



Wiskunde 13/14

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Optimization : Les 4

Organisatie van de cursus

Week	50 min	100 min	100 min	
1	HC	PR	ZS	Opdracht 1
2	HC	PR	ZS	
3	HC	PR	ZS	Opdracht 2
→ 4	HC	PR	ZS	
5		PR	ZS	Opdracht 3
6		PR	ZS	
7		PR	ZS	

Dynamic Programming

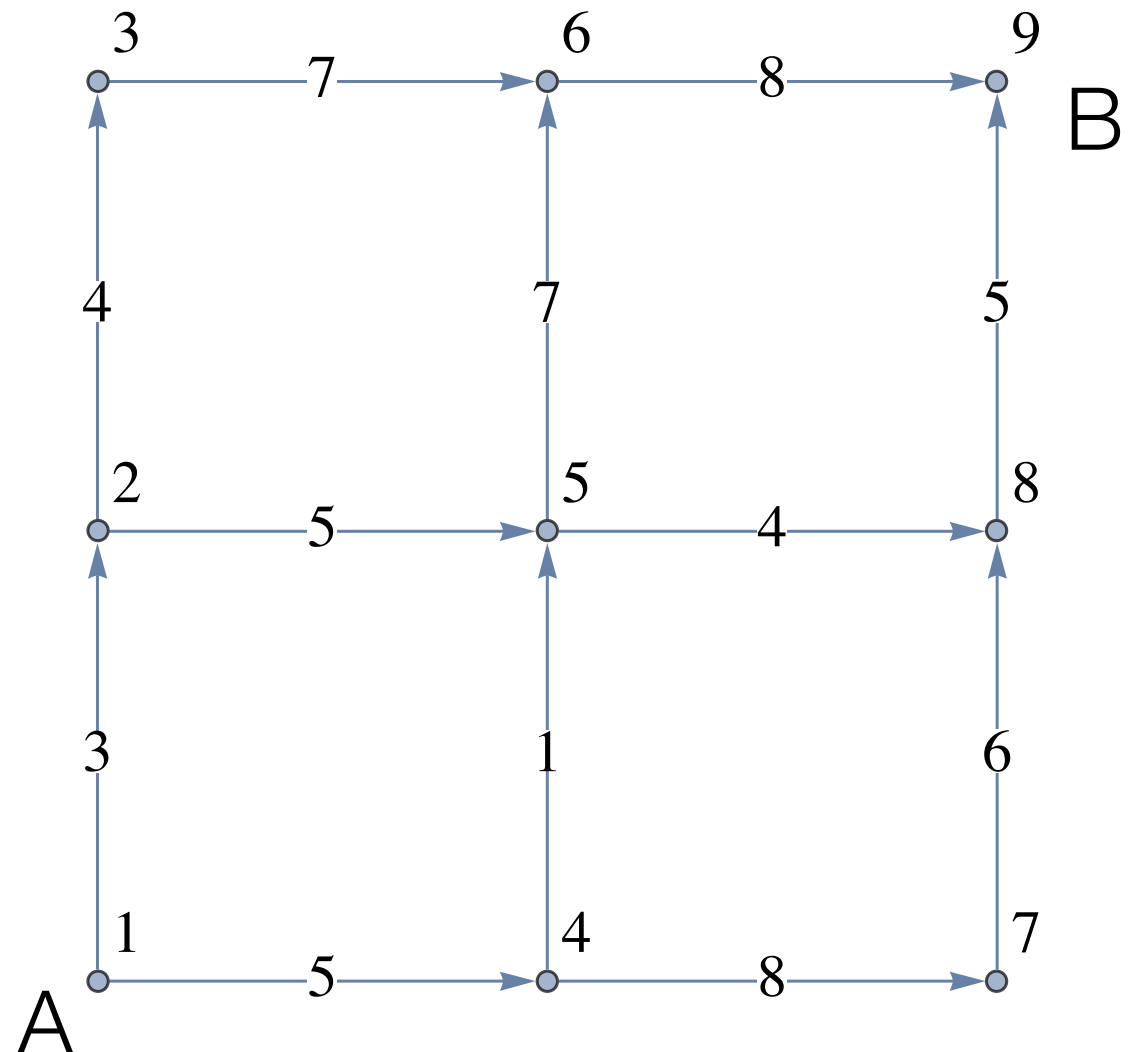
- Dynamic Programming
 - Voorbeeld #1, Korste pad probleem met Manhattan netwerk
 - Voorbeeld #2, Korste pad probleem
 - Voorbeeld #3, Voorraad beheer pobleem
 - Voorbeeld #4, Traveling salesman

Dynamic Programming

Voorbeeld #1 : Kortste pad

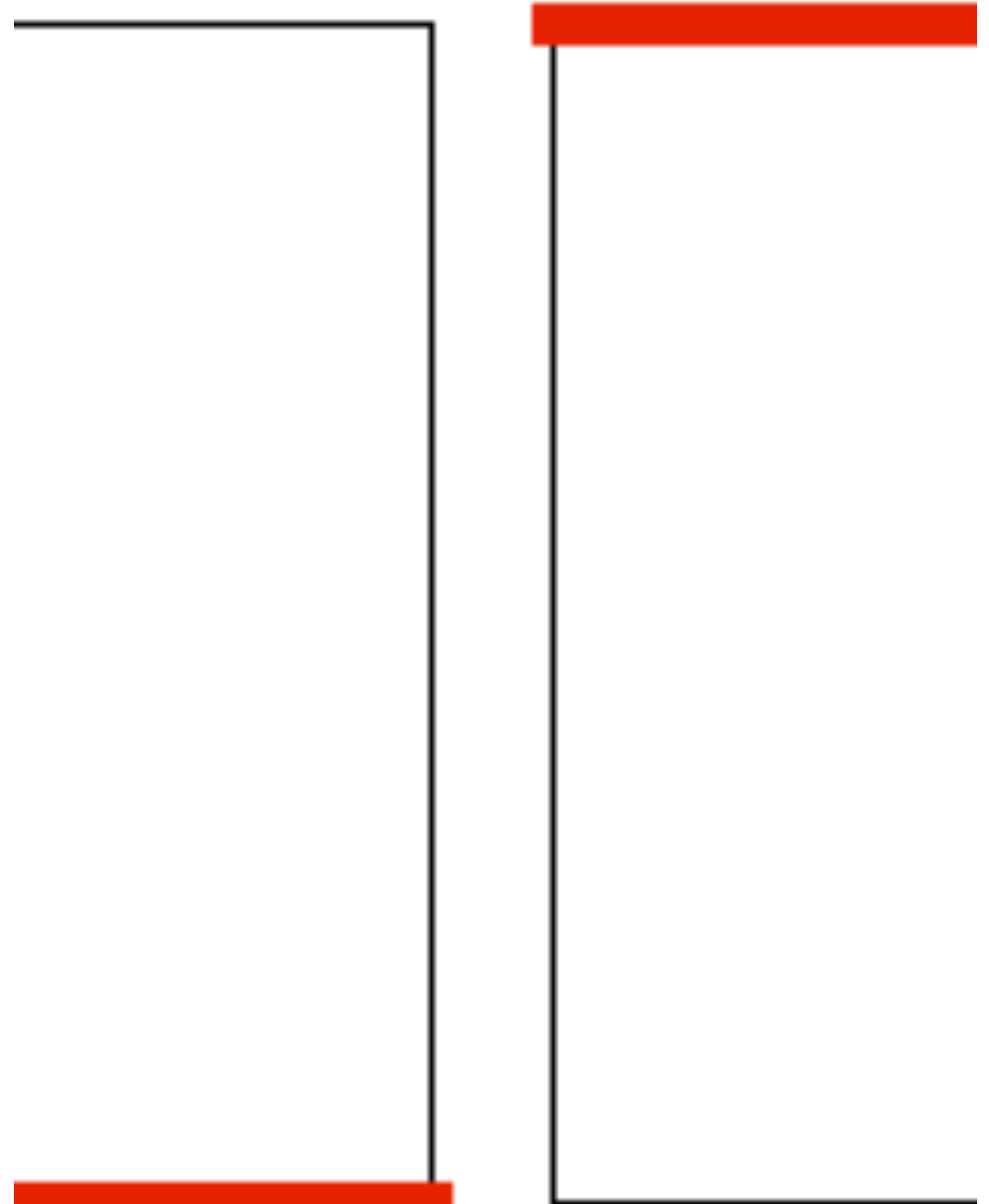
Dynamic Programming

- Korste pad van A naar B



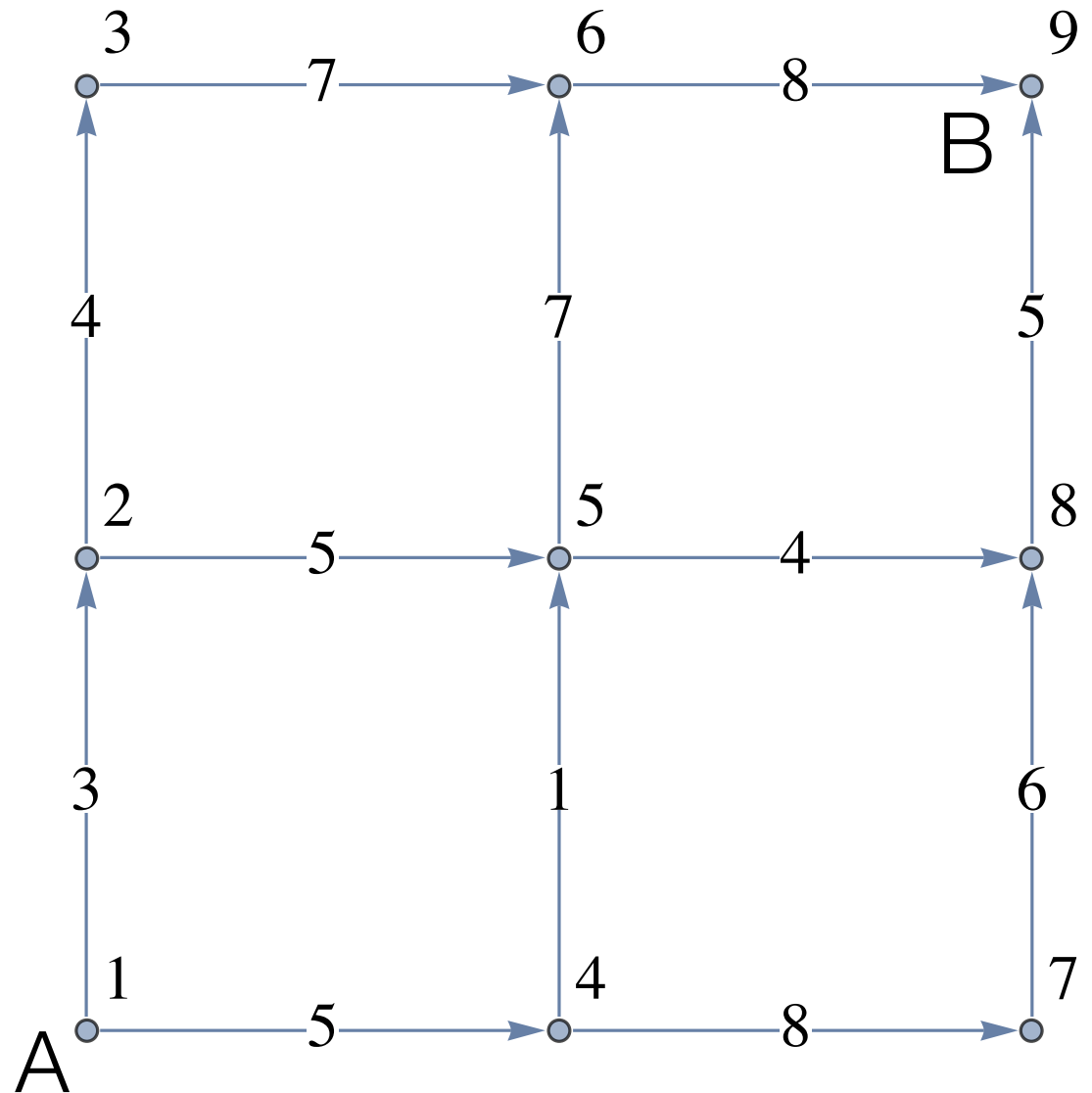
Dynamic Programming : Brute force

- 1x1 grid, 2 paden
- 2x2 grid, 6 paden
- 3x3 grid, 20 paden
- 4x4 grid, 70 paden
- 5x5 grid 252 paden
- nxn grid $\frac{2n!}{n!n!}$ paden
- Benadering $\sqrt{n/\pi} 2^{2n+1}$
 - bij 10^8 berekeningen per seconde
 - n=25, 2 jaar rekenen
 - n=30, 2000 jaar rekenen



Dynamic programming

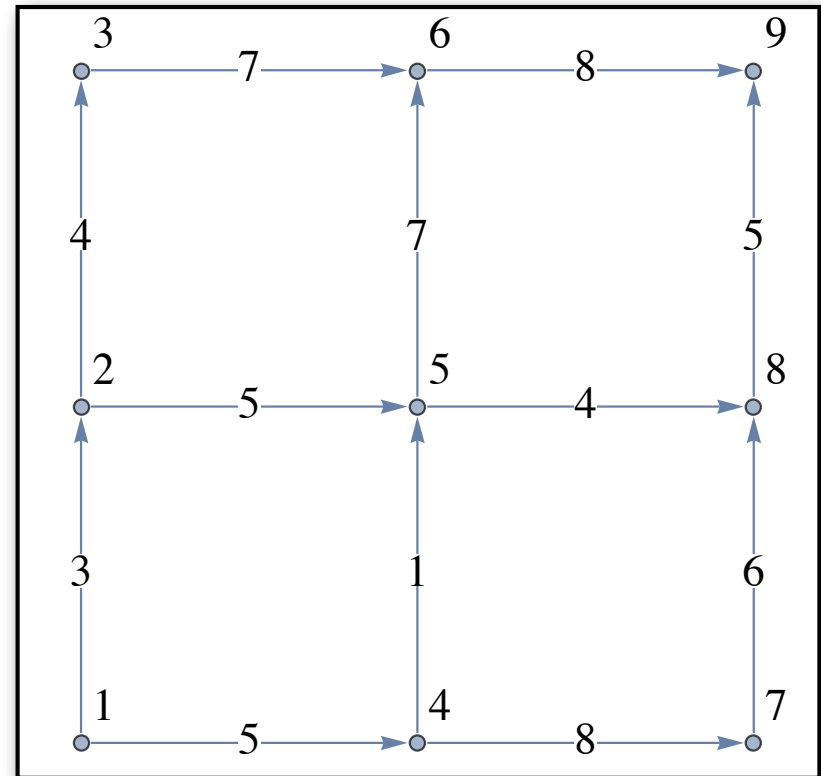
- Kortste pad van A naar B
 - Adjacency matrix
 - Recursief algoritme



Dynamic Programming

- Adjacency matrix

$$c = \begin{pmatrix} \infty & 3 & \infty & 5 & \infty & \infty & \infty & \infty & \infty \\ \infty & \infty & 4 & \infty & 5 & \infty & \infty & \infty & \infty \\ \infty & \infty & \infty & \infty & \infty & 7 & \infty & \infty & \infty \\ \infty & \infty & \infty & \infty & 1 & \infty & 8 & \infty & \infty \\ \infty & \infty & \infty & \infty & \infty & 7 & \infty & 4 & \infty \\ \infty & \infty & \infty & \infty & \infty & \infty & \infty & \infty & 8 \\ \infty & \infty & \infty & \infty & \infty & \infty & \infty & 6 & \infty \\ \infty & \infty & \infty & \infty & \infty & \infty & \infty & \infty & 5 \\ \infty & \infty & \infty & \infty & \infty & \infty & \infty & \infty & \infty \end{pmatrix}$$



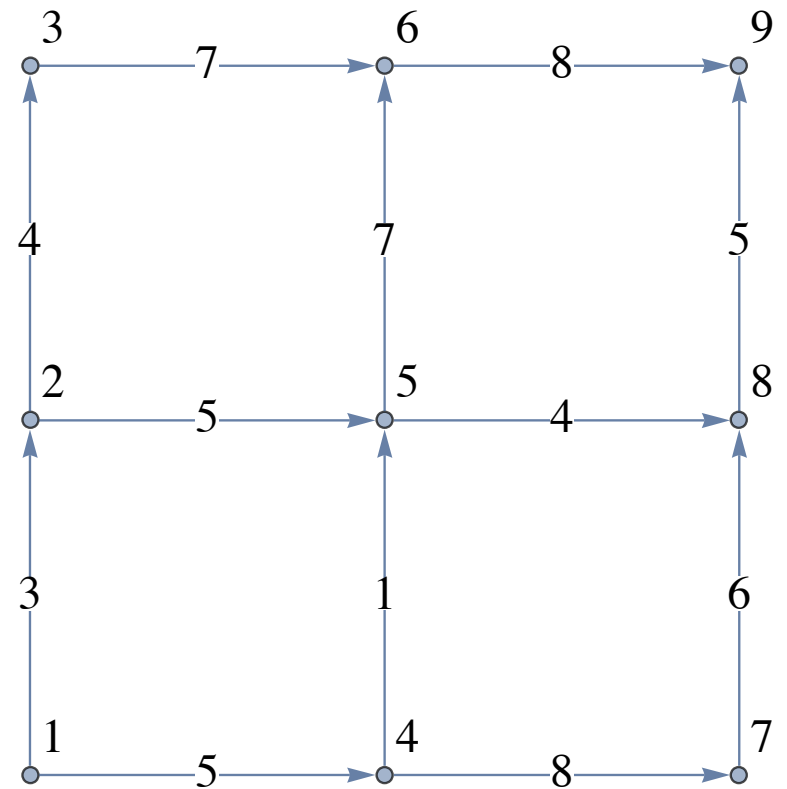
```

edges = {{1 → 2, 3}, {1 → 4, 5}, {2 → 3, 4}, {2 → 5, 5}, {3 → 6, 7}, {4 → 5, 1},
         {4 → 7, 8}, {5 → 6, 7}, {5 → 8, 4}, {6 → 9, 8}, {7 → 8, 6}, {8 → 9, 5}};
c = SparseArray[{#1[[1, 1]], #[[1, 2]]} → #[[2]] & /@ edges, {9, 9}, ∞];
  
```


Dynamic Programming

```
Clear[f, p]
p[T] = T;
f[T] = 0;
f[t_] := f[t] = Module[{v},
  v = Table[c[[t, j]] + f[j], {j, t + 1, T}];
  p[t] = Ordering[v, 1][[1]] + t;
  Min[v]]
```

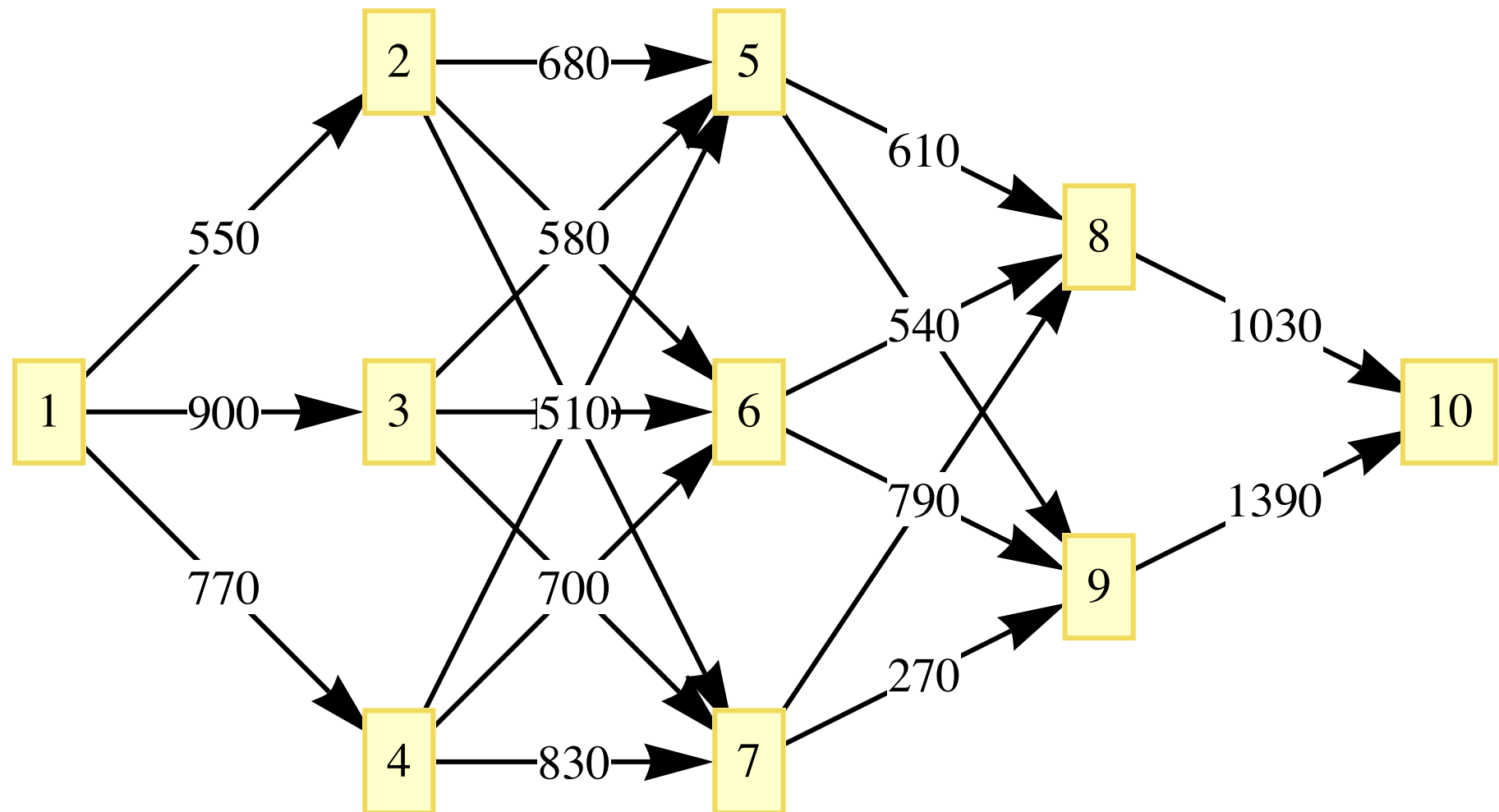
Dynamic Programming



Dynamic Programming

Voorbeeld #2 : Kortste pad

Dynamic Programming



Dynamic Programming

```
edges = {{1 -> 2, 550}, {1 -> 3, 900}, {1 -> 4, 770}, {2 -> 5, 680},  
         {2 -> 6, 790}, {2 -> 7, 1050}, {3 -> 5, 580}, {3 -> 6, 760},  
         {3 -> 7, 660}, {4 -> 5, 510}, {4 -> 6, 700}, {4 -> 7, 830},  
         {5 -> 8, 610}, {5 -> 9, 790}, {6 -> 8, 540}, {6 -> 9, 940},  
         {7 -> 8, 790}, {7 -> 9, 270}, {8 -> 10, 1030}, {9 -> 10, 1390}};  
vertices = {1 -> {1, 1}, 2 -> {2, 2}, 3 -> {2, 1}, 4 -> {2, 0},  
           5 -> {3, 2}, 6 -> {3, 1}, 7 -> {3, 0}, 8 -> {4, 1.5},  
           9 -> {4, 0.5}, 10 -> {5, 1}};  
  
T = 10;  
c = SparseArray[{{#1[[1, 1]], #1[[1, 2]]} -> #1[[2]] & /@ edges,  
               {T, T},  $\infty$ ];  
c // MatrixForm
```

Dynamic Programming

```
T = 10;
c = SparseArray[{{#1[[1, 1]], #1[[1, 2]]} → #1[[2]] & /@ edges,
  {T, T}, ∞];
c // MatrixForm
```

[illegible]

Dynamic Programming

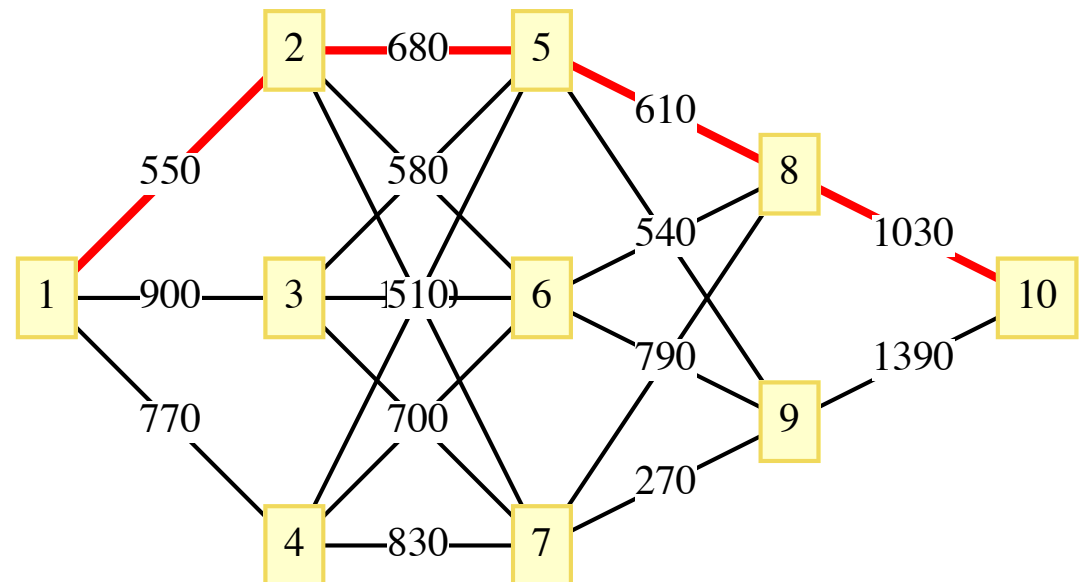
```
Clear[f, p]
p[T] = T;
f[T] = 0;
f[t_] := f[t] = Module[{v},
  v = Table[c[[t, j]] + f[j], {j, t + 1, T}];
  p[t] = Ordering[v, 1][[1]] + t;
  Min[v]]
```

f[1]

2870

```
y = 1;
path = Join[{1},
  Table[y = p[y], {t, 4}]]
```

{1, 2, 5, 8, 10}



Dynamic Programming

Voorbeeld #3 : Voorraad beheer

Dynamic Programming

- Voorraad beheer:
 - Planning periode : T
 - In maand t is de vraag naar een product d_t en de hoeveelheid geproduceerde producten x_t
 - De voorraad aan het einde van maand t is i_t
 - De productie in maand t vervult de behoefte in maand t
 - Neem aan dat in maand t de totale kosten gegeven worden door

$$c(x_t, i_t) = a + b x_t + h i_t \text{ if } x_t > 0$$

$$c(x_t, i_t) = h i_t \text{ if } x_t = 0$$

- Met de beperking dat

$$0 \leq x_t \leq r$$

$$0 \leq i_t \leq s$$

- Bereken de optimale x_t

**$a = 3; b = 1; h = 0.5;$
 $r = 5; s = 4; T = 4;$
 $d = \{1, 3, 2, 4\};$**

Dynamic Programming

- Als $f_t(i)$ de *minimale kosten* zijn om aan de behoefte van de maanden $t, t+1, \dots, T$ te voldoen dan volgt dat

$$f_t(i) = \min_{x_t} [c(x_t, i + x_t - d_t) + f_{t+1}(i + x_t - d_t)]$$

- (productie x_t , voorraad i , vraag d_t)
- De optimale waarde van x_i is $p_t(i)$
- In de laatste maand moet de voorraad leeg zijn

$$p_T(i) = d_T - i$$
$$f_T(i) = c(d_T - i, 0).$$

Dynamic Programming

```
Remove["Global`*"]
```

```
a = 3; b = 1; h = 0.5; r = 5; s = 4; T = 4;  
d = {1, 3, 2, 4};
```

```
c[x_, i_] = Piecewise[{{0, x == 0}, {a + b x, x > 0}}, ∞] + h i
```

$$0.5 i + \begin{pmatrix} \begin{cases} 0 & x = 0 \\ 3 + x & x > 0 \\ \infty & \text{True} \end{cases} \end{pmatrix}$$

```
Clear[f, p]
```

```
p[T, i_] := d[[T]] - i;
```

```
f[T, i_] := f[T, i] = c[d[[T]] - i, 0]
```

```
f[t_, i_] := f[t, i] = Module[{v, e = d[[t]]},
```

```
  v = Table[c[x, i + x - e] + f[t + 1, i + x - e], {x, e - i, Min[r, s + e - i]}];
```

```
  p[t, i] = Ordering[v, 1][[1]] + e - i - 1;
```

```
  Min[v]]
```

Dynamic Programming

```
Grid[Join[{Join[{"Init. inv."}, Range[0, s]]},
  Table[Join[{Row[{"Month ", t}]], Table[p[t, i], {i, 0, s}]], {t, T}]],
  Dividers → {2 → True, 2 → True}, Alignment → {Left, {Right}}, Spacings → 2,
  Background → {Automatic, Automatic,
    {{{2, 3}, {2, 2}} → LightGray, {{4, 4}, {4, 4}} → LightGray,
    {{5, 5}, {2, 2}} → LightGray}}]
```

Init. inv.	0	1	2	3	4	
Month 1	1	0	0	0	0	a = 3; b = 1; h = 0.5;
Month 2	5	4	3	0	0	r = 5; s = 4; T = 4;
Month 3	2	5	0	0	0	d = {1, 3, 2, 4};
Month 4	4	3	2	1	0	

- Maand 1: Beginvoorraad 0, (vraag maand 1 is 1 unit), produceer 1 unit
- Maand 2: Beginvoorraad 0, (vraag maand 1 was 1 unit), produceer 5 units
- Maand 3: Beginvoorraad 2, (vraag maand 2 was 3 units), produceer 0 units
- Maand 4: Beginvoorraad 2, (vraag maand 3 was 2 units), produceer 4 units

Dynamic Programming

Voorbeeld #4 : Traveling salesman

Dynamic Programming

```
Remove["Global`*"]

T = 15; SeedRandom[54];
points = RandomReal[10, {T, 2}];
c = Array[cc, {T, T}];
Table[c[[i, j]] = EuclideanDistance[points[[i]], points[[j]]], {i, T}, {j, T}];

Clear[f, p]; cities = Range[2, T];
p[T, i_, cities] := 1
f[T, i_, cities] := f[T, i, cities] = c[[i, 1]]
f[t_, i_, S_] := f[t, i, S] = Module[{unvisited, v},
  unvisited = Complement[cities, S];
  v = c[[i, #]] + f[t + 1, #, Union[S, {#}]] & /@ unvisited;
  p[t, i, S] = Extract[unvisited, Ordering[v, 1][[1]]];
  Min[v]]

f[1, 1, {}] // Timing
{12.7861, 37.6344}

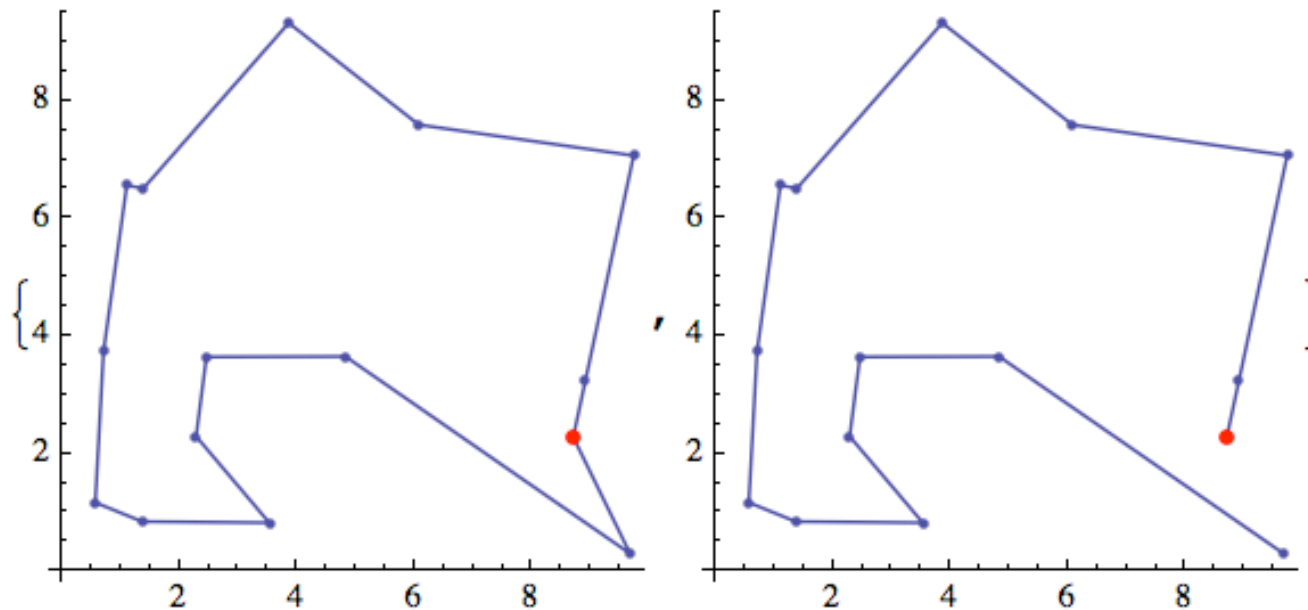
i = 1; S = {}; tour1 = Join[{1}, Table[y = p[t, i, S]; i = y; S = Union[S, {y}]; y, {t, T}]]
{1, 7, 13, 2, 14, 10, 5, 4, 12, 15, 3, 9, 11, 6, 8, 1}
```

Dynamic Programming

```
{length, tour2} = FindShortestTour[points] // Timing
```

```
{0.073891, {37.6344, {1, 7, 13, 2, 14, 10, 5, 4, 12, 15, 3, 9, 11, 6, 8}}}
```

```
ListLinePlot[points[[#]], Mesh → All, AspectRatio → Automatic,  
  Epilog → {Red, PointSize[Medium], Point[First[points]]}] & /@ {tour1, tour2}
```



Vragen?



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