10×20 | 20×25 |



Matrix-chain Multiplication results



| matrix | A_1 | A_2 | A_3 | A_4 | A_5 | A_6 |
|-----------|----------------|----------------|---------------|---------------|----------------|----------------|
| dimension | 30×35 | 35×15 | 15×5 | 5×10 | 10×20 | 20×25 |



Implementare Matrix-Chain multiplication

```
void matrixChainOrder()
{
    for (int i = 1; i <= n; i++)
        m[i][i] = 0;
    for (int l = 2; l <= n; l++)
        for (int i = 1; i <= n - l + 1; i++) {
            int j = i + l - 1;
            m[i][j] = 10000000;
            for (int k = i; k <= j - 1; k++) {
                int q = m[i][k] + m[k + 1][j] + p[i - 1] * p[k] * p[j];
                if (q < m[i][j]) {
                    m[i][j] = q;
                    s[i][j] = k;
                }
            }
        }
}
```