

KNAPSACK

- we have n jobs, the i th of which takes w_i seconds to finish, and has value v_i .

Our CPU is available for W seconds.

A set S of jobs is feasible if:

$$\sum_{i \in S} w_i \leq W$$

What is a set S of jobs satisfying $\sum_{i \in S} w_i \leq W$ and having maximum total value? $\sum_{i \in S} v_i$

We assume that W, w_1, \dots, w_n are integers.

$$OPT(i, w) = \max_{S \subseteq \{1, 2, \dots, i\}} \sum_{j \in S} v_j$$

$$\sum_{j \in S} w_j \leq W$$

w_j = "length" of job;
 v_j = "payment" you get for running job j

T: If $O_{i,w}$ is an optimal solution (a set of jobs) for the jobs $\{1, \dots, i\}$ and with w available seconds. Then,

- If $i \notin O_{i,w}$, then $OPT(i, w) = OPT(i-1, w)$, and
- If $i \in O_{i,w}$, then $OPT(i, w) = v_i + OPT(i-1, w-w_i)$

Moreover, if $w_i > w$, then $i \notin O_{i,w}$, thus $OPT(i, w) = OPT(i-1, w)$

KNAPSACK (n, w)

INITIALIZE THE ARRAY $M[0 \dots n][0 \dots w]$ $O(nw)$

LET $M[0][w] = 0 \quad \forall 0 \leq w \leq W$ $O(w)$

FOR $i = 1 \dots n$

 FOR $w = 0 \dots W$

$O(n \cdot w)$

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IF ( $w_i > w$ ) or ( $M[i-1][w] > v_i + M[i-1][w - w_i]$ )
     $M[i][w] = M[i-1][w]$ 
ELSE:
     $M[i][w] = v_i + M[i-1][w - w_i]$ 

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RETURN M

We could run $M = \text{KNAPSACK}(n, w)$, and then conclude that $M[n][w]$ is the value of the best solution

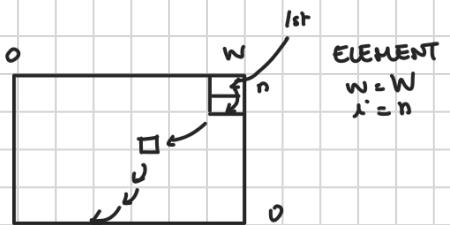
FIND SOL (n, w)

$M = \text{KNAPSACK}(n, w) \quad O(n \cdot w)$

$S = []$

$w = w$

$i = n$



{ WHILE $i > 0$:

 IF $M[i][w] == M[i-1][w]$

$i -= 1$ // throw away i

 ELSE:

$S.\text{APPEND}(i)$ // schedule i

$w -= w_i$

$i -= 1$

RETURN S

 IF $M[i][w] \neq M[i-1][w]$:

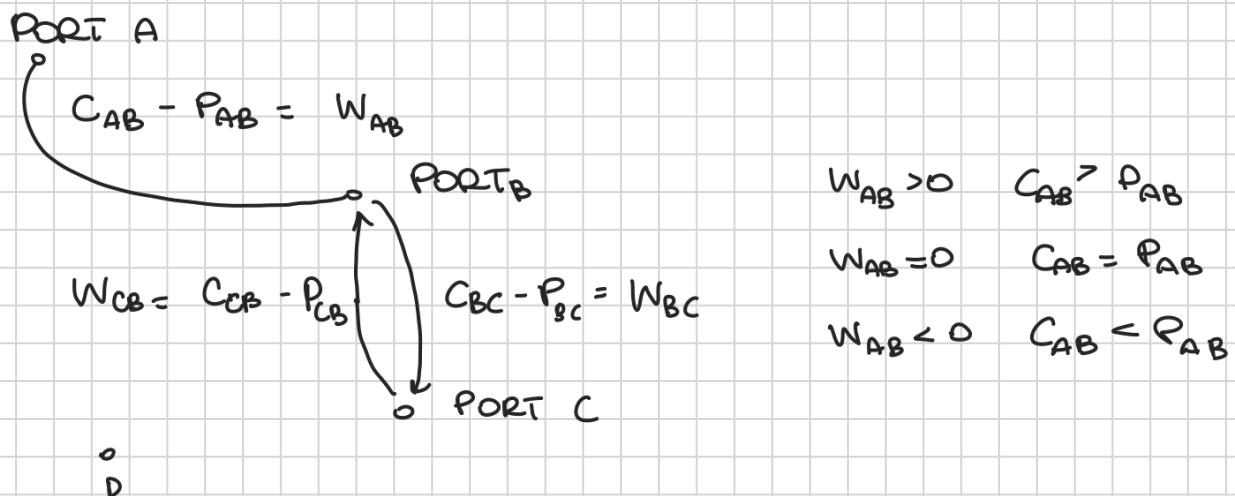
$S.\text{APPEND}(i)$
 $w -= w_i$

$i -= 1$

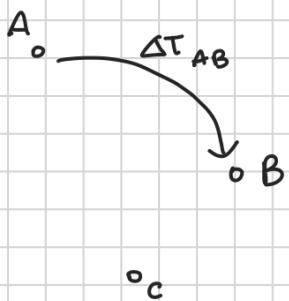
// $\sum_{j \in S} v_j = M[n][w]$ and $\sum_{j \in S} w_j \leq w$

SHORTEST PATHS ON GRAPHS WITH "NEGATIVE AND/OR POSITIVE" WEIGHTS.

cruise ship / taxi drive

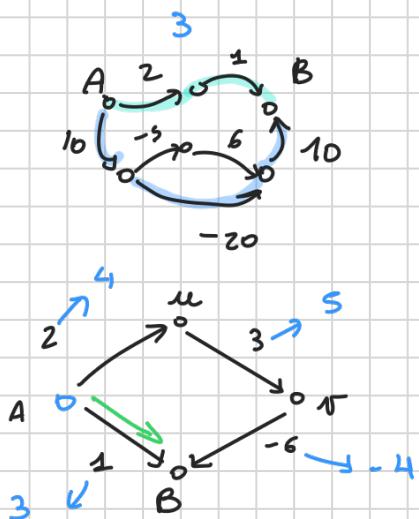


CHEMICAL REACTIONS



$V = \{A, B, C\}$ chemical compounds

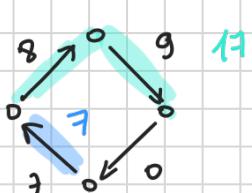
How to go from s to t with the smallest increase in temperature



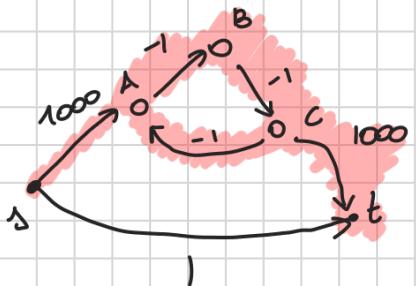
A TO B

DJIKSTRA DOESN'T WORK HERE

A	0
B	1
u	2



ADD $- \min_e W_e$ to each edge
(so that edge weights become non-neg.)



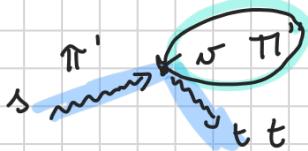
We assume that the graph has no negative cycles

L1 : IF G is a graph with no negative cycles, then \exists exists a shortest path from s to t that is simple (it has no node repetition), and that contains $\leq n-1$ edges.

P: Let π be a $s-t$ shortest path with minimal number of edges.

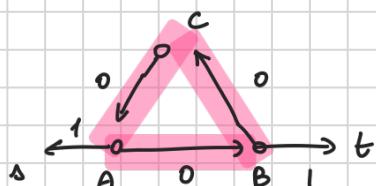
Suppose that $\exists \pi'$ s.t. $\pi = \pi' \cup \pi'' \cup \pi'''$

Since G contains no negative cycles, it must be that $\cup \pi'''$ is a cycle having a positive total edge weight.



Consider now, the path $\tilde{\pi} = \pi' \cup \pi''$. This path has fewer edges than π . Moreover the total weight of $\tilde{\pi}$ is no larger than the total weight of π . Since π has more edges than $\tilde{\pi}$, and since the total weight of $\tilde{\pi}$ is not larger than that of π , $\tilde{\pi}$ cannot be a $s-t$ shortest path with a minimal numbers of edges. **CONTRADICTION.**

Then no node is repeated in a shortest path with a minimal number of edges — since we have n nodes, such a path has at most $n-1$ edges ■



$$w(s \xrightarrow{AB} t) = 2$$

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Let $\text{OPT}(i, v)$ be the minimum cost/weight of a path from v to t , having at most i edges.

Let π be a path of i edges from v to t , having minimum cost $\text{OPT}(i, v)$



π has at most 1 edges

- If π has at most $i-1$ edges, then $\text{OPT}(i, v) = \text{OPT}(i-1, v)$
- If π has exactly i edges, then $\exists w$ such that π starts from v , moves to w , and then progresses optimally to t using at most $i-1$ edges. That is,

$$\text{OPT}(i, v) = c_{vw} + \text{OPT}(i-1, w)$$

This DP is called "the BELLMAN-FORD" algorithm.

$$\text{OPT}(0, t) = 0$$

$$\text{OPT}(0, v) = \infty \quad \forall v \neq t$$

and

L2 : If $i > 0$, $\text{OPT}(i, v) = \min \left(\text{OPT}(i-1, v), \min_w (c_{vw} + \text{OPT}(i-1, w)) \right)$
 $(v, w) \in E$

BELLMAN-FORD (G, s, t) :

INITIALIZE $M[0 \dots n-1][v \in V(G)]$

$$M[0][t] = 0$$

$$M[0][v] = +\infty \quad \forall v \in V - \{t\}$$

FOR $i = 1 \dots n-1$:

FOR $v \in V(G)$:

$$M[i][v] = M[i-1][v]$$

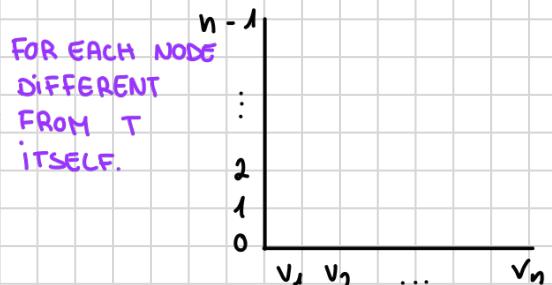
FOR w ST. $(v, w) \in E(G)$:

$$\delta = c_{vw} + M[i-1][w]$$

IF $\delta < M[i][v]$:

$$M[i][v] = \delta$$

RETURN M (or $M[n-1][s]$)



} RECURRANCE OF L2

THM: Bellman-Ford returns the shortest distance from s to t if the graph contains no negative cycles.

P: Apply L1 and L2.

How can you deal with negative cycles if they exist?

If we let the algo go for an extra iteration, so instead of stoping at $n-1$, we let it stop at n , then we can observe and proof the following lemma: if the opt values with $i=n$ coincide to the opt values with $i=n-1$, no negative cycles exists, otherwise some negative cycles exists.

It may happen that a negative cycle exists but can't be reached.

L'algoritmo di Bellman-Ford è stato il primo algoritmo ad introdurre l'approccio dinamico e risolve il problema dei cammini minimi da sorgente unica nel caso generale in cui i pesi degli archi possono essere negativi.

Dato un grafo orientato pesato $G = (V, E)$ con sorgente s e funzione peso $w: E \rightarrow \mathbb{R}$, l'algoritmo di Bellman-Ford restituisce un valore booleano che indica se esiste oppure no un ciclo di peso negativo che è raggiungibile dalla sorgente. Se un tale ciclo esiste, l'algoritmo indica che il problema non ha soluzione. Se un tale ciclo non esiste, l'algoritmo fornisce i cammini minimi e i loro pesi.