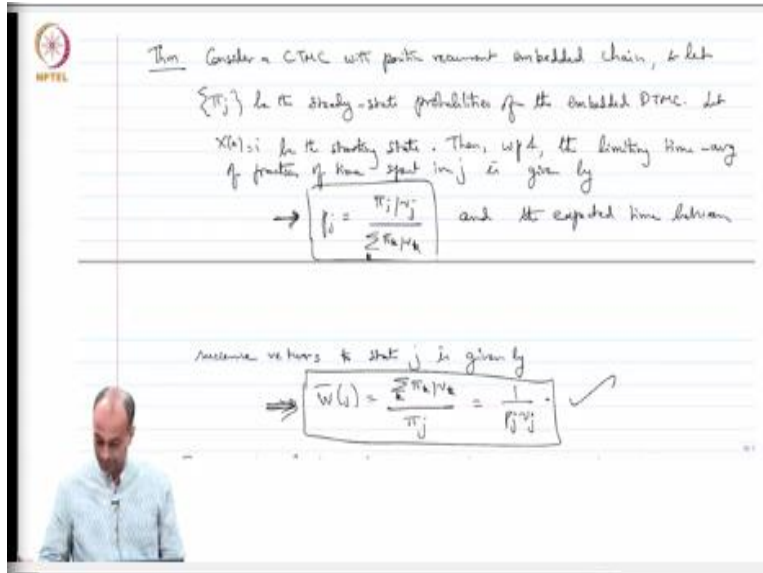


Stochastic Modeling and the Theory of Queues
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Lecture-72
The Steady State Behaviour of CTMC-Part 4

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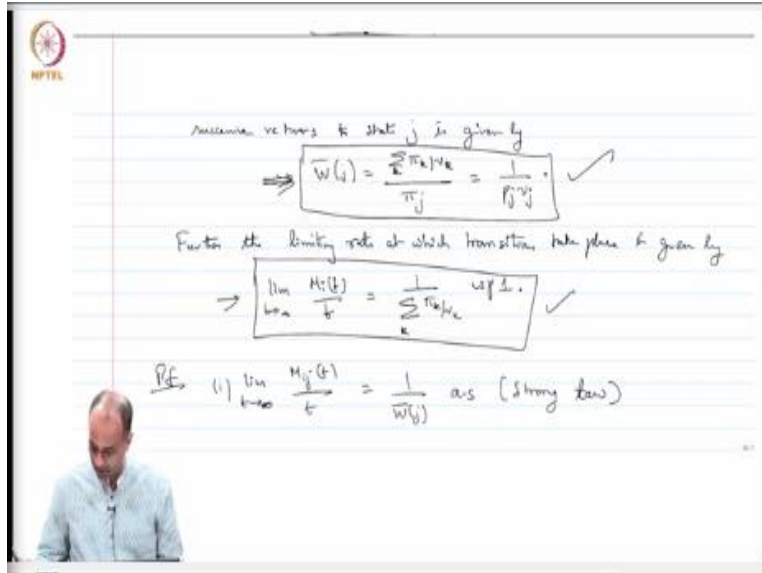


Welcome back in the last module we were discussing the steady state behaviour of CTMCs. We proved this important theorem which relates the steady state probabilities of the embedded DTMC π_j 's to the steady state probability P_j 's of the CTMC. So, in this theorem we showed that if the embedded DTMC is positive recurrent. And if this nu case are such that sum over π_k over ν_k is finite then we have a well defined set of steady state probabilities P_j 's that are given by this equation on the screen.

Remember that π_j has the interpretation of the fraction of transitions that go into state j . Whereas P_j has the interpretation of the fraction of time spent by the CTMC in state j . We also found out that w_j bar which is defined as the average amount of the expected renewal interval. The expected amount of time between 2 successive returns to state j is w_j bar which is given by this equation here.

Again this assumes that $\sum_k \pi_k$ over ν is finite. If this is infinite then the successive returns to j the expected time between successive returns to j is infinite. Then you will have $P_j = 0$ then the fraction of time spent in state j will be equal to 0.

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And finally the rate at which the process makes changes in states which is $M_i(t)$ over t , $M_i(t)$ if you remember is the number of transitions made by the CTMC up till time t . So, $M_i(t)$ over t denotes the rate of transitions as t tends to infinity this goes to 1 over $\sum_k \pi_k \nu_k$. Again if this sum is finite, this is some positive number, if the sum is infinite the average rate at which the process makes these transitions goes to 0.

In that case the average rate of transition the process so sluggish that the average rate at which it goes from one state to another is 0 and you do not have any meaningful interpretation of P_j , all the P_j 's will be 0. So, this is the result we proved last time.

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Recall $\{p_{ij}\}$ steady-state prob. of the embedded DTMCs

$$P_j = \frac{p_{ij}/\nu_j}{\sum_k p_{ik}/\nu_k} \rightarrow < \infty$$

$p_{ij} \propto P_j \nu_j$ & if $\sum_k P_k \nu_k < \infty$, then

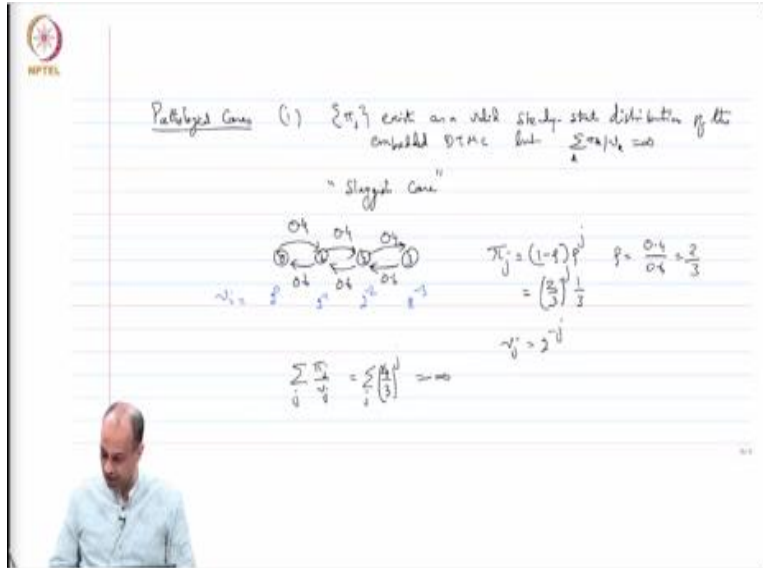
$$P_j = \frac{p_{ij} \nu_j}{\sum_k p_{ik} \nu_k} \rightarrow < \infty$$

So, we can proceed now, so just to recap, so you have p_{ij} are the steady state probabilities of the embedded DTMCs. We said that P_j which is the fraction of time spent in state j or the steady state probability of state j they are both as equal to p_{ij} over ν_j over sum over k p_{ik} over ν_k assuming that the denominator is finite. Then this P_j 's constitute a probability distribution over the states.

So, we can also now go back, so this expresses P_j 's in terms of the p_{ij} 's and ν_j 's. We can also do it the other way around, so if the denominator above is finite then we can express p_{ij} as being proportional to $P_j \nu_j$ except for that the normalization constant p_{ij} is proportional to $P_j \nu_j$. And if sum over $P_j \nu_j$ is finite, then we can write the p_{ij} 's in terms of P_j 's, $P_j = p_{ij} \nu_j$ over sum over $P_k \nu_k$ and all of these will be strictly positive.

So, if the sum over p_{ij} and ν_j is finite you have the strictly positive p_{ij} 's which represents the unique steady state probabilities of the embedded DTMC. So, if you know the P_j 's you can find the p_{ij} 's and vice versa. If you know the p_{ij} 's you can find the P_j 's using this formula. Now there is just maybe I should just mention very briefly that there are 2 pathological cases where. So, we are assuming that here we have assumed that this denominator is finite and here we are assuming that that denominator is finite.

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Now what if these 2 are not true? So, this corresponds to 2 extreme cases of CTMC behaviour. So, let me just briefly mention this of pathological cases. The first pathological case is when π_j exists as a valid steady state distribution of the embedded DTMC. But $\sum_k \pi_j \nu_k = \infty$, in this case this is a case this I should write ν_k . This is a case where sum of these ν_k 's are really small, therefore the rates at which the transition occur is very, very small in some states.

Therefore in some states the CTMC states stays for a very long time. So, this is a colloquially we can call it the sluggish case. It is sluggish because there is the embedded DTMC keeps making transitions, it is a very valid positive recurrent DTMC. But the holding times are such that some of these ν 's are very small and therefore the holding times are very large. And in some of these states the process takes such a long time to move to other states that the average rate of transitions actually goes to 0.

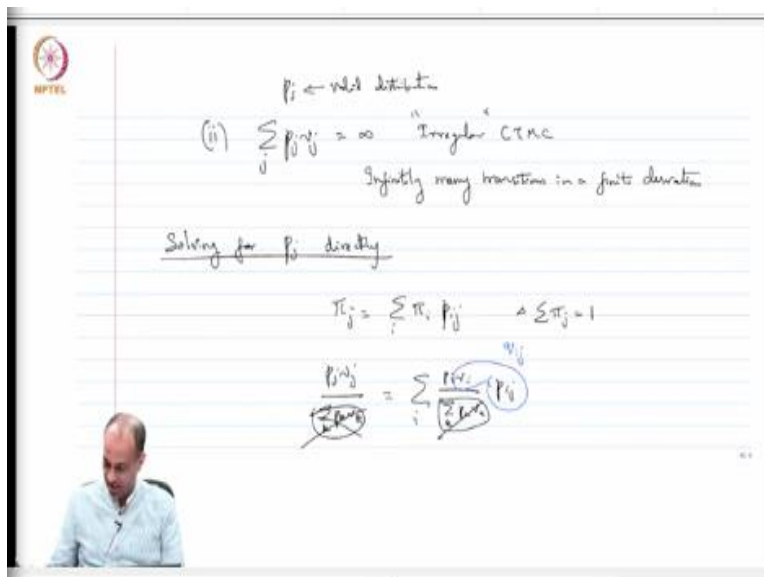
In this case $M(t)$ will in fact be 0 as t tends to infinity. So, there are examples you can make up let us say you have you can have a DTMC where this is let us say I am just drawing the transition probabilities. Let us say this is my embedded Markov chain and so on, so birth death Markov chain. And the holding times are such that this is $2^{-0}, 2^{-1}, 2^{-2}, 2^{-3}$ and so on.

So, the ν_i 's are becoming, so this is ν_i in each of these, so ν_0 is 2^0 , ν_1 is 2^{-1} and so on. So, in this situation what happens to the sum over π_k over ν_k ? So, clearly you can easily find out that the embedded DTMC that I have drawn out is in fact positive recurrent. So, you will find that π_j is just $1 - \rho$ times ρ^j is not, where $\rho = 0.4$ by 0.6 which is just 2 by 3 .

So, that will just work out to be 2 by 3 whole power j times 1 by 3 . But the ν_j 's are 2^{-j} , so if you look at sum over π_j over ν_j , this will be equal to something that is infinite. So, it will become something like 4 by 3 over j 4 by 3 power j or something like that, this is just infinite. So, what happens here is that? As the DTMC keeps a nice positive recurrent behaviour but when the DTMC goes further what happens is that?

The transitions occur so slowly in continuous time that the average rate of transitions goes to 0 . And in this kind of a case, this is a sluggish case where you get all the P_j 's are 0 . So, there is no good notion of average fraction of time spent in state j or the steady state probability of being in state j in continuous state. Of course in discrete time the Markov chain is positive recurrent.

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So, this is one pathological case, the other pathological case corresponds to when sum over j P_j ν_j is infinity. So, in this case, so let us say you are able to find P_j 's which satisfy the balance equations for the CTMC which I will talk about in a minute. Or you can think of P_j 's as the

steady state probabilities of the time sample Markov chain, the delta times sample Markov chain which represents also the fraction of time spent by the CTMC in state j .

But the ν_j 's are such that $\sum_j P_j \nu_j$ is infinity. In this case this is called a irregular CTMC and that is because as you go through the state some of these ν 's are so large and the holding times in some of these states are so small. That this kind of a process can make infinitely many transitions in a finite amount of time, so you have like an avalanche of transitions. So, in this case you cannot have although the P_j 's are a valid distribution P the underlying the embedded DTMC will turn out to be null recurrent or even transient.

So, there is no good notion of π 's here, so you have in this case is an irregular CTMC which goes through a infinitely many transitions in a finite duration with some positive probability. So, this is like an avalanche of transitions that happen and therefore there is no good notion of embedded DTMC steady state probabilities. Anyway, so these 2 are not very well motivated in engineering or other applications, so they are just what they are, they are really just pathological cases but mathematically they can arise.

But we will not pay too much attention to these cases, we will stick to $\sum_j \pi_j$ over ν_j being finite and $\sum_j P_j \nu_j$ being finite, so these are the nice CTMCs. Now there is 1 topic I want to address right now which is solving for P_j directly. So, the one way to solve for P_j is to you start with solving for the embedded DTMCs π_j and if you know ν_j you can just calculate P_j as π_j over ν_j divided by $\sum_k \pi_k$ over ν_k . But there is also a way to solve for P_j directly in the nice case, when you do not have either the avalanche kind of a behaviour all the sluggish kind of a behaviour.

So, if you start with this let us say which is $\pi = \pi P$ which is let us say $\pi_j = \sum_i \pi_i P_{ij}$ and $\sum_j \pi_j = 1$. Now what you do is for π_j you substitute your π_j being $P_j \nu_j$ over $\sum_k P_k \nu_k$. You get $\sum_i P_i \nu_i$ over $\sum_k P_k \nu_k$ P_{ij} . So, if let us say this is finite then I can just cancel that out, so then what do I get? So, I get $P_j \nu_j = \sum_i P_i \nu_i$ P_{ij} . Now what is $P_{ij} \nu_i$? That term if you remember it is just q_{ij} which is the rate of transitions from i to j .

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$$\Rightarrow P_j \nu_j = \sum_{i \in S} p_i q_{ij} \quad \sum_{j \in S} p_j = 1 \quad (A^*)$$

Balance Equations
 Steady state Equations for CTMCs

Then let $\{p_i, i \in S\}$ be a solution to (A^*) . If $\sum_{j \in S} p_j \nu_j < \infty$, then

- (i) the solution is unique
- (ii) each $p_i \geq 0$
- (iii) The embedded DTMC is one recurrent with steady state prob given by $\pi_j = \frac{P_j \nu_j}{\sum_{k \in S} P_k \nu_k}$

Further if the embedded DTMC is one recurrent & $\sum_{j \in S} P_j \nu_j < \infty$, then the CTMC satisfying $P_i = \frac{q_{ij}}{\sum_{k \in S} q_{ik}}$ with unique solution (A^*) .

So, I can just write this as equation can be written as $P_j \nu_j = \sum_{i \in S} p_i q_{ij}$. And of course in the nice case $\sum_{i \in S} p_i = 1$. So, these 2 equations can be regarded as the balance equations or steady state equations for CTMCs. So, what is this equation saying? It is saying that $P_j \nu_j$ which is the probability of being in state j and making a transition. So, the rate of $P_j \nu_j$ is the total rate of transitions out of j in steady state.

And what is on the right is the total rate of transitions into j , $p_i q_{ij}$ is the steady state probability of being in i and q_{ij} is the rate of going from i to j and you are summing over all these states. So, we are just saying that the total rate at which you get out of state j is equal to the total rate at which you get into state j ; that is what this is saying. So, basically the P_i 's which are the steady state probabilities satisfy these equations.

And it is also not difficult to show that if there is a P_j , so if you manage to solve this set of equations for some P_j 's which are normalized to 1. And if it so happens that $\sum_{j \in S} p_j \nu_j$ is finite then you can show that P_j 's are in fact the unique solutions of the steady state solutions of the CTMC. This comes from the uniqueness theorems of DTMCs that we have done. This I will just state without bothering to prove it because I mean we have essentially done this in the DTMC case.

So, let this be called star, let P_i let us say (π) (18:06) be a solution 2 star if $\sum_j P_j \nu_j$ is finite. Then number 1, the solution is unique that is the solution P_i that you manage to find by solving the above equation star is unique each P_i is positive. And 3, the embedded Markov chain is positive recurrent with steady state probabilities given by $\pi_j = P_j \nu_j / \sum_k P_k \nu_k$.

Further, if the embedded DTMC is positive recurrent and $\sum_k \pi_k / \nu_k$ there is a infinity. Then the P_i satisfying $\sum_k \pi_k / \nu_k$ is the unique solution 2 star. So, both sides are true, so if you manage to find a P_i which is solution to the balance equations above. Then with some more $P_j \nu_j$ finite, then you can say that the solution is unique and each of these P_i is positive and that the embedded DTMC is positive recurrent.

Now conversely if you know that the embedded DTMC is positive recurrent and $\sum_k \pi_k / \nu_k$ is finite. Then P_i is which are given by flipping around the equation that we already know. Means the P_i 's which are given by $\pi_j / \nu_j / \sum_k \pi_k / \nu_k$ is the unique solution to the balance equations, both directions are true. And this you can prove by simply using the uniqueness theorem for DTMCs. So, that finishes our discussion about steady state behaviour of CTMCs.