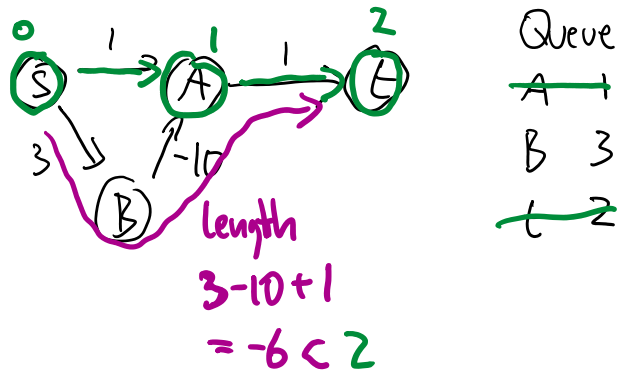
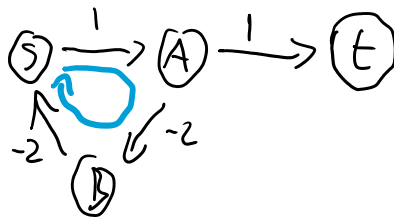


Shortest path with negative edge costs

Dijkstra can fail



No shortest way to go from s to t



it's always better to do one more s → A → B → s cycle because it reduces the length by 3

Today: Algorithm that works if the graph has no cycle of negative cost.

Bellman-Ford

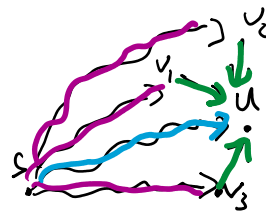


Observation: If there are no neg. cycles then the shortest paths do not have cycles

⇒ a shortest path uses at most $|V|-1$ edges
 visit at most $|V|$ vertices

$T[u, i]$ = length of shortest path from s to u that uses at most i edges

$$T[u, i+1] = \min(T[u, i], \min_{(v, u) \in E} (T[v, i] + c_{vu}))$$



$$T[u, 1] = \begin{cases} c_{su} & \text{if } (s, u) \in E \\ \infty & \text{if } (s, u) \notin E \end{cases} \quad \forall v \in V$$

$$T[u, 1] = \begin{cases} c_{su} & \text{if } (s, u) \in E \\ \infty & \text{if } (s, u) \notin E \end{cases} \quad \forall u \in V$$

Bellman Ford ($G=(V, E), s$)

for $u \in V$

$$\begin{cases} T[u, 1] = c_{su} & \text{if } (s, u) \in E \\ T[u, 1] = \infty & \text{if } (s, u) \notin E \end{cases}$$

Base case $O(|V|)$

Break 2:48

$$T[s, 1] = 0$$

for $i=2 \dots |V|-1$ $O(|V|)$

$$\begin{cases} \text{for } u \in V \\ T[u, i] = \min(T[u, i-1], \min_{(v, u) \in E} (T[v, i-1] + c_{vu})) \end{cases} \quad \text{Recursion } O(|E|)$$

distance = []

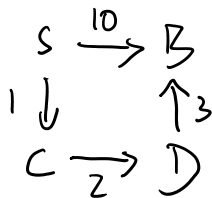
for $v \in V$

$$distance[v] = T[v, |V|-1]$$

output

total $O(|V| \cdot |E|)$

Example



	T	S	B	C	D
$i=1$		0	10	1	∞
$i=2$		0	10	1	3
$i=3$		0	6	1	3

$$T[u, i+1] = \min(\underbrace{T[u, i]}_{10}, \min_{(v, u) \in E} (\underbrace{T[v, i]}_{3} + \underbrace{c_{vu}}_{3}) \text{ (from D)})$$

$$T[u, i+1] = \min(10, 0 + 10 \text{ (from S)})$$

Bellman Ford ($G=(V, E), s$)

for $u \in V$

$$\begin{cases} T[u, 1] = c_{su} & \text{if } (s, u) \in E \\ T[u, 1] = \infty & \text{if } (s, u) \notin E \end{cases}$$

$$T[s, 1] = 0$$

... $\rightarrow |V|-1$

$$T[s, 1] = 0$$

for $i = 2 \dots |V| - 1$

for $u \in V$

$$T[u, i] = \min(T[u, i-1], \min_{(v,u) \in E} (T[v, i-1] + c_{vu}))$$

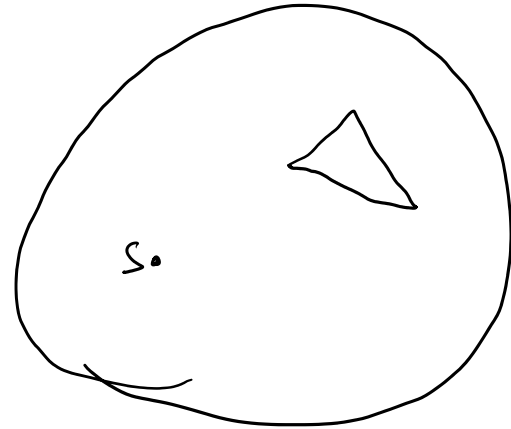
* maybe $|V|$ extra iterations

for $u \in V$

$$\text{if } \min_{(v,u) \in E} (T[v, |V|-1] + c_{vu}) < T[u, |V|-1]$$

return "there is neg. cycle"

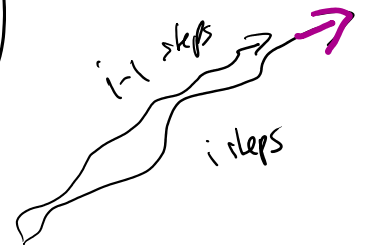
return "no neg cycle"



Dynamic Programming

- Describe problem/solution recursively

(Unlike D&C do not split problem in half)
 Instead, cut off a small piece of the input
 or the solution.



■ - Find base cases

■ - Fill table via for-loops

■ - Which cells of table contain solution?

Knapsack: bag of size $B \in \mathbb{N}$

n items $v[i]$ is value of i -th item

$s[i]$ is the size of i -th item.

$v[i], s[i] \in \mathbb{N}$

$s[i] \leq B$

Find $S \subseteq \{1 \dots n\}$ with $\sum_{i \in S} s[i] \leq B$

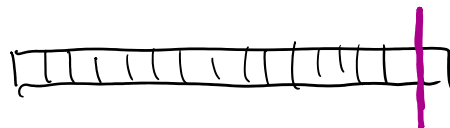
Find $S \subseteq \{1 \dots n\}$ with $\sum_{i \in S} s[i] \leq B$

such that the value $\sum_{i \in S} v[i]$ is as large as possible.

$T[i, b]$ = max value possible if we have b space left
and only the first i items available
as option

$$T[i, b] = \max(T[i-1, b], T[i-1, b-s[i]] + v[i])$$

↑ do not pack
 i -th item



Base case

$$T[i, 0] = 0 \quad \forall i = 0 \dots n$$

$$T[i, b] = -\infty \quad \forall b < 0$$

$$T[0, b] = 0 \quad \forall b = 0 \dots B$$

for $i = 1 \dots n$

for $b = 1 \dots B$

$$T[i, b] = \max(T[i-1, b], T[i-1, b-s[i]] + v[i])$$

return $T[n, B]$

$$O(nB)$$

"pseudo polynomial"
polynomial in value of B

Array length n $v[1..n]$
 $s[1..n]$
 $B \leftarrow \log B$ bit

input size is $n+k$ $k = \log B$
time $O(nB) = O(n2^k)$

Next week polynomial time for $(1 \pm \epsilon)$ -approximation

