

**Course: Introduction to Graph Algorithms**

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**Lecture 13 Bellman Equation Part 4**

So this is a decreasing sequence of numbers and this can go up to minus infinity, however whatever is the graph whether it has a negative cycle or positive cycle it really does not matter what kind of graph it is. The delta sequence is always finite,  $\delta_0(v)$  is greater than or equal to  $\delta_1(v)$  is greater than or equal to  $\delta_{n-1}(v)$  and it stops here and after that all values are equal.

$$\alpha_0(v) \geq \alpha_1(v) \geq \dots$$

$$\alpha_0(v) \geq \dots \geq -\infty$$

That is because as we have seen already. the maximum number of edges in any path is just  $n-1$ . That is the reason why this will not extend any further. You will have only equal values, it will not descend beyond this point. So we write like this, equal to  $\delta_n(v)$ , equal to  $\delta_{n+1}(v)$ , and so on for all of them it is equal.

$$\begin{aligned} \delta_0(v) &\geq \delta_1(v) \geq \dots \geq \delta_{n-1}(v) \\ &= \delta_n(v) \\ &= \delta_{n+1}(v) \\ &\vdots \end{aligned}$$

How are alpha values and delta values are related? Our goal is the delta values, so we will see how alphas and deltas are related. Since every path is a walk, since every path is a walk, it is clear that  $P_k(v)$  is a subset of  $W_k(v)$ . A path that has got at most  $k$  edges is also a walk that has got at most  $k$  edges. Therefore, every element of  $P_k$  is an element of  $W_k$ ,  $W_k$  may have more elements. So, because of this, the bigger sets will have smaller minimum value right.  $\alpha_k(v)$  is less than or equal to  $\delta_k(v)$ , alright.

$$P_k(u) \subseteq W_k(u)$$

$$\alpha_k(u) \leq \delta_k(u).$$

So alpha and delta are related this way. There is another interesting fact, is always greater, if G has no negative cycle then alpha k(v) is equal to delta k(v).

$$\alpha_k(u) = \delta_k(u)$$

That is because, if a graph has no negative cycle, every shortest walk will indeed be a shortest path, if G has no negative cycles, every, and also we will well we will avoid 0 cycle in the sense 0 cycle it just can be simply removed without changing the values okay, every shortest walk is indeed a shortest path, okay. This can be easily proved by contradiction. If the shortest walk has a repetition or as a cycle that can be removed and the weight can be further reduced. Let us say s to v is a cycle, is a walk, I can remove this cycle of edges and still have a walk from s to v.



And that walk will have a smaller weight. That is because I am removing a cycle. I am assuming that G has no 0 cycle, no negative cycle, so cycle if there is any they are all positive, so I am reducing by a positive quantity, and that will be a contradiction to the minimality. So, if the shortest walk has a cycle, it can be reduced and then you can find a shorter walk and that is not possible. That is the reason why shortest walk cannot contain any cycles. That means it is indeed a path. No repetition of vertices or edges therefore, that is the reason why we have this equality, okay. This is very interesting alpha k(v) equal to delta k(v). Now we will take a closer look at the definition of alpha k for k equal to 0 and v equal to s and those edge cases; are to be sorted out. Okay, so, what can we say about alpha k(s)?

$$\alpha_k(s) ?$$

What do you mean by that?  $s$  to  $s$  there is a walk, that means it is a closed walk, okay, this is a closed walk. And what can we say about  $\delta_k(s)$  this is a cycle close to path, this is, okay.

$$\delta_k(s) - \text{cycle}$$

Now the case when  $k$  is 0, what can we say about  $\delta_0(s)$ ?

$$\delta_0(s) ?$$

How do we define this less than or equal to 0 edges no edges from  $S$  to  $S$  okay without any edges it is possible for you to go just do not move out of  $S$  right and therefore since there is a possibility except that you are not using any edge or anything okay. So the weight is assumed to be 0  $\delta_0(s)$  is 0 same for  $\alpha_0(s)$  is set to 0.

$$\delta_0(s) = 0$$

$$\alpha_0(s) = 0$$

What can we say about  $\alpha_k(v)$  when  $k$  equal to 0 that is  $\alpha_0(v)$ .

$$\alpha_k(v), k=0 ?$$

So from  $s$  to  $v$  you have to go with 0 edges it is not possible. a walk does not exist with 0 edges right there is no way with 0 edges you can go from  $s$  to  $v$  where  $v$  is not equal to  $s$  right. So  $\alpha_0(v)$  equal to infinity since a walk from  $s$  to  $v$ .

$$\alpha_0(v) = \infty$$

$v$  not equal to  $s$  it is some other how will you go with 0 edges there is no way therefore such a path does not exist since a walk from with 0 edges does not exist, whenever something does not exist path or walk we said to be similarly  $\delta_0(v)$  equal to infinity.

So this remember these boundary cases. So in some  $\alpha_0(s)$  equal to 0.  $\alpha_0(v)$  equal to infinity for  $v$  not equal to  $s$ .

$$\alpha_0(s) = 0$$

$$\alpha_0(v) = \infty, \quad v \neq s$$

Similarly  $\delta_0(s) = 0$   $\delta_0(v) = \infty$  for  $v \neq s$ .

$$\delta_0(s) = 0$$

$$\delta_0(v) = \infty \quad v \neq s$$

If  $G$  has no negative cycles then  $\alpha_0(v) = \delta_0(v)$  this will be greater than or equal to  $\alpha_1(v)$  but  $\alpha_1$  will be equal to  $\delta_1(v)$  and this will be greater than or equal to  $\alpha_{n-1}(v)$  which is equal to  $\delta_{n-1}(v)$  for every vertex

$$\begin{array}{ccccccc} \alpha_0(v) & \geq & \alpha_1(v) & & \geq & \alpha_{n-1}(v) & \\ \parallel & & \parallel & \dots & & \parallel & \\ \delta_0(v) & & \delta_1(v) & & & \delta_{n-1}(v) & \\ & & & & & \hline & & & & & \alpha_{n-1}(v) = \delta_{n-1}(v) = \delta(v) & \end{array}$$

And we stop with this there is no need to proceed further if you consider those further elements they will all be equal to these elements. and  $\delta_{n-1}(v)$  we know is a  $\delta_v$  therefore  $\alpha_{n-1}(v) = \delta_{n-1}(v) = \delta(v)$ .

$$\alpha_{n-1}(v) = \delta_{n-1}(v) = \delta(v)$$

This is the important observation and we will see how we are going to use this. since  $\alpha_{n-1}(v) = \delta(v)$  and notice that  $\alpha$  is a decreasing sequence therefore I have a decreasing sequence leading to my answer. In other words something can be made smaller and smaller in  $n-1$  stages I get the answer. So if I have a method of improvement which is using  $\alpha_i$  to compute  $\alpha_{i+1}$ , I can apply that procedure again and again I will start with  $\alpha_0$  compute  $\alpha_1$  I apply the same procedure start

from alpha 1 and obtain alpha 2 apply the same procedure again on alpha 2. and get alpha 3 in this way I can keep on computing the values one smaller than the other or one solution better than the other and in n minus 1 stages I am going to hit the answer that I am looking for. So we have to look into the technical details of how alpha i plus 1 and alpha i are related. If I could explicitly derive the relation then I can devise a computational process which will use that relation and obtain the values okay. Fortunately we have the alpha values satisfying the equations much like the Bellman equation okay.

Let us recall what the Bellman equations are, the Bellman equations are  $\delta(v)$  is equal to  $\delta(u)$  plus weight of  $uv$  and there is an edge such that  $\delta(v)$  is less than or equal to  $\delta(u)$  plus weight of  $uv$  this is for all  $uv$  there exist  $uv$  satisfying this condition. together we got  $\delta(v)$  is equal to minimum of  $\delta(u)$  plus weight of  $uv$ .

$$\rightarrow \left\{ \begin{array}{l} \delta(v) \leq \delta(u) + w(u,v) \quad \forall (u,v) \\ \delta(v) = \delta(u) + w(u,v) \quad \exists (u,v) \end{array} \right.$$

$$\delta(v) = \text{Min} \{ \delta(u) + w(u,v) \}$$

We are going to get a similar relation so these are called Bellman equations for bounded walks for minimum weight bounded walks. Here I am not considering all walks this is a minimum across all paths delta value. I am also I am now focusing on alpha but again alpha with respect to a k we will show that, theorem alpha i plus 1v is less than or equal to alpha i v less than or equal to alpha i u plus weight of uv for all edge uv this will be true. okay this is true for all edge uv in E

$$\alpha_{i+1}(v) \leq \alpha_i(u) + w(u,v)$$

$$\forall (u,v) \in E.$$

but there is an edge there exist an edge uv such that alpha i plus 1v is exactly equal to alpha i u plus weight of uv.

$$\exists (u,v) \Rightarrow$$

$$\alpha_{i+1}(v) = \alpha_i(u) + w(u,v)$$

These two together imply that  $\alpha_{i+1}(v)$  is equal to minimum over all edges  $uv$  such that  $\alpha_i(u) + w(u,v)$ .

$$\Rightarrow \alpha_{i+1}(v) = \min_{(u,v) \in E} \{ \alpha_i(u) + w(u,v) \}$$

Consider all the incoming edges to  $v$  each incoming edge to  $v$  is going to define one value take the minimum over all you are getting this identical to the Bellman equation for weights of the shortest paths. These are the weights of the shortest walk among the bounded walks, walks with bounded length. While the Bellman equation for shortest path weights they have circular dependency nonlinearity and so on there is nothing like that here. Left hand side has got  $n$  values to be computed but they are depending on a completely different set of  $n$  values okay. So if I have  $\alpha_i$  this is not  $\alpha_{i+1}$  this is  $\alpha_i$ . Right hand side has got  $\alpha_i$  values, left hand side has got  $\alpha_{i+1}$  values. So I have a vector of values  $\alpha_i$  of other vertices okay

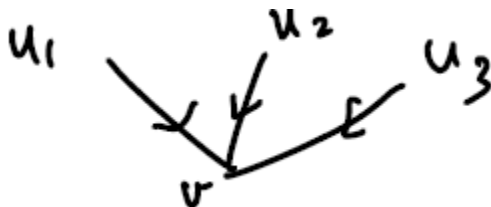
$$\alpha_i[s], \alpha_i[t], \dots$$

there is a vector of values using this I can obtain the another vector of values  $\alpha_{i+1}$  so on

$$\alpha_{i+1}[s], \alpha_{i+1}[t], \dots$$

So if I have one array of values I can compute another array of values without any cyclic dependence and everything there is a formula. What are all the values in this array I have to consult to construct one element of the next array. In order to compute  $\alpha_{i+1}$  of a particular vertex okay what are all the  $\alpha_i$  values I would need okay.

For example if I have  $u_1, u_2, u_3$  these are all the incoming edges to  $v$



then in order to compute  $\alpha_{i+1}(v)$  I need  $\alpha_i(u_1)$  I need  $\alpha_i(u_2)$  I need  $\alpha_i(u_3)$  I need similarly  $\alpha_i(u_4)$  okay  $u_3$  is enough.

$$\alpha_i[u_1] \dots \alpha_i[u_2] \dots \alpha_i[u_3] \dots \alpha_i[u_4] \dots$$

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$$\underline{\underline{\alpha_{i+1}(v)}}$$

So in order to compute this value I need this, this one and this one which are all available okay. So I am assuming that  $\alpha_i$  array of values available then the array is indexed by vertices the array is indexed by vertices for example if the vertex at  $V$  is  $v_1, v_2$  etcetera  $v_n$

$$V = \{v_1, v_2, \dots, v_n\}$$

then I have  $\alpha_i$  let us say  $v_1$  is  $s$  then  $\alpha_i(v_1)$   $\alpha_i(v_2)$  then I will have  $\alpha_i(v_n)$

$$\alpha_i[v_1], \alpha_i[v_2], \dots, \alpha_i[v_n]$$

all these values I assume I have then I can compute  $\alpha_{i+1}(v_1)$   $\alpha_{i+1}(v_2)$   $\alpha_{i+1}(v_n)$  these  $n$  values I can compute using these  $n$  values okay.

$$\alpha_{i+1}(v_1), \alpha_{i+1}(v_2), \dots, \alpha_{i+1}(v_n)$$

How do you compute? Here is the formula okay,  $\alpha_{i+1}(v)$  is minimum of  $\alpha_i(u) + w(u,v)$ , weight of the edge is there

$$\Rightarrow \alpha_{i+1}(v) = \min_{(u,v) \in E} \{\alpha_i(u) + w(u,v)\}$$

and  $\alpha_i$  values are there in one array. Use the values in that array to build this array and all  $\alpha_i$  values are smaller than all  $\alpha_{i+1}$  values are smaller than  $\alpha_i$  values. Therefore, this is an improvement compute the array of values  $\alpha_{i+1}$  by using array of values  $\alpha_i$  this array and this is called improvement step or improvement procedure. I have a computation, set of computation I will do and if you look into the definition this theorem it is saying that  $\alpha_{i+1}$  is minimum among these values okay.

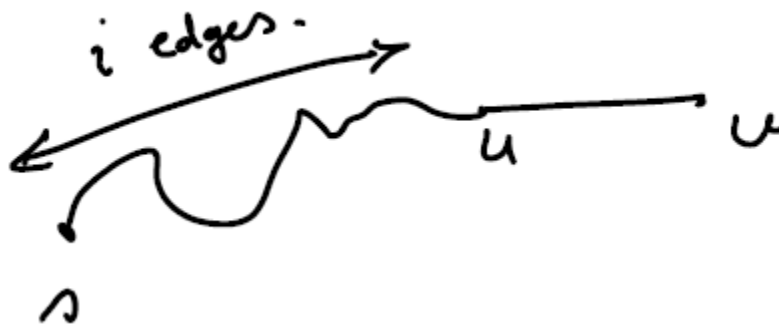
$$\alpha_{i+1}(v) \leq \alpha_i(u) + w(u, v)$$

$$\forall (u, v) \in E.$$

We have already seen this being a subset  $\alpha_{i+1}(v)$  could be  $\alpha_i(v)$  or minimum of this right. the shortest walk in  $W_{i+1}(v)$  has less than or equal to  $i$  edges it will be a shortest walk even in  $W_i(v)$  hence in this case  $\alpha_{i+1}(v)$  is equal to  $\alpha_i(v)$

$$\alpha_{i+1}(v) = \alpha_i(v)$$

if it has got exactly  $i+1$  edges because it can have up to  $i+1$  edges. Now assume that the shortest walk has exactly  $i+1$  edges. So I have a shortest walk, this has got  $s$  to  $v$  is the last edge in the walk this  $s$  to  $v$  walk has got  $i+1$  edges therefore this part will have  $i$  edges this part will have  $i$  edges



we will use a simple notation let  $W_{sv}$  be a shortest walk from  $s$  to  $v$  with  $i+1$  edges

$$W[s, v]$$



then  $W_{sv}$  can be written as  $W_{su}$  plus  $uv$ .  $W_{su}$  plus  $uv$  the portion of the walk from  $s$  to  $u$  and the edge  $uv$ .

$$W[s, v] = W[s, u] + (u, v)$$

We claim this is a shortest walk. We claim that this is a shortest walk. If this is not the shortest walk, this called cut and paste argument okay. The style the proof style is known as cut and paste argument if  $W_{su}$  is not a shortest walk.  $W_{dash su}$  be a shortest walk okay.

$$W'[s, u]$$

I will draw  $W_{dash}$  also in the next  $s$  to  $uv$  this is  $W_{su}$ ,  $W_{dash}$  might be something like this. This is  $W_{dash}$ , this is  $W$ .



Weight of  $W_{dash su}$  is less than weight of  $W_{su}$  right.

$$w(W'[s, u]) < w(W[s, u])$$

That is because this is not the shortest  $W$  is not the shortest  $W_{dash}$  is the shortest.  $W_{dash}$  is the shortest walk with  $W_{dash}$  as less than or equal to  $i$  edges.

$$|W'| \leq i \text{ edges}$$

Now I can cut and paste. I can remove  $W_{su}$  include  $W_{dash}$  so from  $su$  go through  $W_{dash}$  and go to  $v$  so weight of  $W_{dash}$  plus  $uv$  is equal to weight of  $W_{dash}$  plus weight of  $uv$  but this is strictly less than weight of  $W$  plus weight of  $uv$  okay sorry weight of  $W_{dash}$  ends at  $u$ .  $s u$  plus weight of  $uv$ . which is equal to weight of  $W_{sv}$  which is equal to  $\alpha$  this is a shortest path right so its length its weight is going to be  $\alpha + 1v$

$$\begin{aligned} w(W' + (u,v)) &= w(W') + w(u,v) \\ &< w(W[s,u]) + \\ &\quad w(u,v) \\ &= w(W(s,v)) \\ &= \alpha_{i+1}[v] \end{aligned}$$

this is a contradiction I have another walk with a smaller weight. okay it is a length is also less than or equal to  $i + 1$  and its weight is strictly smaller it is a contradiction this contradicts the minimality of  $W$  okay we have started with the shortest walk  $W$  is the shortest walk and  $W_{dash} + uv$  is a shorter walk not possible shorter than the shortest is not possible this contradicts the minimality of  $W$  okay.  $W_{dash}$  has got less than or equal to  $i$  edges,  $W_{dash} + uv$  is less than or equal to  $i + 1$  edges. Here is a walk with less than or equal to  $i + 1$  edges and whose weight is smaller than  $\alpha + 1v$  not possible therefore such a  $W_{dash}$  cannot exist this implies such a  $W_{dash}$  cannot exist implying  $W_{su}$  is a shortest walk and it has less than or equal to  $i$  edges this implies weight of  $W_{su}$  equal to  $\alpha + iu$ . and this implies weight of  $W_{su}$  which is equal to  $\alpha + 1v$ . which is equal to weight of  $W_{su}$  plus  $uv$  which is equal to  $W_{su}$  we have shown is  $\alpha + iu$  plus weight of  $uv$ .

$\Rightarrow$  Such a  $w'$  can not exist

$\Rightarrow w(s, u)$   
 $\leq i$  edges

$\Rightarrow w(w(s, u)) = \alpha_i(u)$

$\Rightarrow w(w(s, u)) = \alpha_{i+1}(v)$   
 $= w(w(s, u) + (u, v))$   
 $= \alpha_i(u) + w(u, v)$

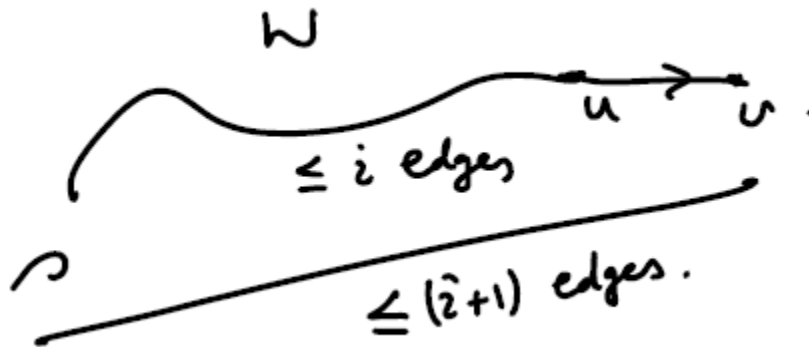
we have shown that  $\alpha_{i+1}(v)$  is equal to  $\alpha_i(u)$  plus weight of  $uv$  for some edge  $uv$ .

$$\alpha_{i+1}(v) = \alpha_i(u) + w(u, v)$$

It is very easy to show that  $\alpha_{i+1}(v)$  is less than or equal to  $\alpha_i(u)$  plus weight of  $uv$

$$\alpha_{i+1}(v) \leq \alpha_i(u) + w(u, v)$$

that is because you take any  $w$   $s$  to  $u$  this is  $w$  and it has got less than or equal to  $i$  edges extended by  $v$  at the edge  $uv$ . This is a walk the total thing is a walk with less than or equal to  $i$  plus 1 edges.



Therefore the weight of that walk must be larger than or equal to  $\alpha_i(u) + w(u,v)$ . What is  $\alpha_i(u) + w(u,v)$  that is the smallest weight this is some walk. therefore its weight will be larger that means  $\alpha_i(u) + w(u,v)$  is less than or equal to  $w$  has got  $\alpha_i(u)$  the edge you have added is weight of  $uv$  and this proves the second part. okay

$$\alpha_{i+1}(v) \leq \alpha_i(u) + w(u,v)$$

So take any shortest walk and you are going to get a walk with less than or equal to  $i + 1$  edges that is a arbitrary walk the weight of an arbitrary walk must be larger than or equal to weight of the minimum or the shortest walk therefore this follows okay hence we have proved that  $\alpha_i(u) + w(u,v)$  is equal to minimum over all  $uv$  such that  $\alpha_i(u) + w(u,v)$ .

$$\alpha_{i+1}(v) = \min_{(u,v) \in E} \{ \alpha_i(u) + w(u,v) \}$$

Therefore no circular dependency and once I have an  $\alpha_i$  array of values I can compute  $\alpha_{i+1}$  array of values. I know  $\alpha_0$  array of values  $\alpha_0(u) = 0$   $\alpha_0(v) = \infty$

$$\alpha_0(s) = 0$$

$$\alpha_0(v) = \infty$$

Therefore we know alpha0 array of values using this obtain alpha1 array of values. using this you obtain so you go through n minus 1 stages okay you go through n minus 1 stages alpha array to alpha 1 array to alpha n minus 1 array. So stop after n minus 1 improvement steps.

$$\alpha_0$$



$$\alpha_1$$

⋮



$$\alpha_{n-1}$$

You would have got alpha n minus 1v we know that since the graph has no negative cycle this is in fact delta n minus 1v we also know that delta n minus 1v is in fact delta v therefore you can output the alpha n minus 1v values. very simple algorithm, iterative procedure.

$$\alpha_{n-1}(v) = \delta_{n-1}(v) = \delta(v)$$

Getting this delta v from Bellman equation was hard getting this values using the Bellman like equations on bounded walk lengths, walk weights we are able to get an iterative algorithm, it is improving the weights of the walk and finally it converges to the answer we are looking for. Though we are working in the class of walks the shortest walk being shortest path. We are able to show that the convergence of that sequence is same as the convergence of the sequence that we want note that this is not true for arbitrary graph, for arbitrary graph if you apply this kind of a improvement step you are not going to end up with shortest path weights, you will get some values but they will not be shortest path

weights. However, if  $G$  has no negative cycle or 0 cycle applying  $n - 1$  improvement steps. lead to the answer we are looking for this is the key idea behind Bellman and Ford algorithm. We will take a detailed look at Bellman and Ford algorithm in our next session thank you.