

Design and Analysis of Algorithms

L26: Multi-Stage Graphs Dynamic Programming

Dr. Ram P Rustagi
Sem IV (2020-Even)
Dept of CSE, KSIT
rprustagi@ksit.edu.in

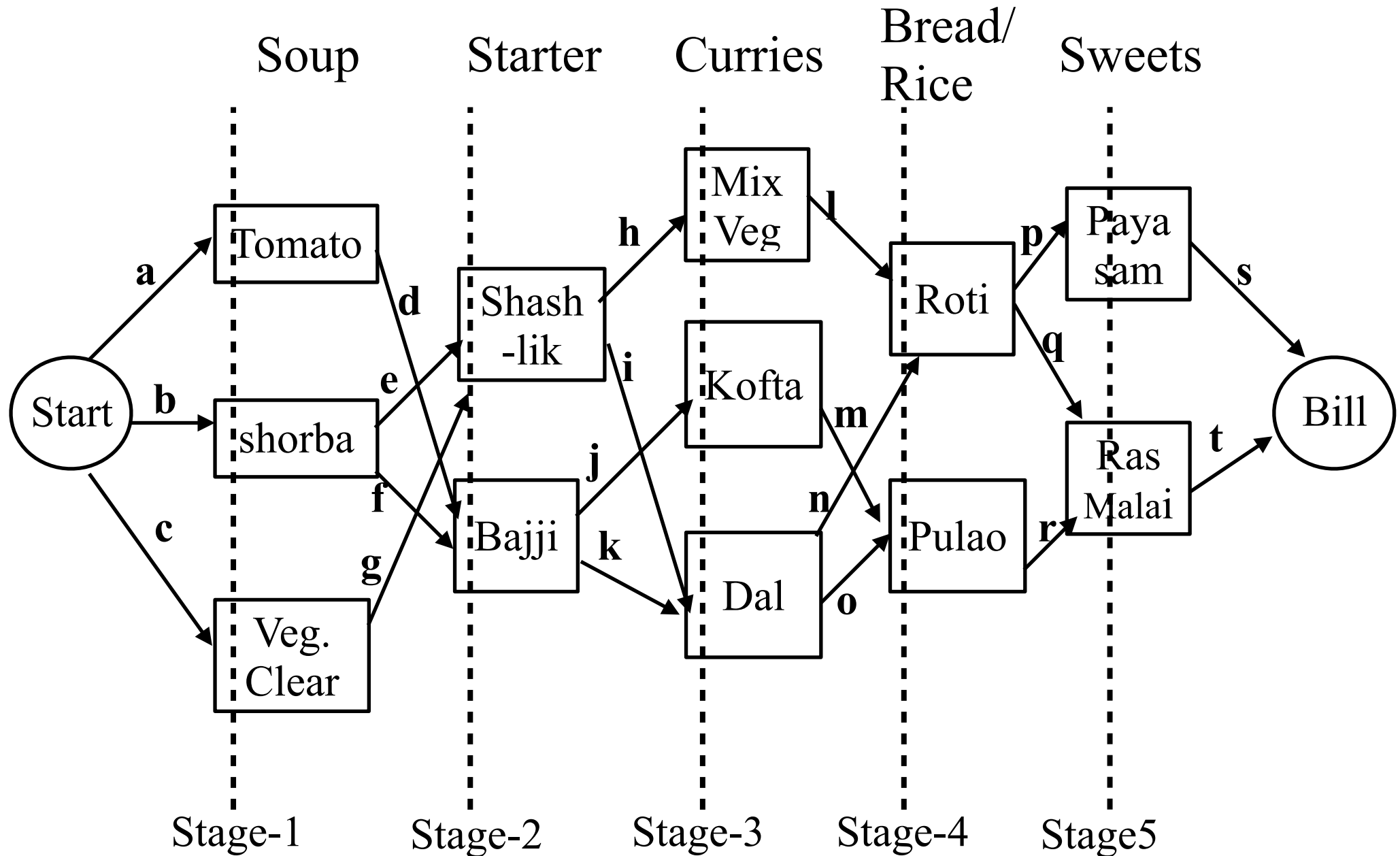
Resources

- Text book 2: Horowitz
 - Sec 5.1, 5.2, 5.4, 5.8, 5.9
- <http://www.gdeepak.com/course/adslidesold/26ad.pdf>
- https://ocw.mit.edu/courses/civil-and-environmental-engineering/1-204-computer-algorithms-in-systems-engineering-spring-2010/lecture-notes/MIT1_204S10_lec13.pdf
- R1: Introduction to Algorithms
 - Cormen et al.

Consider Restaurant Ordering

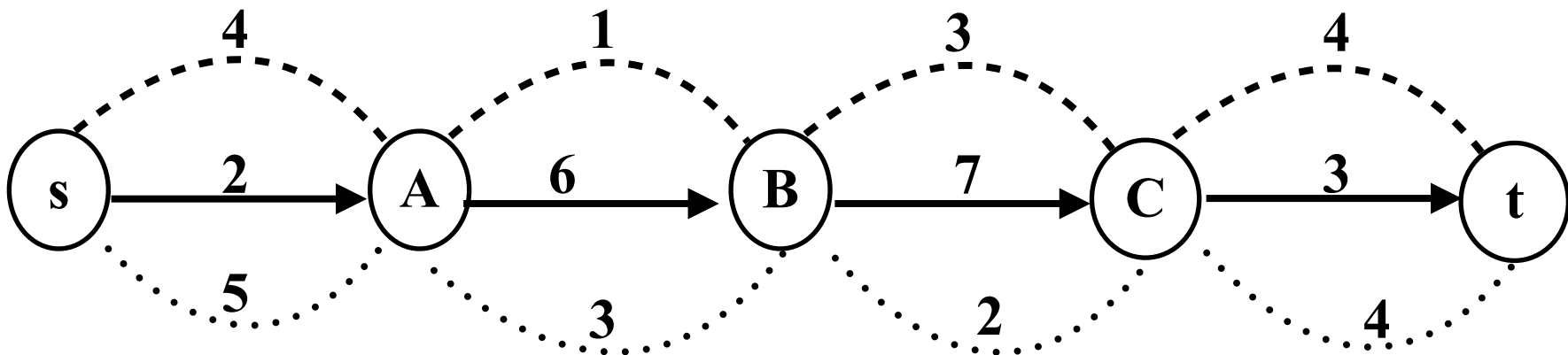
- Food order and serving
 - Soups
 - Starters
 - Main course (curries)
 - Breads/Rice
 - Sweets
 - Mouth freshners
- Each happens in stages
 - Want meal with minimum cost with 1 item in each stage
 - Have multiple choices in each stage.
 - Constraints on what can be chosen in next stage
 - Draw a multi-stage graph

Multi-Stage Graph: Restaurant



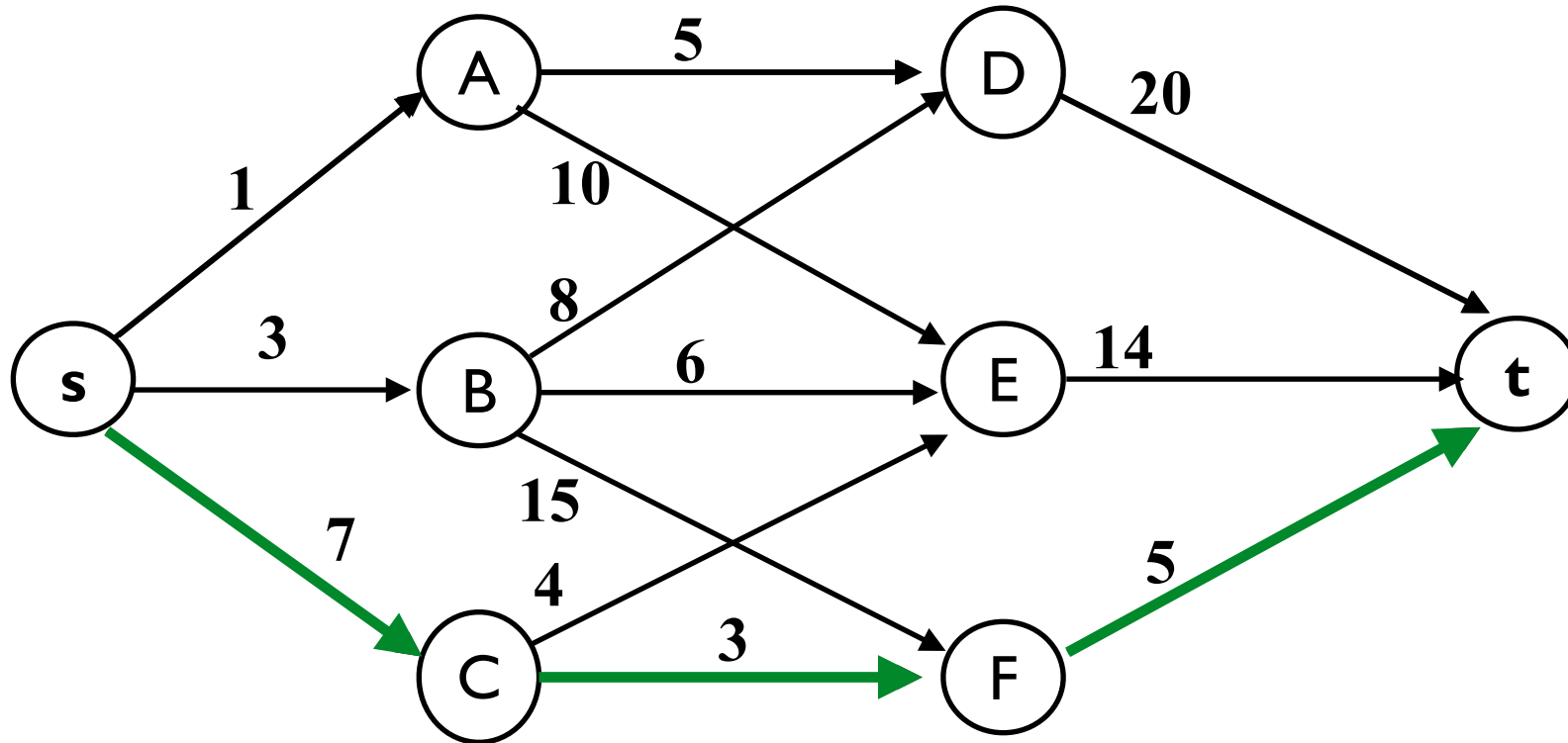
Simple Multi-Stage Graph

- Find shortest path from s to t



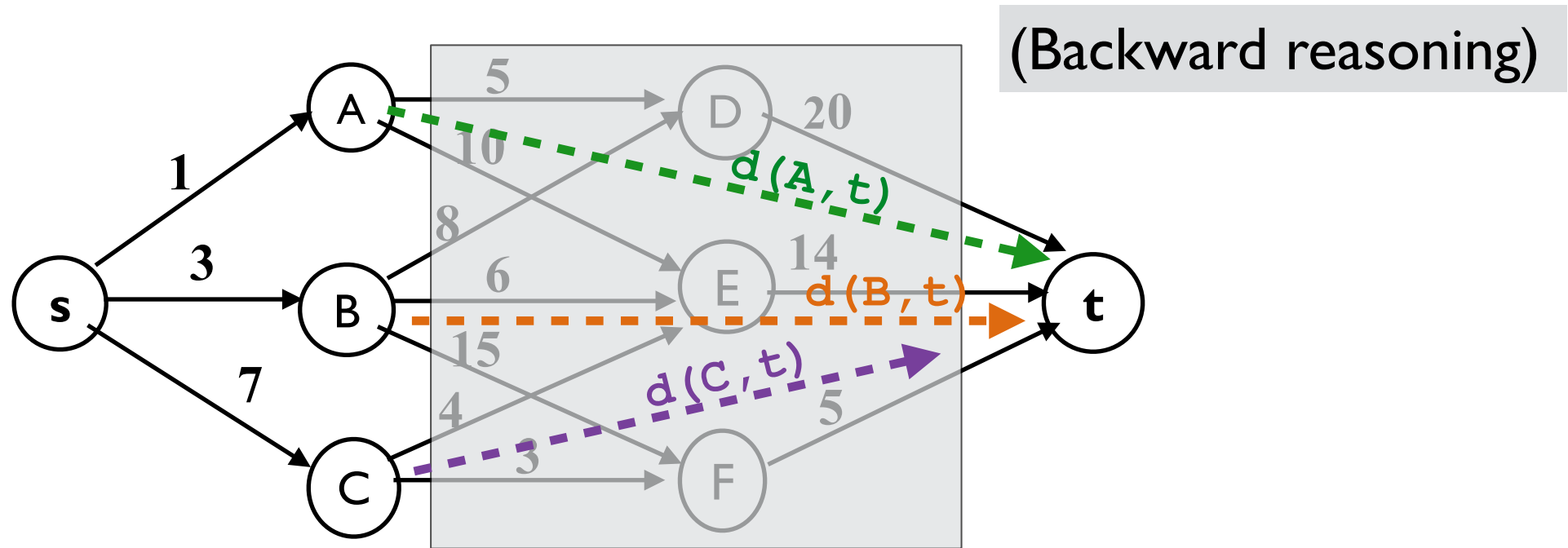
– Q: Does Greedy approach work?

Multistage Graph: Shortest Path



- Find shortest path from s to t
 - Greedy Approach :
 - $s \rightarrow A \rightarrow D \rightarrow t = 1 + 5 + 20 = 26$
 - Shortest path: $s \rightarrow C \rightarrow F \rightarrow t = 7 + 3 + 5 = 15$

Dynamic Programming: Forward Approach



$$d(s, t) = \min\{1 + d(A, t), 3 + d(B, t), 7 + d(C, t)\}$$

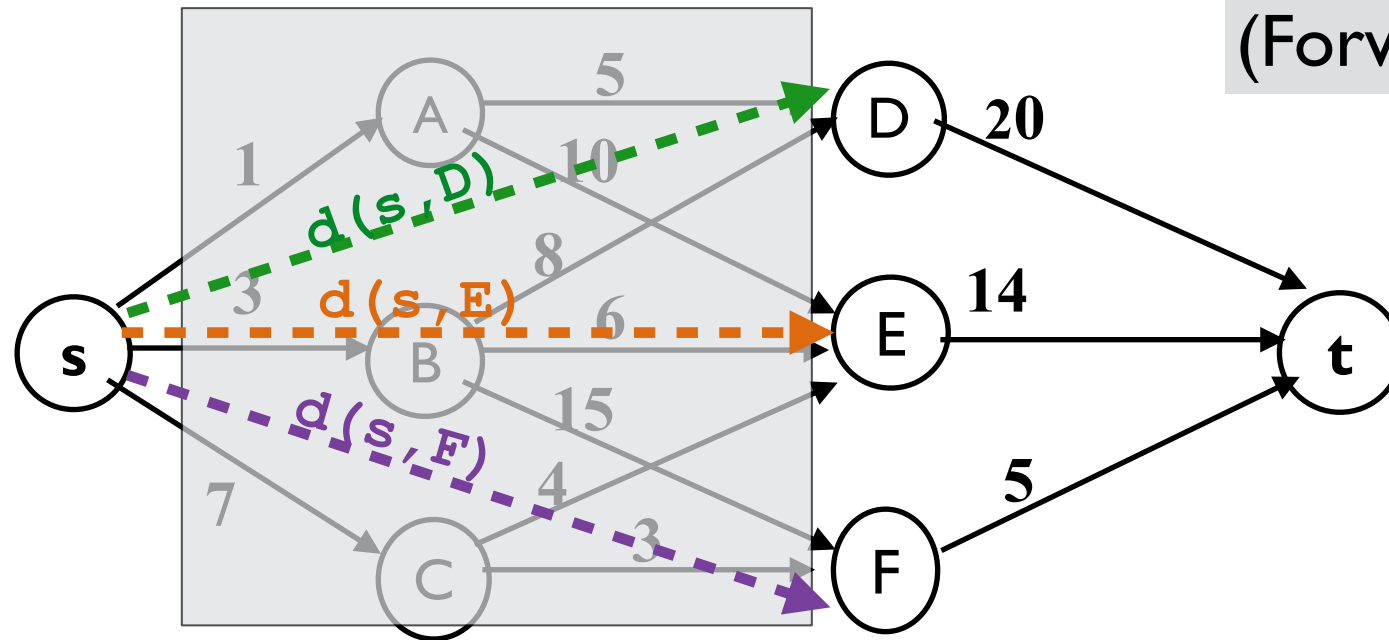
$$d(A, t) = \min\{5 + d(D, t), 10 + d(E, t)\} = \min(25, 24) = 24$$

$$\begin{aligned} d(B, t) &= \min(8 + d(D, t), 6 + d(E, t), 15 + d(F, t)) \\ &= \min\{8 + 20, 6 + 14, 15 + 5\} = 20 \end{aligned}$$

$$d(C, t) = \min\{4 + d(E, t), 3 + d(F, t)\} = \min\{18, 8\} = 8$$

$$d(s, t) = \min\{1 + 24, 3 + 20, 7 + 8\} = 15$$

Dynamic Programming: Backward Approach



(Forward reasoning)

$$d(s, t) = \min\{d(s, D) + 20, d(s, E) + 14, d(s, F) + 5\}$$

$$d(s, D) = \min\{d(s, A) + 5, d(s, B) + 8\} = \min(1 + 5, 3 + 8) = 6$$

$$d(s, E) = \min(d(s, A) + 10, d(s, B) + 6, d(s, C) + 4) \\ = \min\{1 + 10, 3 + 6, 7 + 4\} = 9$$

$$d(s, F) = \min\{d(s, B) + 15, d(s, C) + 3\} = \min\{3 + 15, 7 + 3\} = 10$$

$$d(s, t) = \min\{6 + 20, 9 + 14, 10 + 5\} = 15$$

Dynamic Programming: Applications

- Resource allocation problem
- Consider the following scenario:
 - A team of 3 students are asked to play 4 games.
 - Table Tennis, Chess, Badminton, Carrom
 - A student can choose to play none, some or all 4.
 - At a time, only one student can play a game.
 - First P_1 , then P_2 , and then P_3 (in that order)
 - However, no game is to be played by 2 students
 - All the 4 games need to be played.
 - Depending upon games played by a students, different points are awarded as shown next

Resource (Assignment) Allocation

- Award points for games played
 - e.g. P2 plays 3 games, get a total of 8 points
 - Thus, column values are non-decreasing

Student → Games ↓	P1	P2	P3
1 game	2	4	5
2 games	5	7	5
3 games	7	8	6
4 games	8	10	6

- Q: How to allocate games among team members so as to get maximum award points

Resource (Assignment) Allocation

- Possible allocations...
- P_1 : 0Gs:
 - P_2 :4Gs, P_3 :0G:
 - Points: $0+10+0=10$
 - P_2 :3Gs, P_3 :1G,
 - Points: $0+8+5=13$
 - P_2 :2Gs, P_3 :2Gs,
 - Points: $0+7+5=12$
 - P_2 :1G, P_3 :3Gs,
 - Points: $0+4+6=10$
 - P_2 :0G, P_3 :4Gs,
 - Points: $0+0+6=6$

$P \rightarrow$ $G \downarrow$	P1	P2	P3
1	2	4	5
2	5	7	5
3	7	8	6
4	8	10	6

Resource (Assignment) Allocation

- Possible allocations...
- $P_1: 1G$:
 - $P_2: 3G, P_3: 0G$,
 - Points: $2+8+0=10$
 - $P_2: 2G, P_3: 1Gs$,
 - Points: $2+7+5=14$
 - $P_2: 1G, P_3: 2Gs$,
 - Points: $2+4+5=11$
 - $P_2: 0G, P_3: 3Gs$,
 - Points: $2+0+6=8$

$P \rightarrow$ $G \downarrow$	P1	P2	P3
1	2	4	5
2	5	7	5
3	7	8	6
4	8	10	6

Resource (Assignment) Allocation

- Possible allocations...
- P_1 : 2Gs.
 - P_2 :2G, P_3 :0G:
 - Points: $5+7+0=12$
 - P_2 :1G, P_3 :1G,
 - Points: $5+4+5=14$
 - P_2 :0G, P_3 :2Gs,
 - Points: $5+0+5=10$

$P \rightarrow$ $G \downarrow$	P1	P2	P3
1	2	4	5
2	5	7	5
3	7	8	6
4	8	10	6

Resource (Assignment) Allocation

- Possible allocations
- $P_1: 3Gs$
 - $P_2: 1G, P_3: 0G$:
 - Points = $7 + 4 + 0 = 11$
 - $P_2: 0G, P_3: 1G$:
 - Points = $7 + 0 + 5 = 12$
- $P_1: 4Gs$:
 - $P_2: 0G, P_3: 0G$
 - Points = 8

$P \rightarrow$ $G \downarrow$	P1	P2	P3
1	2	4	5
2	5	7	5
3	7	8	6
4	8	10	6

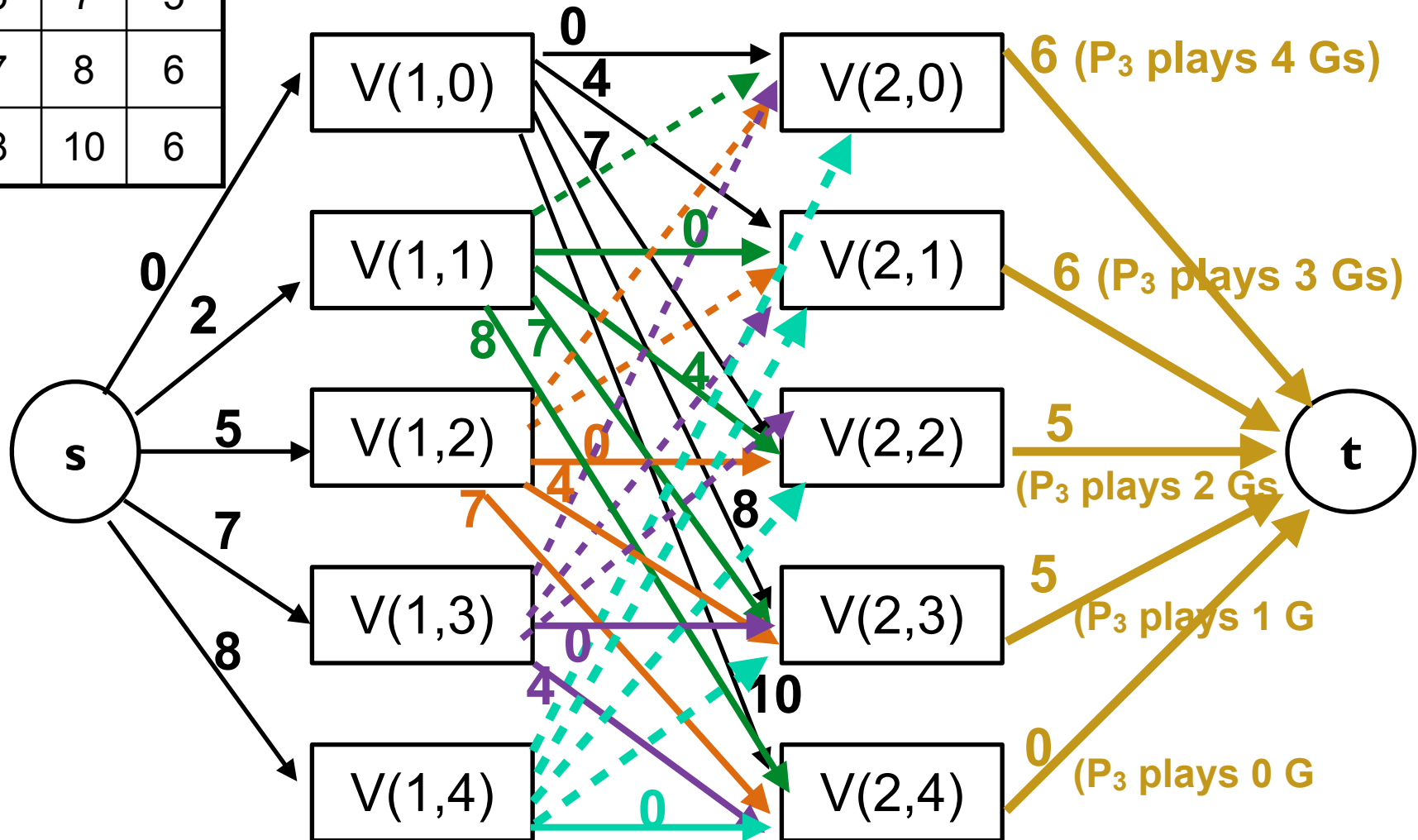
Resource (Assignment) Allocation

- Construction of Multistage graph
- The graph has 4 stages
 - Stage 1: Start
 - Stage 2: P_1 plays some games
 - Stage 3: P_2 - plays some of remaining games
 - Stage 4: P_3 - all the remaining games
 - The end stage: all games are played
- From each stage to next stage
 - Draw edge with allowed possibilities
- Each stage (except start, end) has 5 vertices
 - $V(i, j)$: Person P_i , j = total num of games played.
 - $1 \leq i < 3$; and $0 \leq j \leq 4$
- Start, and end stage has one vertex each
 - start stage P_1 plays; end stage: all 4 games are played
 - Stage 1: P_2 plays; Stage 2: P_3 plays

$P \rightarrow$ $G \downarrow$	P1	P2	P3
1	2	4	5
2	5	7	5
3	7	8	6
4	8	10	6

Multistage Graph

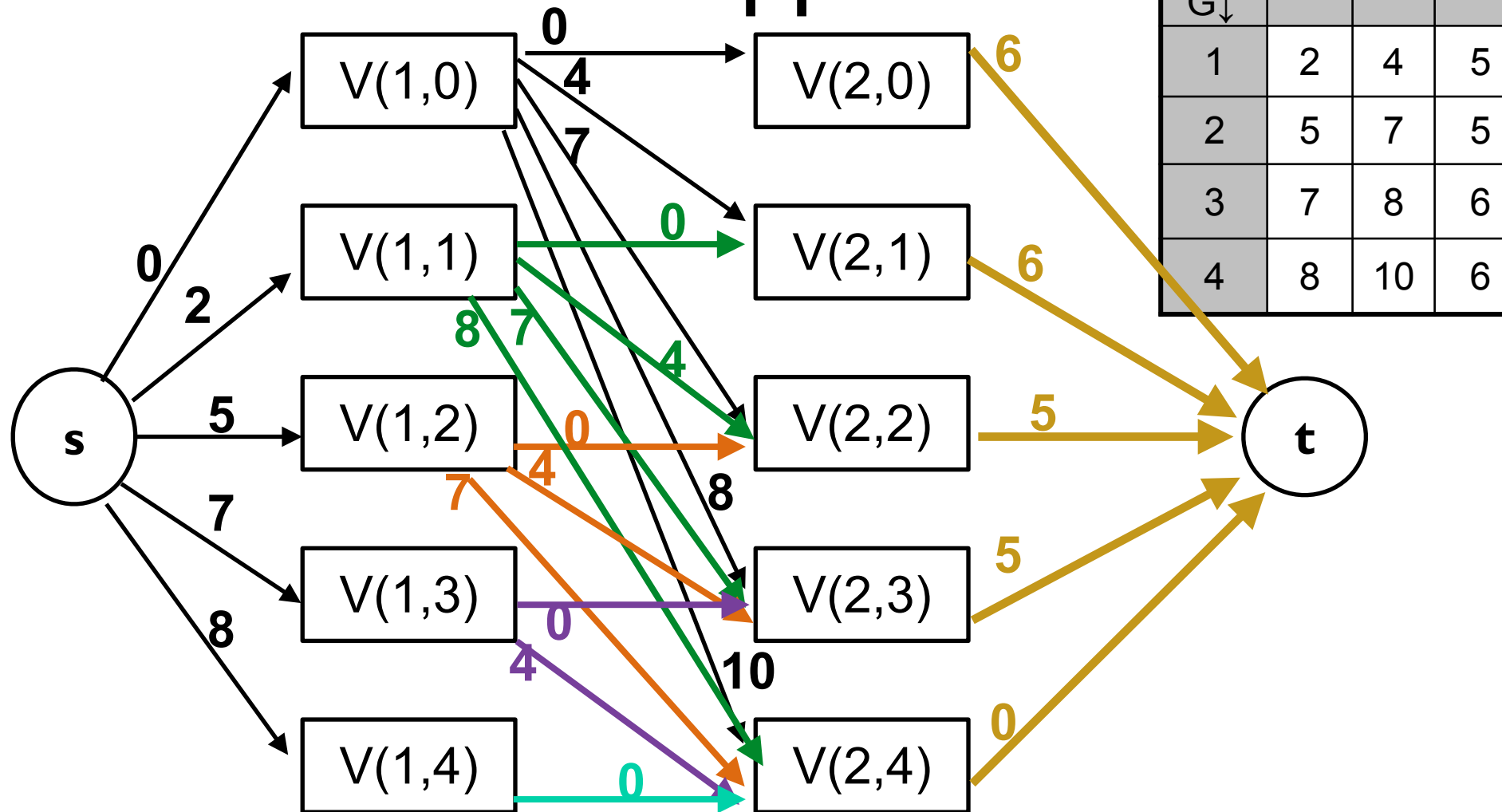
$P \rightarrow$ $G \downarrow$	P1	P2	P3
1	2	4	5
2	5	7	5
3	7	8	6
4	8	10	6



Q: Find max marks using DP Forward approach?

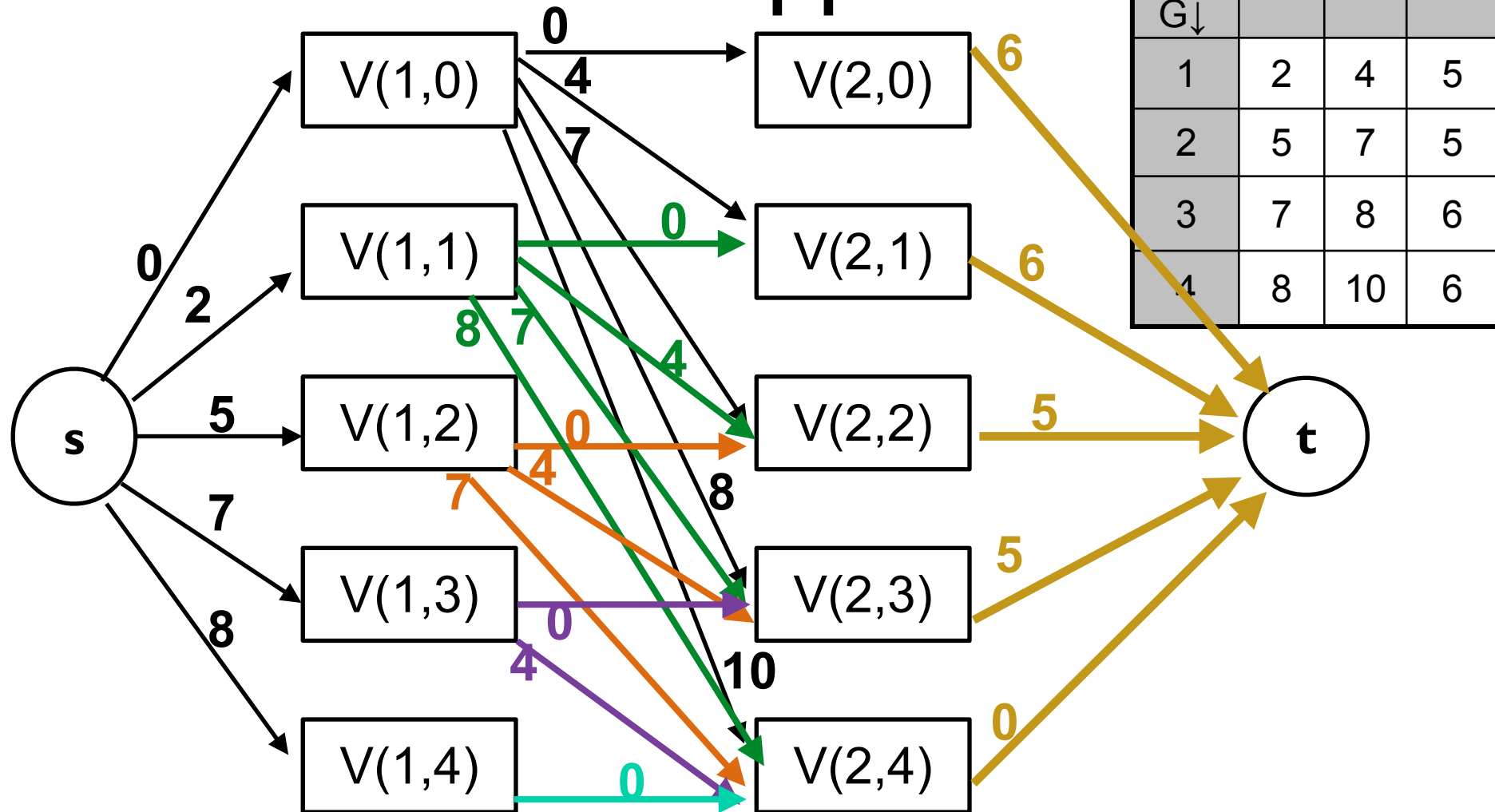
Q: Find max marks using DP Backward approach?

Forward Approach



Maximum of
 $0 + d(V(1,0), t)$, $2 + d(V(1,1), t)$, $5 + d(V(1,2), t)$, $7 + d(V(1,3), t)$, $8 + d(V(1,4), t)$
 $= 0 + 13$, $2 + 12$, $5 + 9$, $7 + 5$, $8 + 0 = 13$, 14 , 14 , 12 , 8
 $= 14$

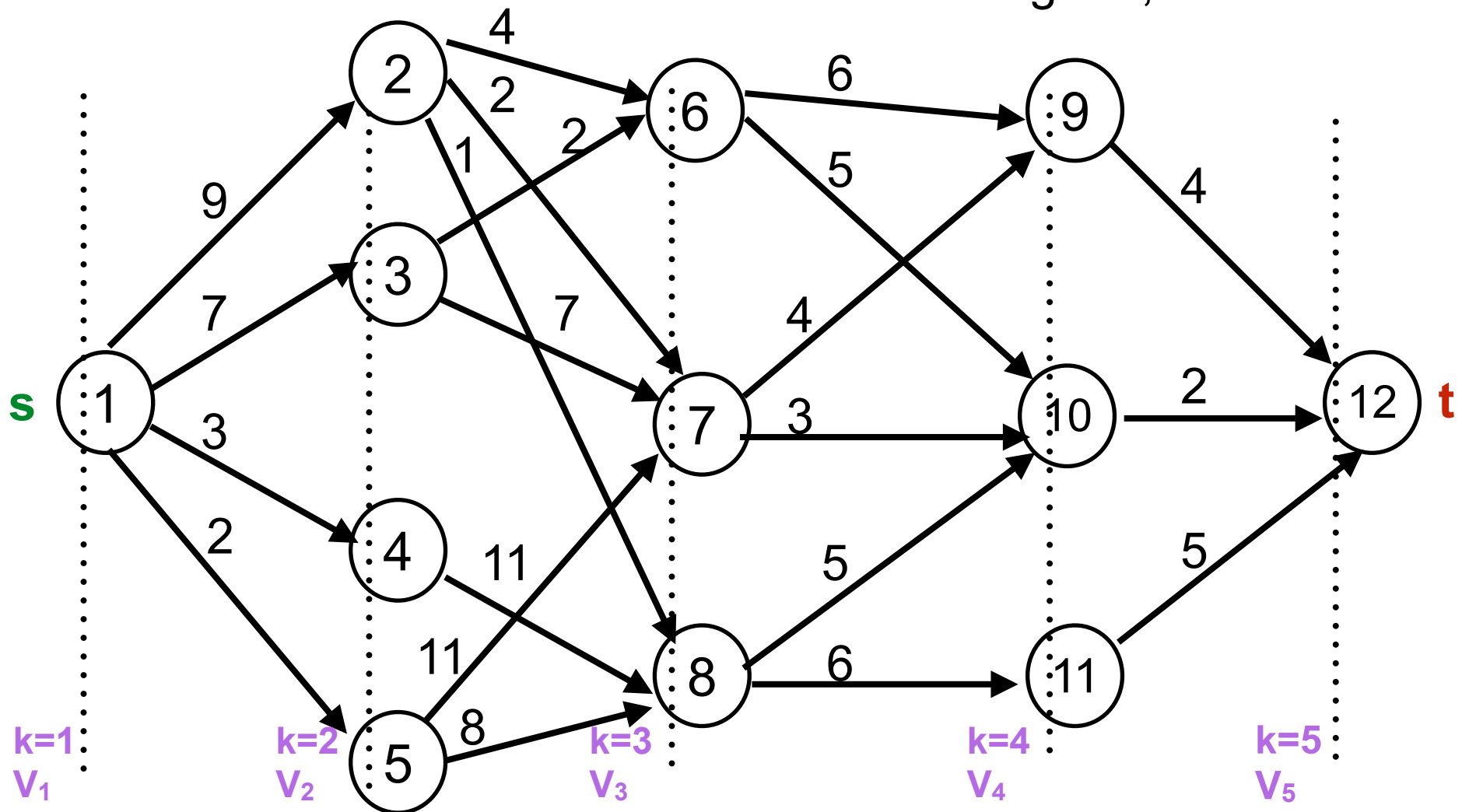
Backward Approach



Maximum of
 $d(s, V(2,0)) + 6$, $d(s, V(2,1)) + 6$, $d(s, V(2,2)) + 5$, $d(s, V(2,3)) + 5$, $d(s, V(2,4)) + 0$
 $= 0 + 6$, $4 + 6$, $7 + 5$, $9 + 5$, $8 + 0 = 6, 10, 12, 14, 8$
 $= 14$

Forward Approach

Fig 5.2, T2: Horowitz...



5 stages, 12 vertices, vertices are ordered from $s=1$ to $t=12$

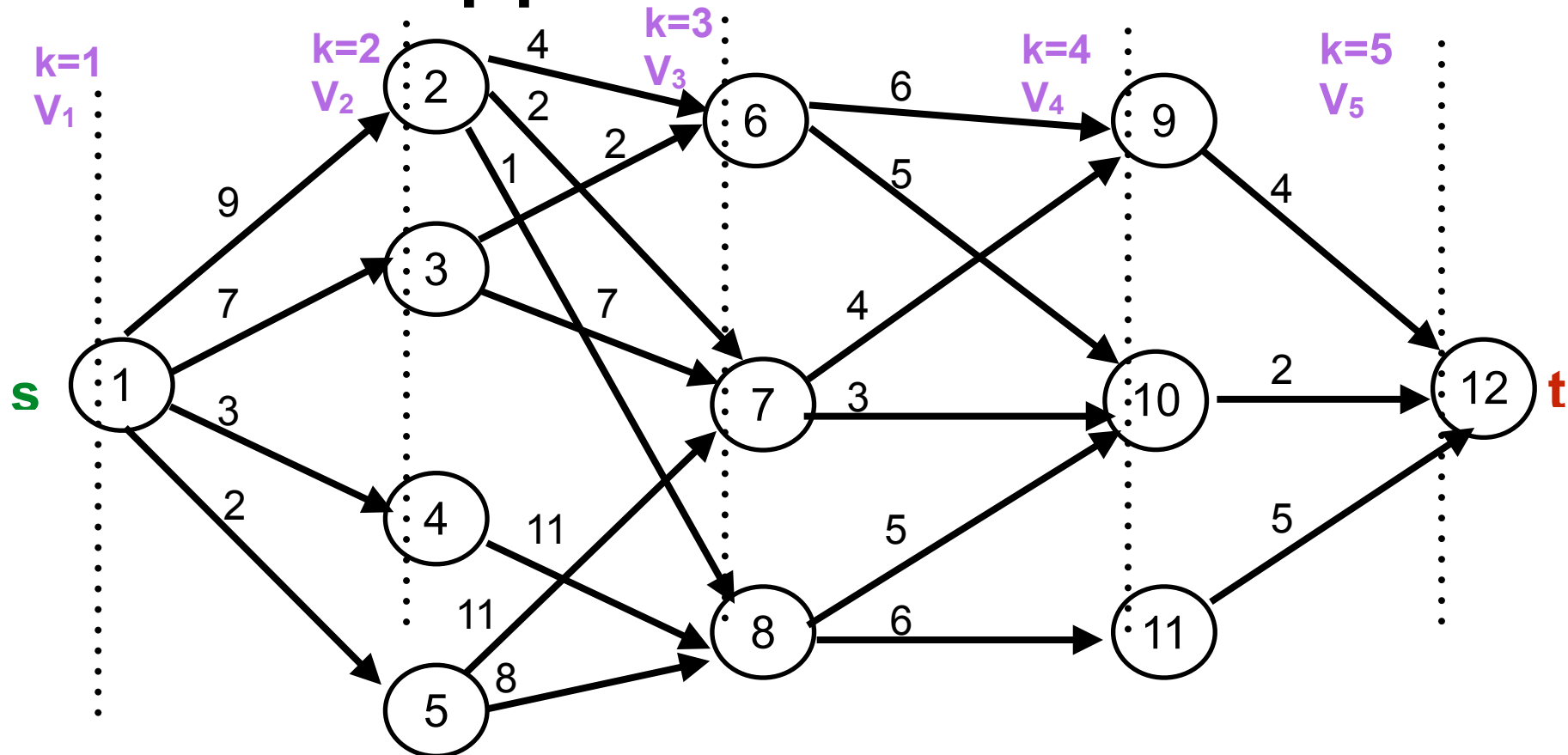
$p(i, j)$: Min cost path from vertex j in stage V_i

$\text{cost}(i, j)$: Cost of Min cost path $p(i, j)$, or $\text{cost}(j)$

$c(j, m)$: Cost of edge (j, m) provided $(j, m) \in E$

Forward Approach

Fig 5.2, T2: Horowitz...

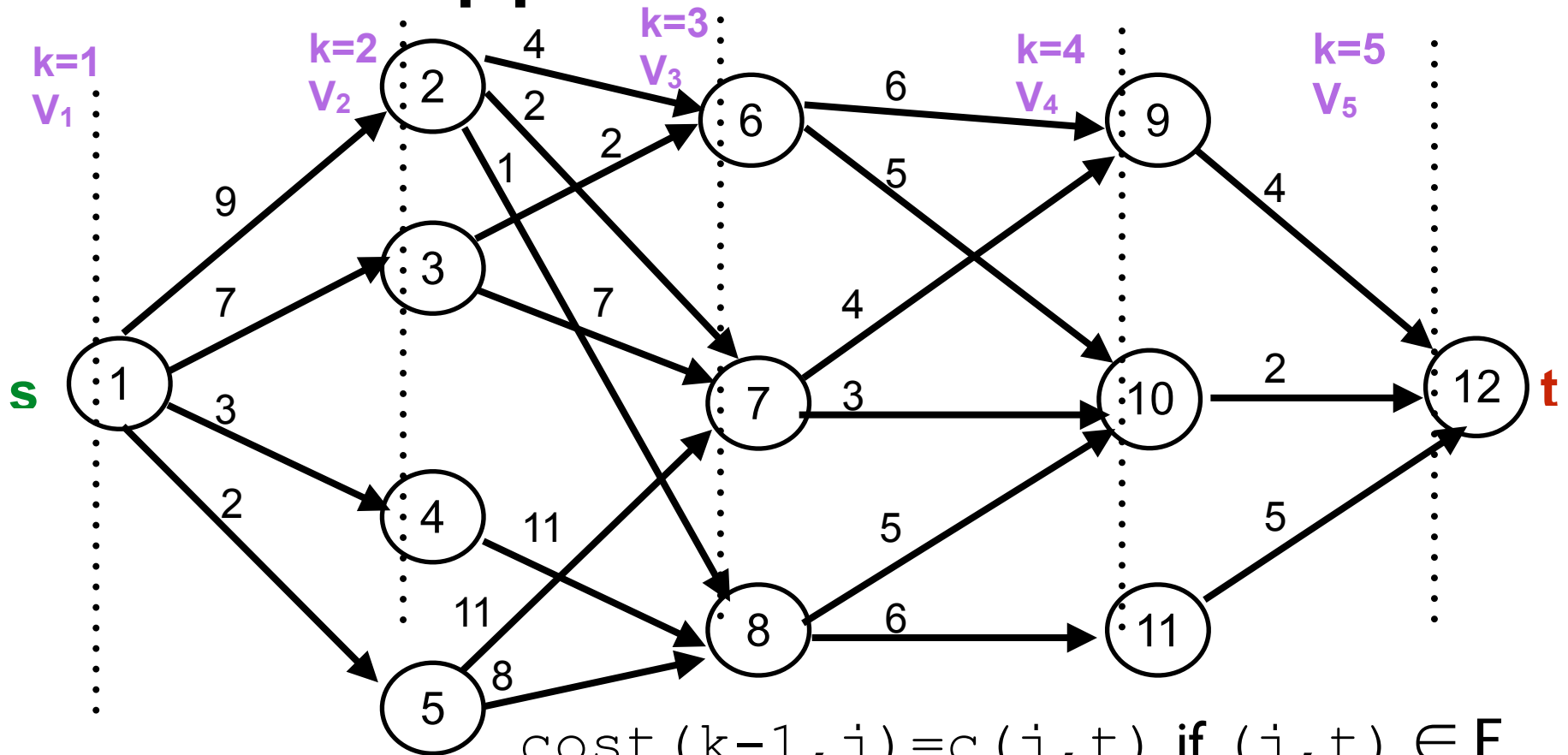


- DP solⁿ for k-stage problem is obtained by result of $k-2$ decisions
 - Stage V_2 to V_{k-1}
- i^{th} decision: which vertex in stage V_{i+1} ($1 \leq i \leq k-2$) is on the path
- Forward approach gives the solution

$$\text{cost}(i, j) = \min\{c(j, m) + \text{cost}(i+1, m) \mid m \in V_{i+1}, (j, m) \in E\}$$

Forward Approach

Fig 5.2, T2: Horowitz...



$\text{cost}(k-1, j) = c(j, t)$ if $(j, t) \in E$

$\text{cost}(k-1, j) = \infty$ if $(j, t) \notin E$

Computing $\text{cost}(1, s)$ requires

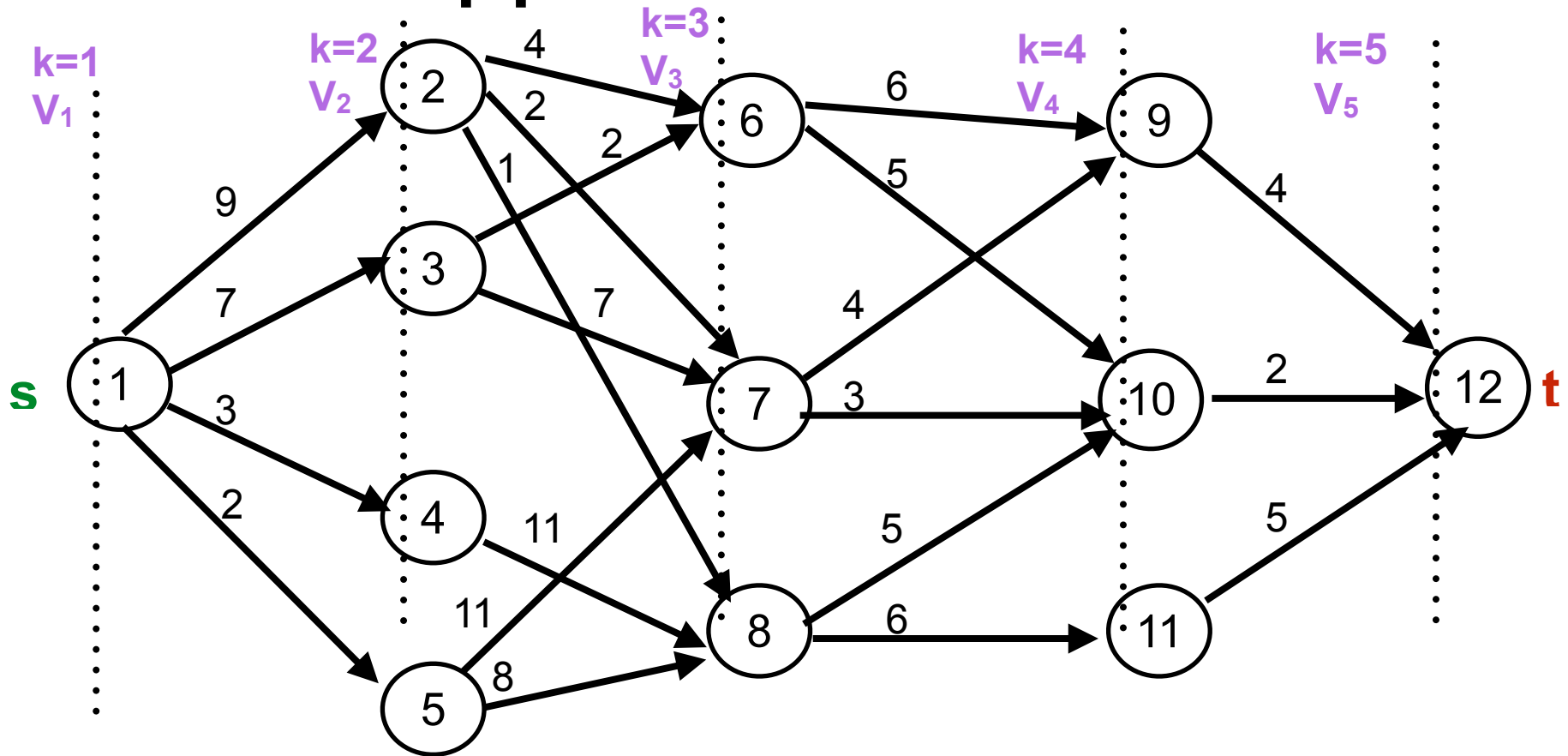
computing first $\text{cost}(k-2, j) \forall j \in V_{k-2}$

then computing $\text{cost}(k-3, j) \forall j \in V_{k-3}$

and so on, and finally $\text{cost}(1, s)$

Forward Approach

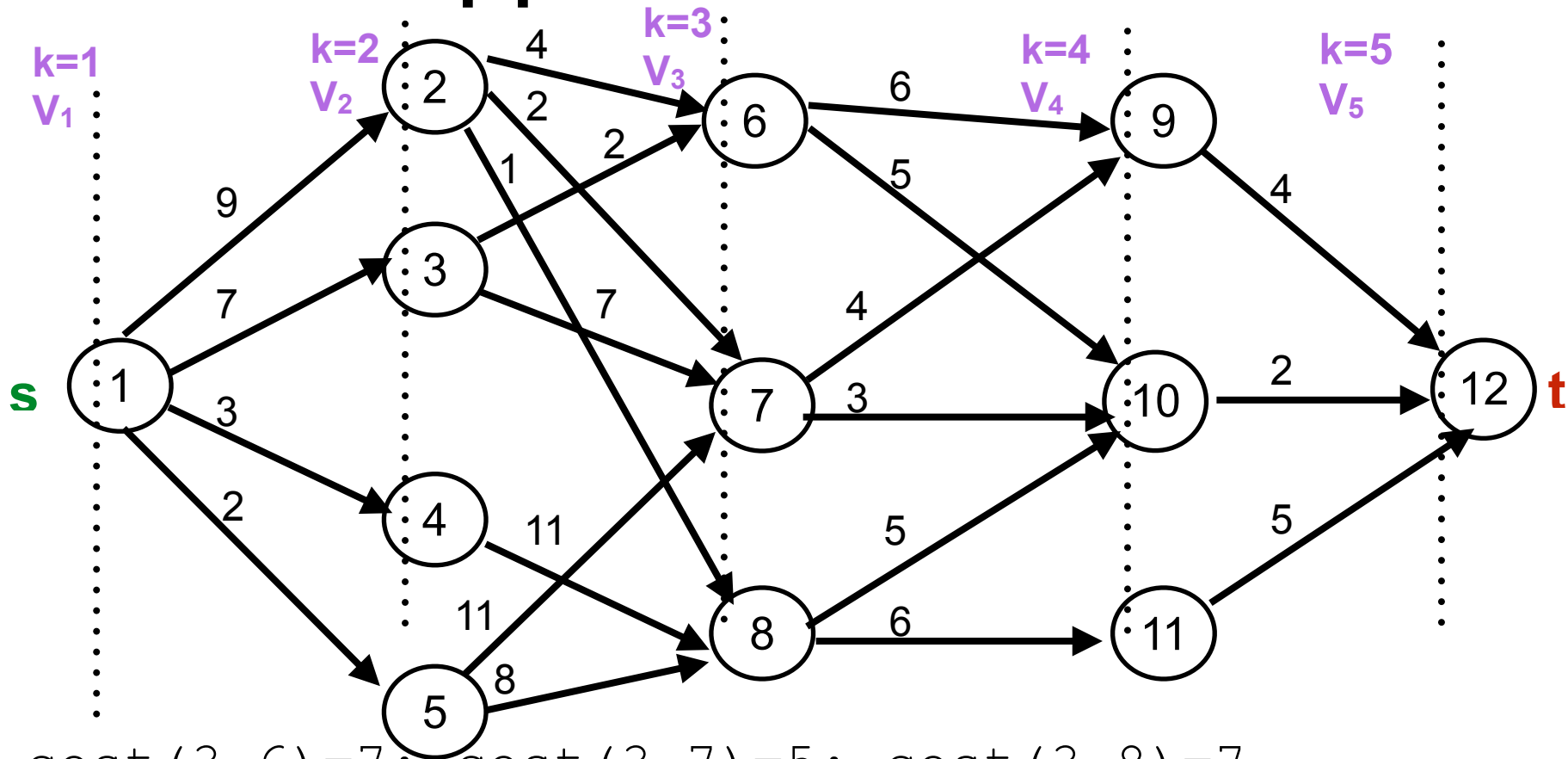
Fig 5.2, T2: Horowitz...



$$\begin{aligned} \text{cost}(3, 6) &= \min\{6 + \text{cost}(4, 9), 5 + \text{cost}(5, 10)\} = 7 \\ \text{cost}(3, 7) &= \min\{4 + \text{cost}(4, 9), 3 + \text{cost}(5, 10)\} = 5 \\ \text{cost}(3, 8) &= \min\{6 + \text{cost}(4, 10), 6 + \text{cost}(5, 11)\} = 7 \end{aligned}$$

Forward Approach

Fig 5.2, T2: Horowitz...



$\text{cost}(3, 6) = 7$; $\text{cost}(3, 7) = 5$; $\text{cost}(3, 8) = 7$

$\text{cost}(2, 2) = \min\{4 + \text{cost}(3, 6), 2 + \text{cost}(3, 7), 1 + \text{cost}(3, 8)\} = 7$

$\text{cost}(2, 3) = \min\{2 + \text{cost}(3, 6), 7 + \text{cost}(3, 7)\} = 9$

$\text{cost}(2, 4) = \min\{11 + \text{cost}(3, 8)\} = 18$

$\text{cost}(2, 5) = \min\{11 + \text{cost}(3, 7), 8 + \text{cost}(3, 8)\} = 15$

$\text{cost}(1, 1) = \min\{9 + \text{cost}(2, 2), 7 + \text{cost}(2, 3), 3 + \text{cost}(2, 4), 2 + \text{cost}(2, 5)\} = 16$

DP Forward approach: Algo

```
Algo: FGraph (Graph G, int k, int p[])  
// i/p k-stage graph n vertices indexed in order of stages.  
// edge  $c(i, j)$  is cost of edge  $v_i \rightarrow v_j$   
//  $p[i]$  is a node on stage  $i$  in min cost path  
//  $cost[i]$  is minimum from node  $i$   
//  $d[j]$  indicates successor of node  $j$  in min cost path  
float cost[maxsize]; int d[maxsize], r;  
cost[n]=0.0  
for  $j=n-1$  to 1 // compute cost[j]  
    Let  $r$  be a vertex such that  $v_j \rightarrow v_r$  is an edge, and  
     $c(j, r) + cost[r]$  is minimum  
     $cost[j] = c[j, r) + cost(r)$   
     $d[j]=r$   
 $p[1]=1$ ;  $p[k]=n$ ;  
for  $j=2$  to  $k-1$   
     $p[j]=d[p[j-1]]$ 
```


DP Backward approach: Algo

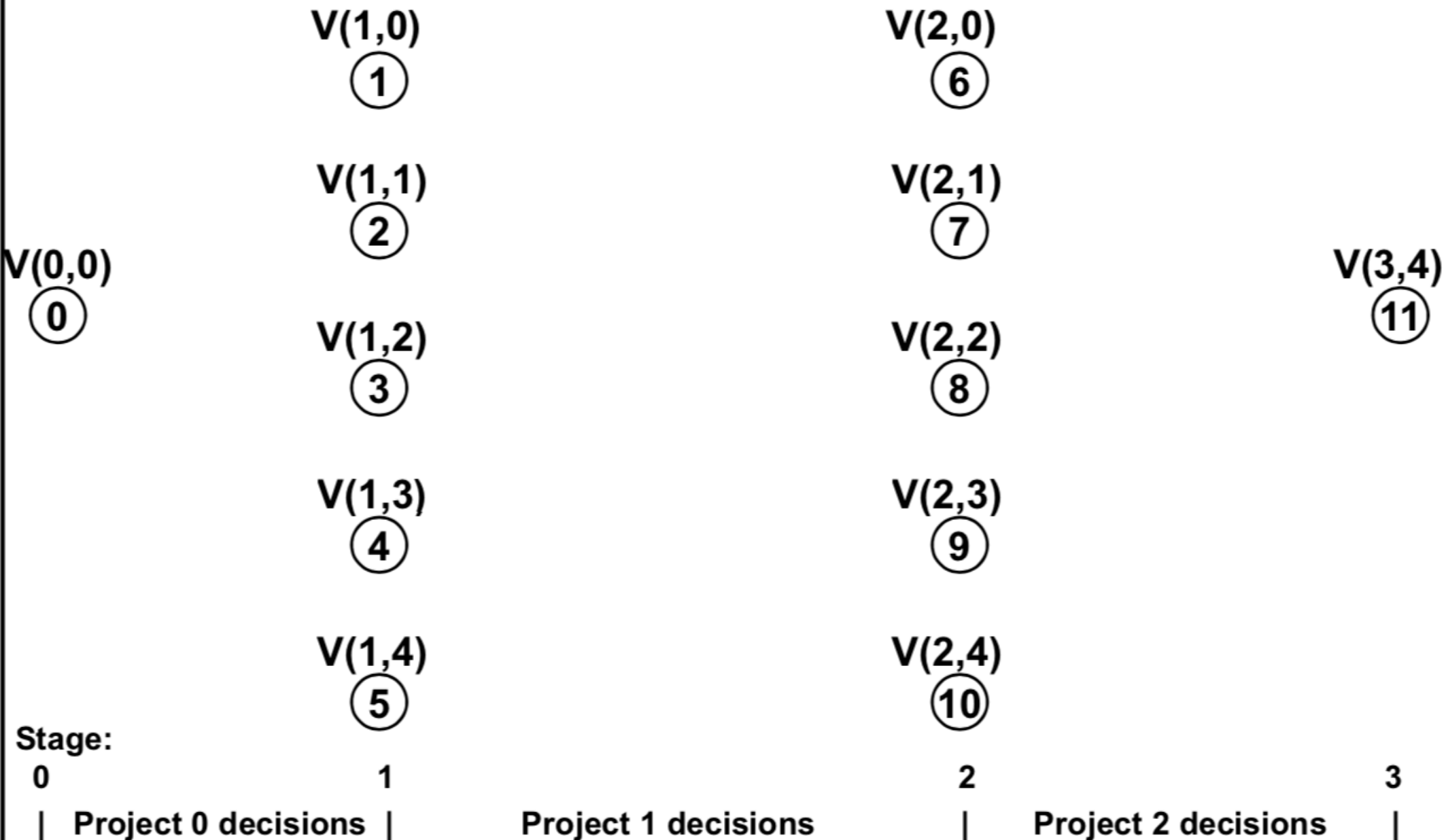
```
Algo: BGraph (Graph G, int k, int p[])  
// i/p k-stage graph n vertices indexed in order of stages.  
// edge c(i, j) is cost of edge  $v_i \rightarrow v_j$   
// p[1:k] is a minimum cost path  
float bcost[maxsize]; int d[maxsize], r;  
bcost[n]=0.0  
for j=2 to n // compute bcost[j]  
    Let r be a vertex such that  $v_r \rightarrow v_j$  is an edge, and  
    bcost[r]+c(r, j) is minimum  
    bcost[j] = bcost(r) + c[r, j)  
    d[j]=r  
p[1]=1; p[k]=n;  
for j=k-1 to 2  
    p[j]=d[p[j+1]]
```

Ex: Build Multistage graph

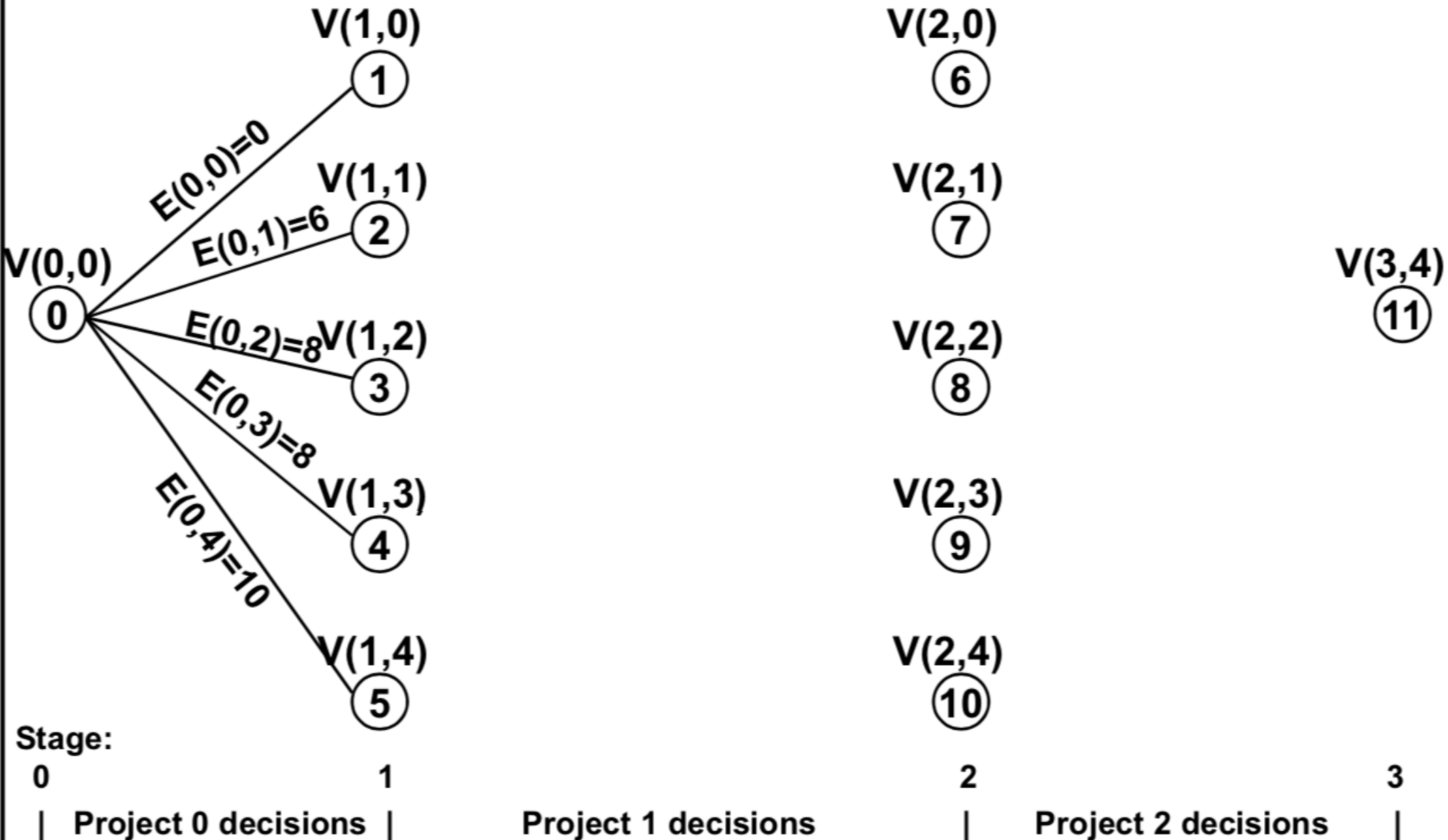
src: https://ocw.mit.edu/courses/civil-and-environmental-engineering/1-204-computer-algorithms-in-systems-engineering-spring-2010/lecture-notes/MIT1_204S10_lec13.pdf

Proj	0	1	2
Invest ment	Benefit	Benefit	Benefit
1	6	5	1
2	8	11	4
3	8	16	5
4	10	17	6

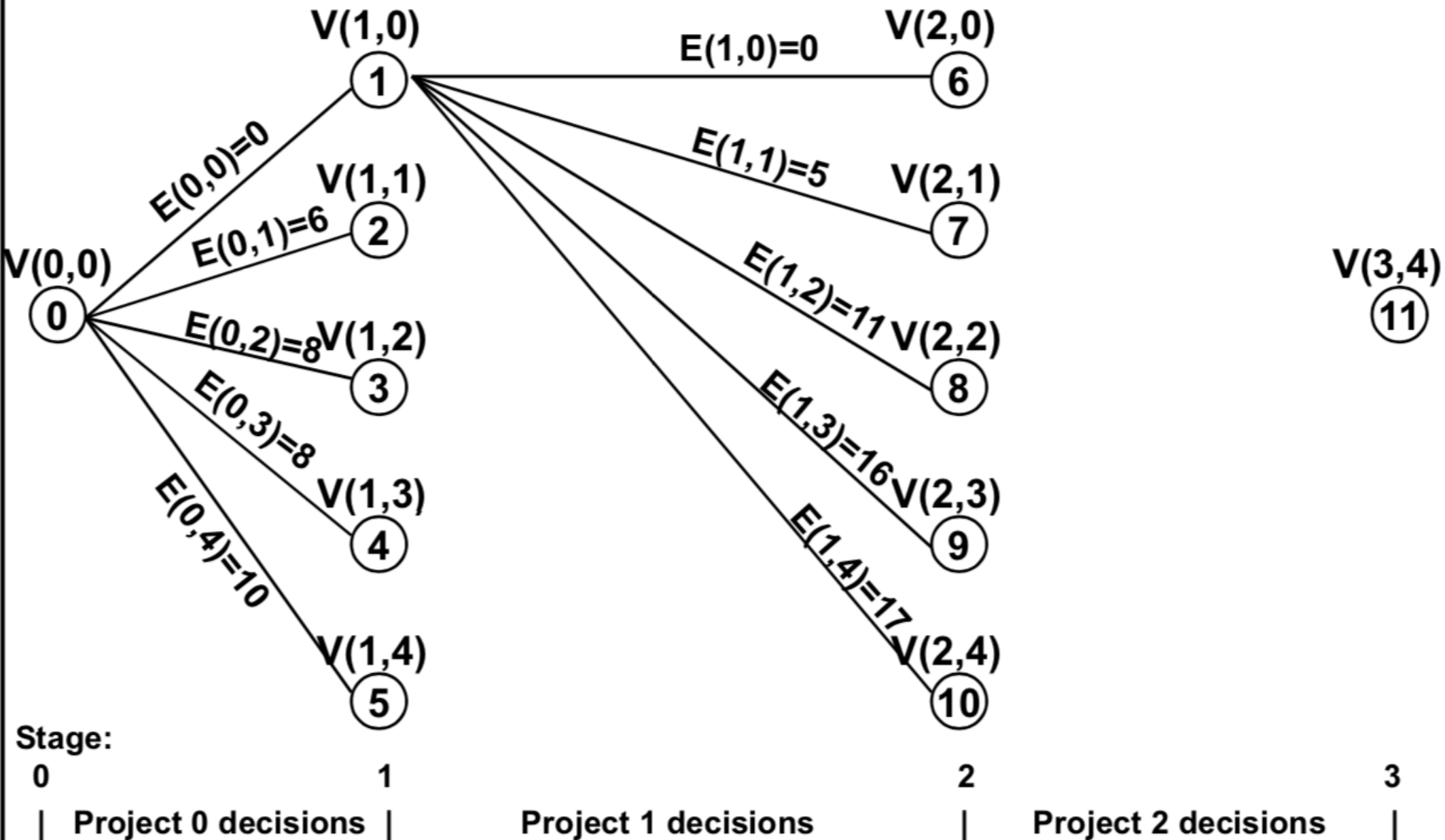
Dynamic programming graph: feasible



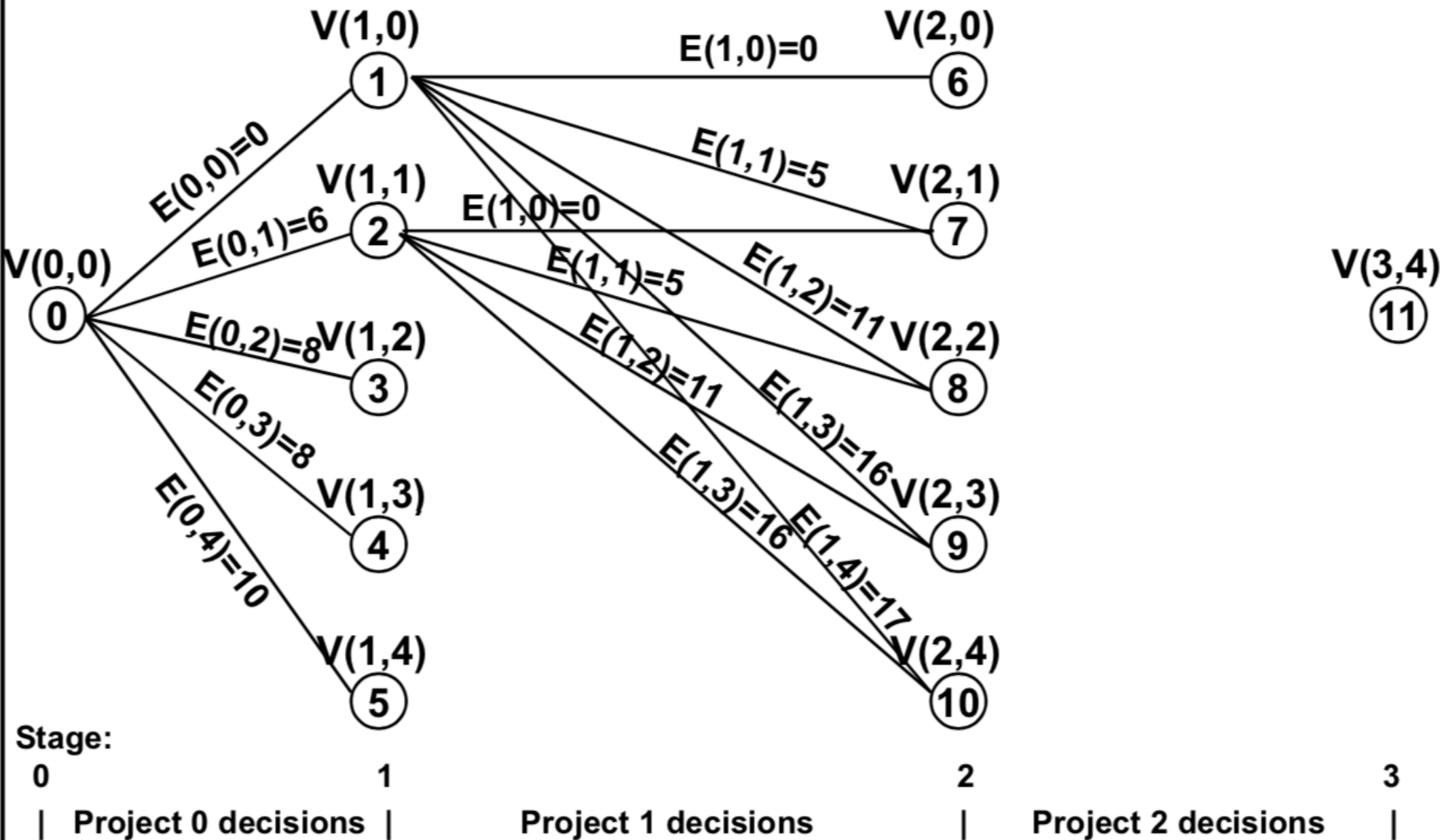
Dynamic programming graph: feasible



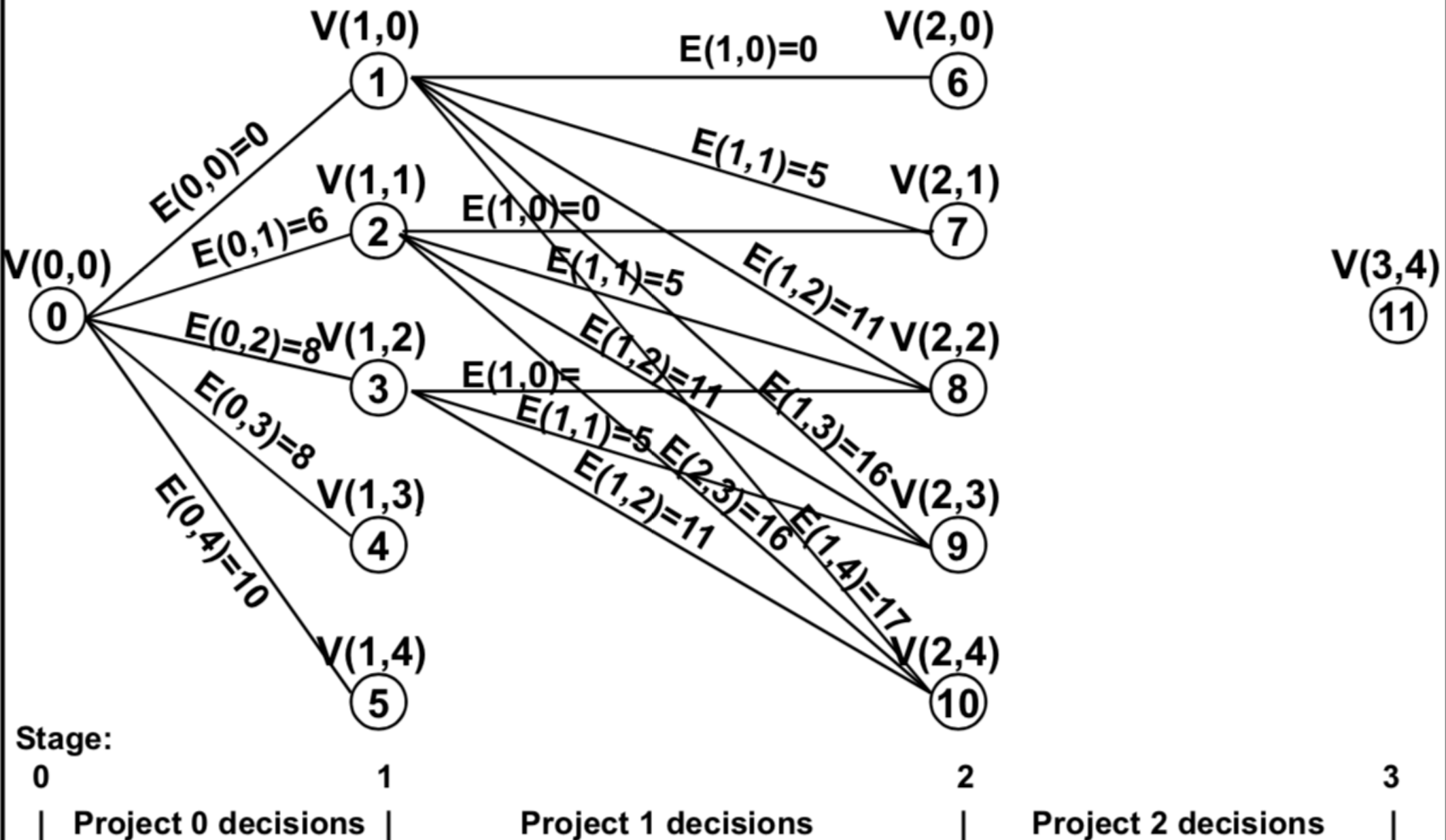
Dynamic programming graph: feasible



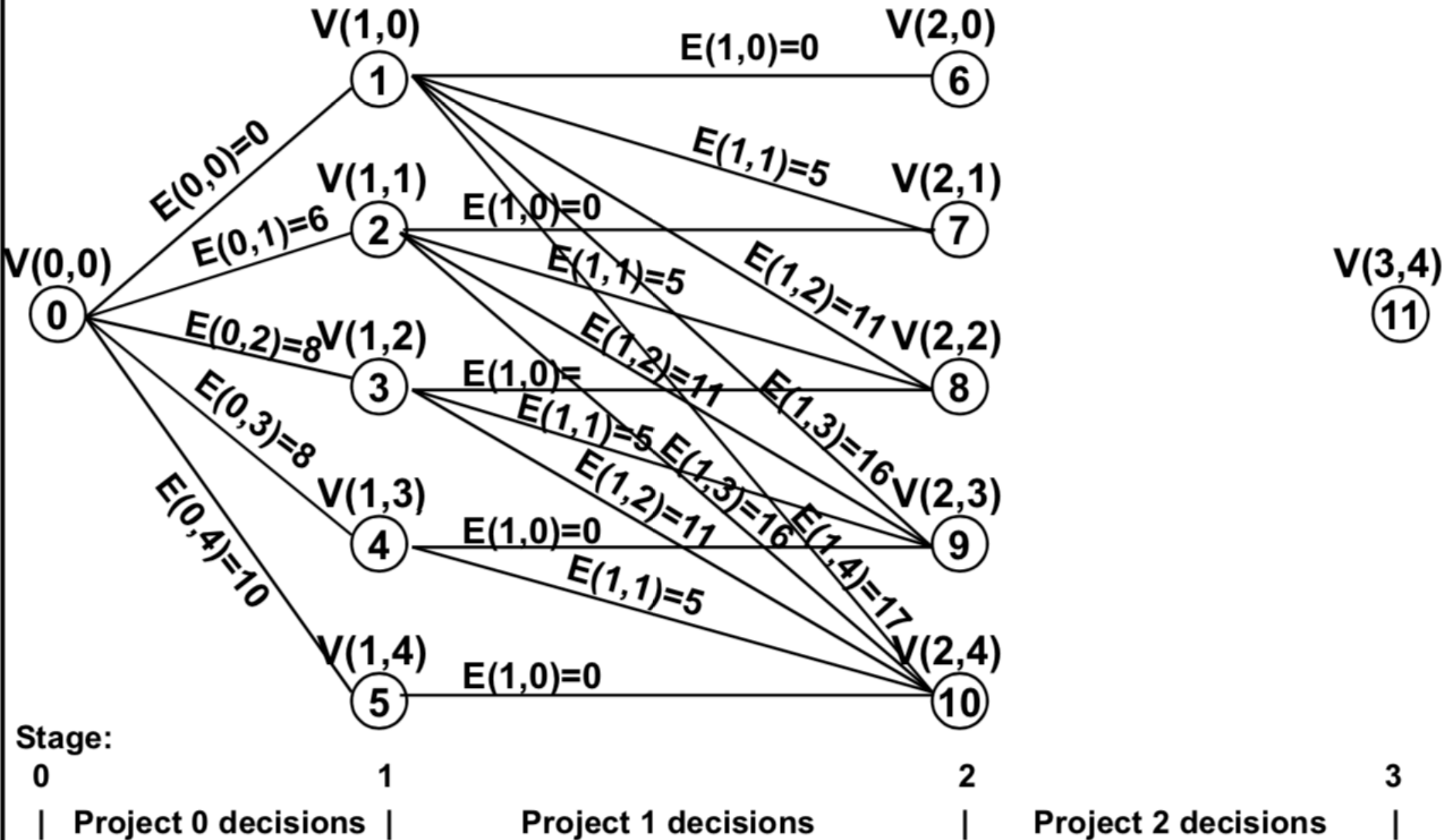
Dynamic programming graph: feasible



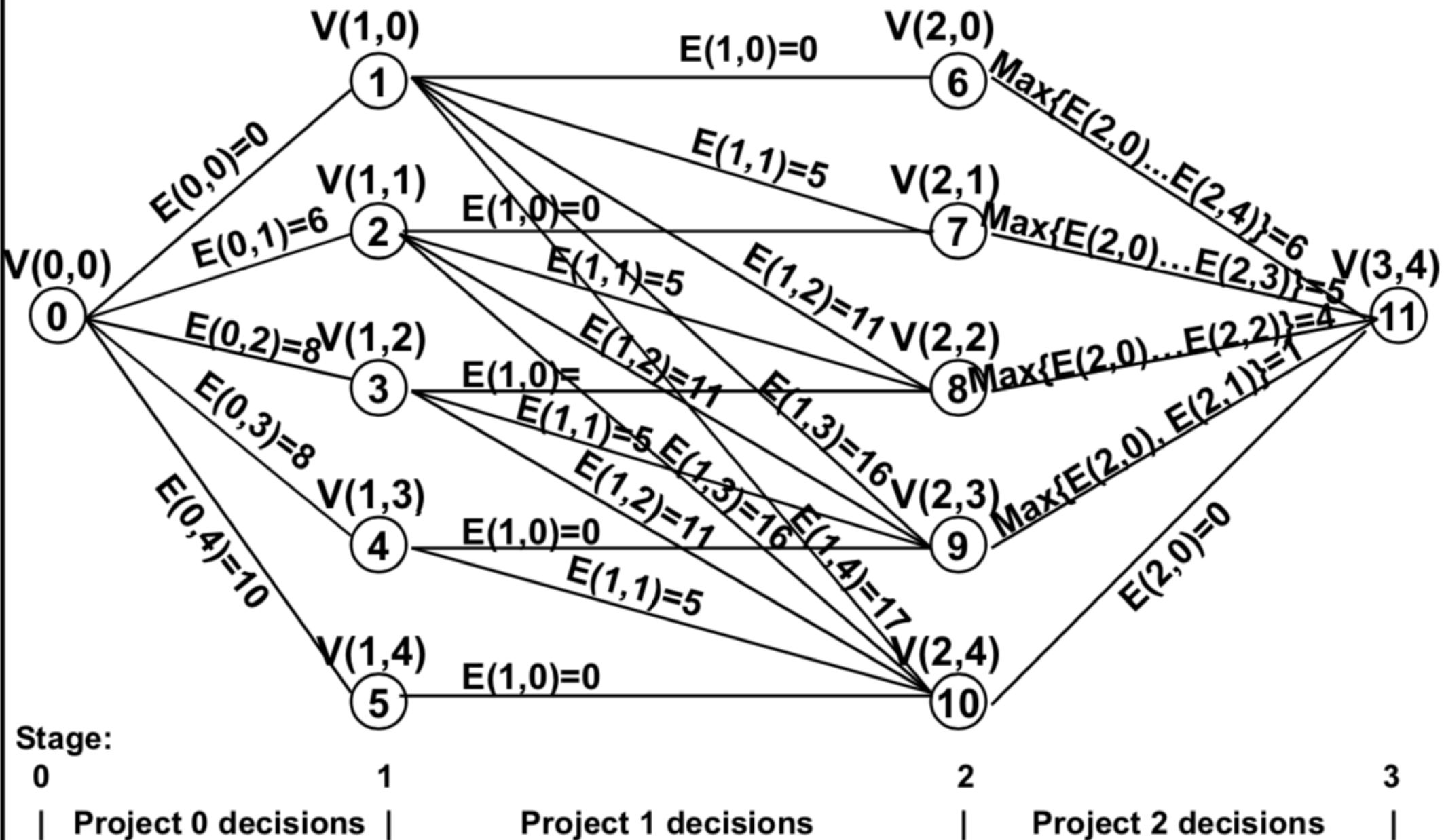
Dynamic programming graph: feasible



Dynamic programming graph: feasible

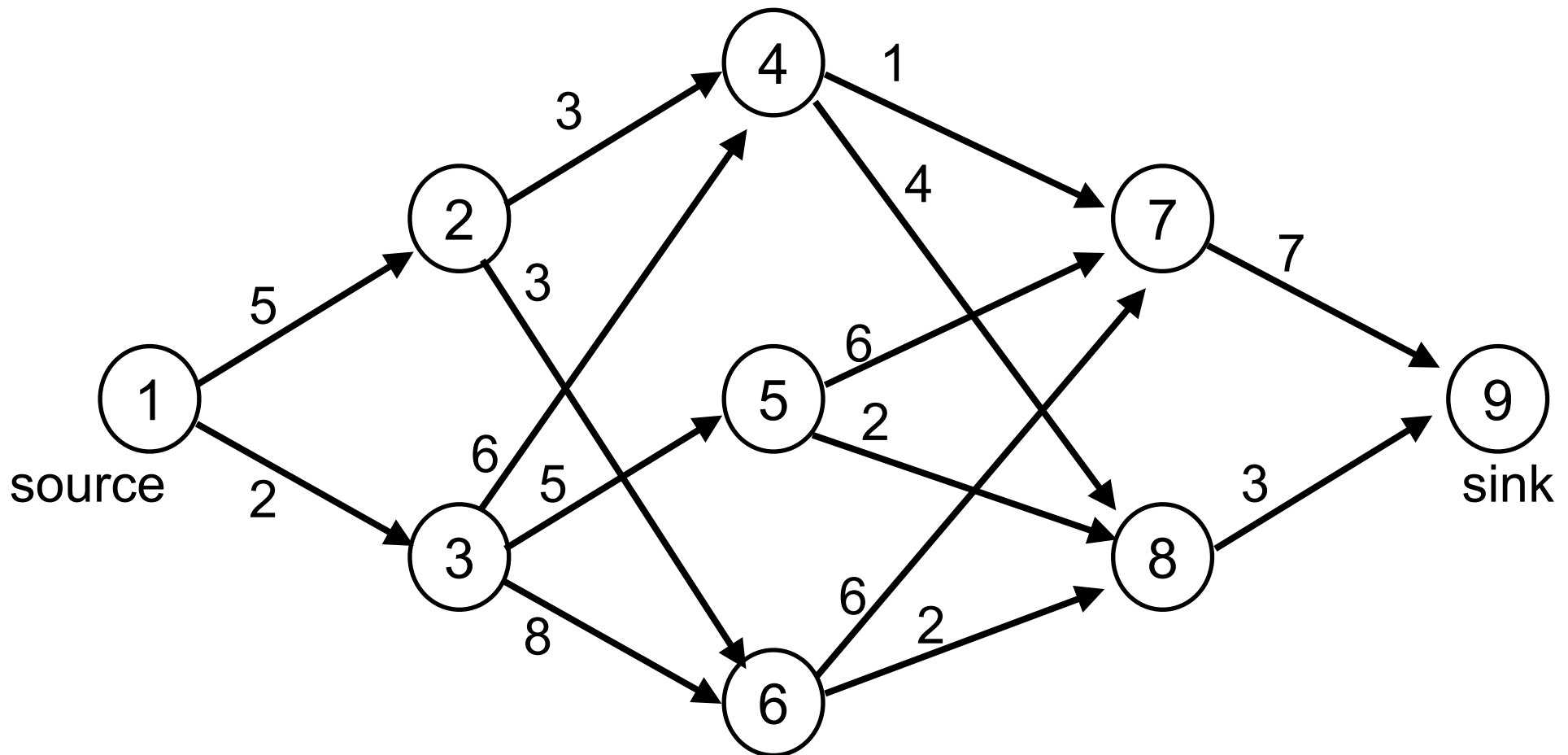


Dynamic programming graph: feasible



Ex 02: Find min cost path

- Using forward approach
- Using backward approach



Summary

- Multi stage graph
- Forward approach
- Backward approach