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ST227 Survival Models-Part II

Continuous Time Markov Chains

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### Assignment Project Exam Help Stochastic Processes

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#### Introduction 1.1

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   A stochastic process is a model for a time-dependent random phenomhttps://powcoder.com enon.
- Thus, just as a single random variable describes a static random phenomenon, a stochastic process is a collection of random variables,  $Y(t) = Y_t$ , one for each time t in some set J.
- The **process is denoted**  $\{Y_t : t \in J\}$ . The set of values that the random variables  $Y_t$  can take is called the **state space** of the process, S.

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• The first choice that one faces when selecting a stochastic process to model a real in a real in the continuous) of the time set J and of the state space S.

### Assignment Project Exam Help Example 1: Discrete state space with discrete time changes

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- A motor insurance Aphrophyse (elients phewstate of its customers yearly. Three levels of discount are possible (0, 25%, 40%) depending on the accident record of the driver.
- In this case the appropriate state space is  $S = \{0, 25, 40\}$  and the time set is  $J = \{0, 1, 2, ...\}$  where each interval represents a year.

# Assignment Project Exam Help Example 2: Discrete state space with continuous time changes Add WeChat powcoder

• A life insurance company classifies its policyholders as healthy, ill or dead.

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- As for the time set, According to the Library Coccur at any time. This problem is studied in some detail in what follows (Continuous Time Markov Chains).

### Assignment Project Exam Help Example 3: Continuous state space

- Claims of unpredictable amounts reach an automobile insurance company at unpredictable times; the company needs to forecast the **cumulative claim** over [0,t] in order to assess the risk that it might not be able to meet its liabilities. https://powcoder.com
- It is standard practice to use  $[0, \infty)$  both for S and J in this problem.

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• It is important to be able to conceptualise the nature of the state space of any property which (ishtat be one weed earnd to establish whether it is most usefully modelled using a discrete, a continuous, or a mixed time domain.

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• Usually the choice of state space will be clear from the nature of the process being studied as Power of the healthy-ill-dead model), but whether a continuous or discrete time set is used will often depend on the specific aspects of the process which are of interest, and upon practical issues like the time points for which data are available.

## Assignment Project Exam Help 1.1.1 The Markov property

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 In probability theory and statistics, the term Markov property refers to the memoryless property of a stochastic process. It is named after the Russian mathematician Andrey Markov.

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• A stochastic process  $\{Y(t)\}_{t\geq 0}$  is a Markov process if the conditional probability distribution of future states depends only on the previous state.

- ullet For example, if  $s\geq 0$  and we consider the states i and j, then we can say that Y(t) has the **Markov Property** if P(Y(t+s)=j|Y(t)=i) does not depend on any information before t.
- $\bullet$  Hence, the future development of Y(t) can be predicted from its present state alone, without any reference to its history.

## 2 Continuous Time Markov Chains

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#### 2.1 Introduction

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- Up till now our approach has been to specify a future lifetime in terms of a random variable  $T_x$ . In this chapter we look at things rather differently, and use a **Continuous Time Markov Chain (or a Markov model)** of transfers between states.
- In the simplest case, a life can be alive or dead, and this gives a two-state model of mortality which is known as the **dead-or-alive model**. We often represent this in a diagram like:

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The probability that a life alive at any age x should be dead at some future age is determined by tap of percentage presentation  $\mu_{x+t}$ ,  $t \geq 0$ , or transition intensity.

- The main advantages of the Markov model approach to modelling mortality over the random variable approach are that:
  - it can be generalised to multiple decrements or multiple state **models**, e.g. the three state model  $\{Well, Ill, Dead\}$ , and

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   it deals easily with censoring, a common feature of mortality data, which was will talle to be put later to be chapters ahead.
- We make two fundamental assumptions in the 2-state model above. Assignment Project Exam Help
- be in either state  $\{Alive, Dead\}$  at any future time x + t depends only on the age x and the detail was powered er
- 2. **(AS2)** The probability  $dt q_{x+t}$  is given by

$$dt q_{x+t} = \mu_{x+t} dt + \mathbf{0}(dt), t \ge 0.$$
 (1)

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• Informally, assumption 1 says that the future depends only on the present and not of the probability present and not of the probability of death in a short interval of time, dt, is approximately proportional to the force of mortality at that time.

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• **Reminder:** The function f(h) is said to be o(h) or "little o of h" if

https://powcoder.com  $\lim_{h \to \infty} \frac{f(h)}{f(h)} = 0.$ Add Weehat powcoder (2)

In other words, f(h) is o(h) if  $f(h) \rightarrow 0$  faster than h.

## 2.2 Assignment Project Exam Help Computation of $tp_x$ in the dead-or-alive model

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Our model is defined in terms of the transition intensities  $\mu_x$ . How can we compute probabilities like  $tp_x$ ,  $tq_x$ , etc?

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Lemma 1 Assumptions 1 and 2 imply that er.com

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$$tp_x = \exp\left(-\int_0^t \mu_{x+s} ds\right). \tag{3}$$

. This agrees with the well known result obtained with the future lifetime approach in Part 1.

Assignment Project Exam Help Proof: Let s < t. Notice first that  $sp_x$  is well defined by the Markov property, i.e. how the life and that interval of time immediately after x + s, and ask: how can a life aged x become a life aged x + s + ds? The diagram may help:

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spxhttps://powcoder.com+s

Alive at x

Add We Chat powcoder Alive at x + s + ds

Assignment Project Exam Help Hence, the probability that (x) survives s + ds years is equal to the probability that they der wee the probability that, when at age x+s, they survive ds years.

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$$\begin{array}{rcl}
s+ds p_{x} & = & sp_{x} \times ds p_{x+s} \\
& = & \underset{sp_{x}}{\text{https://powcoder.com}} \\
& = & sp_{x} \times d^{1} \underbrace{\text{wechat powcoder}} \\
& = & sp_{x} \times d^{1} \underbrace{\text{wechat powcoder}} \\
\end{array}$$
(4)

Now bring the term  $sp_x$  from the right to the left hand hand side of (4) we get

$$s + ds p_x - s p_x = -s p_x \mu_{x+s} ds + \mathbf{0}(ds).$$
 (5)

Then divide both sides of (5) by ds and let  $ds \rightarrow 0$ . We find

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$$\frac{\text{Add pWeChat powcoder}}{ds} = \frac{-sp_{x}\mu_{x+s}}{sp_{x}\mu_{x+s}} + \frac{0(ds)}{ds}$$

$$\Rightarrow \frac{\partial}{\partial s} sp_{x} = -sp_{x}\mu_{x+s}$$

$$\Rightarrow tp_{x} = \exp(-\int_{0}^{\infty} \mu_{x+s} ds)$$

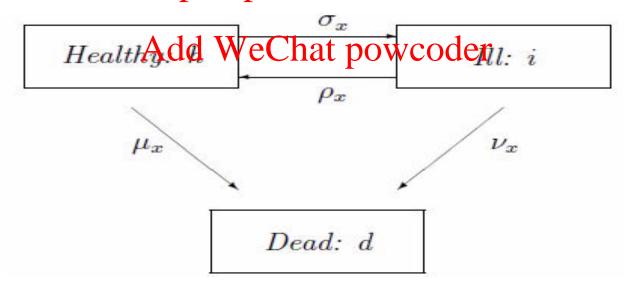
$$\text{https://powcoder.com}$$
(6)

on integrating (6) from A to this cresult will be proved in the class.

### 2.3 Assignment Project Exam Help Multi-state Markov models

• The 2-state model of mortality can be extended to any number of states. Many insurance products, e.g. Permanent Health Insurance (PHI), can be modelled by a **multi-state model**. The set  $S = \{Healthy, Ill, Dead\} = \{h, i, d\}$  is the state-spacet pere is at 3-state-model.

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• Let g and h be any two states. We extend the assumptions for the 2state model to do this in terms of the transition probability  $tp_x^{gh}$  (analogous to  $tp_x$ ) and the force of transition (aka transition intensity)  $\mu_x^{gh}$  (analogous to  $\mu_x$ ).

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• We define the transition probability

$$tp_x^{gh} = P_r(\text{In state } j \text{ at time } x + t \mid \text{In state } i \text{ at time } x)$$
for any two states  $i$  and  $j$ . (7)

• Also, for z > 0 define the **force of transition** 

$$\mu_x^{gh} = \lim_{z \longrightarrow 0^+} \frac{z p_x^{gh}}{z}.$$
 (8)

### Assignment Project Exam Help 2.4 Fundamental Assumptions for Multi-State models

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- 1. **(AS1)** Markov assumption. The probability that a life now aged x will be in a particular state at any future time x+t depends only on the age x and the state currently occupied. Assignment Project Exam Help
- 2. **(AS2)** For any two the transition probability  $dtp^{gh}_{x+t}$  is given by

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$$_{dt}p_{x+t}^{gh} = \mu_{x+t}^{gh}dt + 0(dt), \ t \ge 0. \tag{9}$$

3. (AS3) The probability that a life makes two or more transitions in time dt is o(dt). Assumption 3 says, in effect, that only one transfer can take place at one time.

## 

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ullet This is the probability that we are in state g at time x+t, given that we are in state g at time x.

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• This does not implytting: we begin states for the whole of the time interval from x to x+t, for this we define the **occupation probability**. Add WeChat powcoder

Occupation Probability:

$$_t p_x^{\overline{gg}} = P_r(\text{In state } g \text{ from } x \text{ to } x + t \mid \text{In state } g \text{ at time } x)$$
 (10)

## 

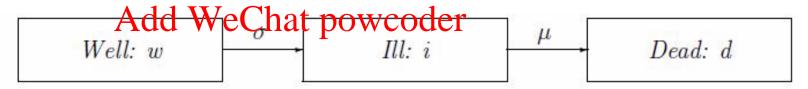
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• Because  $tp_x^{\overline{gg}}$  is the occupation probability, i.e. the individual never leaves state g between ages x and x + t.

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- The important distinction//potheterogeninelydes the possibility that the individual leaves state  $\bar{g}$  between ages x and x+t, provided they back in state g at age x + Add is West that possession of the next class.
- However  $tp_x^{\overline{gg}}$  will be equal to  $tp_x^{gg}$  in one common situation, namely when return to state g is impossible.

## Assignment Project Exam Help For example, in this model of terminal illness



we have  $tp_x^{\overline{wy}}$  spignmenteturoje et e wante telephossible.

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• In a similar fashion, we also have  $tp_x^{ii} =_t p_x^{ii}$ . Add WeChat powcoder

### 2.5 Assignment Project Exam Help Kolmogorov forward equations

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• What can we say about the relationship between the transition intensities  $\mu_{x+t}^{gh}$ ,  $g \neq h$  and the transition probabilities  $tp_x^{gh}$ ?

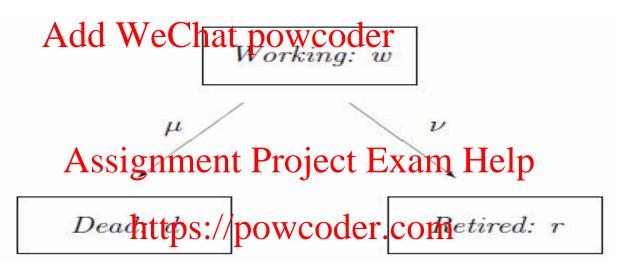
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• We will look at **two examples** in detail **before giving the general result**. https://powcoder.com

**Example 1** Consider the 3-state model for working, retiring and dying.

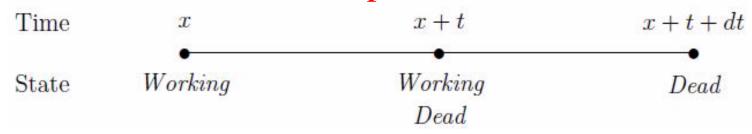
• In this simple example we will assume **two constant transition intensities**  $\mu$  (from working to dying) and  $\sigma$  (from working to retiring).

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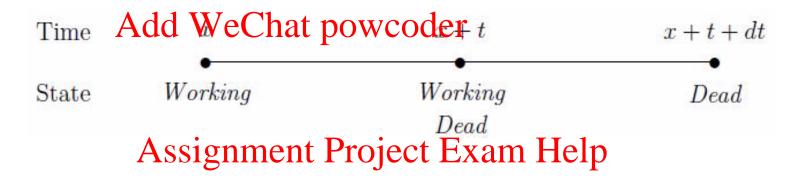


- There are **three transition probabilities** which correspond to the events:
  - (a) Working to Dead, (b) Working to Retired and (c) Working to Working.

- Assignment Project Exam Help (a) Working to Dead or  $tp_x^{wd}$ . We use a standard method in all of these kind of problemsWeChat powcoder
  - **Step 1:** We suppose we are in the destination state (here Dead) at time x + t + dt.
  - Step 2: We list the states we could be in at time x+t, i.e. just before time x + t + dthttps://powcoder.com
  - The diagram might help: Add WeChat powcoder



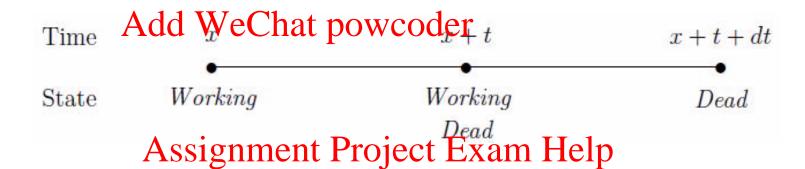
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• The left end represents the parting position at time x.

- The **right end** represents the final position at time x + t + dt.
- The **middle position** lists the states that can be occupied at x + t immediately before the final position at x + t + dt.

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• Thus, we have that https://powcoder.com

$$t+dt p_x^{wd} = t p_x^{wd} +_t p_x^{ww} \times_{dt} p_{x+t}^{wd}$$

$$= t p_x^{wd} +_t p_x^{ww} \times (\mu dt + \mathbf{0}(dt)).$$
(11)

Assignment Project Exam Help Rearranging we get

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$$\frac{t+dtp_x^{wd} - tp_x^{wd}}{\text{Assignment Project Exam Help}} = \mu \cdot_t p_x^{ww} + \frac{o(dt)}{\text{Help}}$$
(13)

so taking the limit  $dt - h \theta ps: gebowcoder.com$ 

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$$\frac{\partial}{\partial t} t p_x^{wd} = \mu \cdot t p_x^{ww}. \tag{14}$$

This is the Kolmogorov forward equation for  $tp_x^{wd}$ .

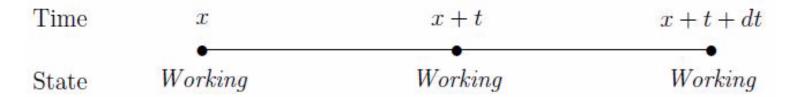
Assignment Project Exam Help (b) Working to Retired or  $tp_x^{wr}$ . We can apply exactly the same argument to  $tp_x^{wr}$  but it is bytter that ephewsymptetry of the diagram. This gives the Kolmogorov forward equation for  $tp_x^{wr}$  as

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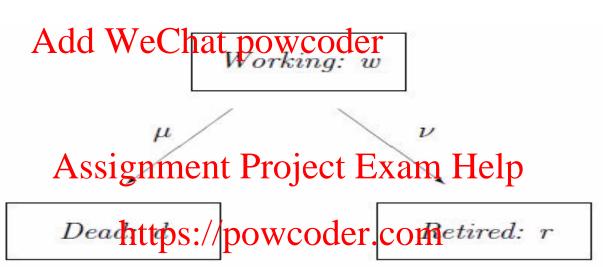
$$http \frac{\partial}{\partial t} / p w^{wr} = v dt p^{ww}$$

$$(15)$$

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(c) Working to Working. First, notice that return to the Working state is impossible so  $tp_x^{ww} = tp_x^{\overline{ww}}$ . The diagram of possible routes is very simple:



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The probability of transfer out of state Working in time dt is

$$dt p_{x+t}^{wd} +_{dt} p_{x+t}^{wr} = \mu dt + 0(dt) + \nu \cdot dt + 0(dt)$$

$$= \mu \cdot dt + \nu \cdot dt + 0(dt).$$
(16)

Assignment Project Exam Help Hence, the probability we remain in state Working for time dt is

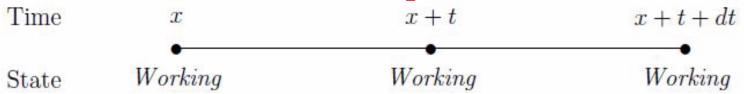
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$$1 - \mu \cdot dt - \nu \cdot dt + 0(dt). \tag{18}$$
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Thus, since

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we get

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$$Adp w e Char powcoder_{\nu} \cdot dt + O(dt)).$$
 (19)

Rearranging and letting  $dt \to 0$ , we find Assignment Project Exam Help

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$$\frac{\partial}{\partial t} t p_x^{\overline{ww}} = -(\mu + v)_t p_x^{\overline{ww}}$$
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(20)

and putting  $tp_x^{\overline{ww}} = tp_x^{ww}$  gives the Kolmogorov equation for  $tp_x^{ww}$  :

$$\frac{\partial}{\partial t} t p_x^{ww} = -(\mu + v)_t p_x^{ww}. \tag{21}$$

- Assignment Project Exam Help
  We now have a system of three differential equations (14), (15) and (21) for the three unknown transition probabilities,  $tp_x^{ww}, tp_x^{wr}$  and  $tp_x^{wd}$ .
- Note that

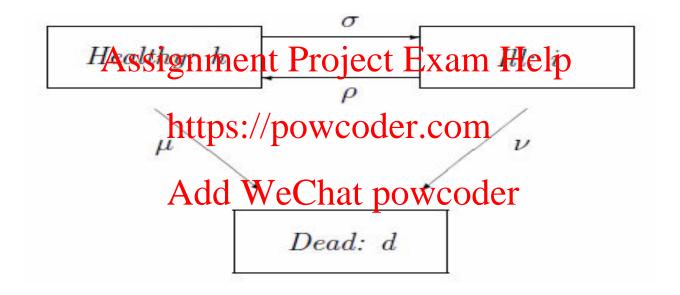
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$${}_{t}p_{x}^{x} + {}_{t}p_{x}^{y} = H$$
(22)

since a life in state https://pownoschericome state at time x + t.

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Example 2 For our second example we return to the 3-state model for PHI.

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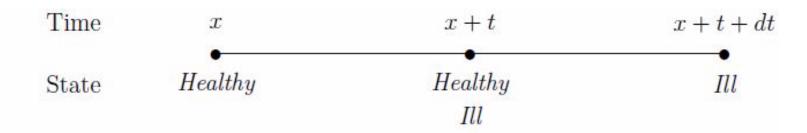
• We have assumed that the transition intensities  $\mu, \sigma, \rho$  and  $\nu$  are constant.

Assignment Project Exam Help There are six transition probabilities  $tp_x^{hh}, tp_x^{ht}, tp_x^{hd}, tp_x^{ii}, tp_x^{ih}$  and  $tp_x^{id}$ .

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- We look in detail at the derivation of the Kolmogorov equations for three of these,  $tp_x^{hh}$ ,  $tp_x^{hi}$  and  $tp_x^{hd}$ . (The remaining three equations can then be written down by using symmetry arguments.)

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Hence

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$$t+dtp_x^{hi} = tp_x^{hh} \times (\sigma dt + O(dt)) + tp_x^{hi} \times (1 - \rho dt - \nu dt + O(dt))$$
 (23)  
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Rearranging we get

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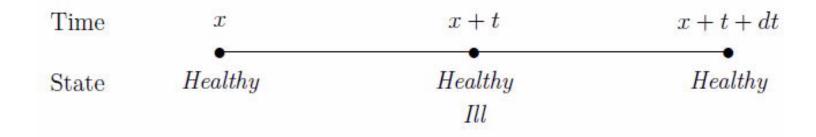
$$\frac{t + dt p_x^{hi} - t p_x^{hi}}{dt} = \sigma \cdot_t p_x^{hh} - (\rho + \nu)_t p_x^{hi} + \frac{\mathsf{0}(dt)}{dt}$$
(24)

and taking the limit  $dt \to 0$  gives the Kolmogorov forward equation for  $tp_x^{hi}$  (next slide).

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Add 
$$\stackrel{\circ}{W}_{ex}$$
 hat  $p_{ex}$  coder  $p_{ex}$   $p_{ex}$  (25)

(b) Healthy to Healthy or  $t_{i}^{hh}$ . Project Exame Healthy state Healthy or the  $t_{i}^{hh}$  be reached from either the  $t_{i}^{hh}$  or the t



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Hence

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$$t+dtp_x^{hh} = tp_x^{hh} \times (1 - \sigma dt - \mu dt + 0(dt)) + tp_x^{hi} \times (\rho dt + 0(dt))$$
(26)  
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Rearranging we get

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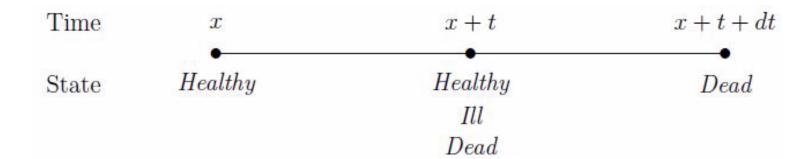
$$\frac{t+dtp_x^{hh}-tp_x^{hh}}{dt} = \rho \cdot tp_x^{hi} - (\sigma + \mu)tp_x^{hh} + \frac{\mathsf{0}(dt)}{dt}$$
(27)

and taking the limit  $dt \to 0$  gives the Kolmogorov forward equation for  $tp_x^{hh}$  (next slide).

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Add 
$$\frac{\partial}{\partial t} p_x^{hat} p_x^{hat} coder_{+\mu}_{t} p_x^{hh}$$
 (28)

(c) Healthy to Dead or  $t^{hd}$  The Dead state at time x + t + dt can be reached from either the Healthy, the III or the Dead state at time x + t. Our diagram is <a href="https://powcoder.com">https://powcoder.com</a>



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Hence

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$$_{t+dt}p_{x}^{hd} = _{t}p_{x}^{hh} \times (\mu dt + O(dt)) + _{t}p_{x}^{hi} \times (\nu dt + O(dt)) + _{t}p_{x}^{hd} \times 1$$
 (29)

The Kolmogorov forward equation for  $p_x$  follows by real ranging and taking the limit  $dt \to 0$ . We find https://powcoder.com

$$\frac{\text{Add,} WeChat, powcoder}{\partial t \ t p_x^{hd} = \mu \cdot t p_x^{hd} + \nu \cdot t p_x^{hi}}.$$
 (30)

**Comment**: Note that

$$_{t}p_{x}^{hd} = 1 - _{t}p_{x}^{hh} - _{t}p_{x}^{hi}.$$
 (31)

### 2.6 Assignment Project Exam Help The general Kolmogorov equations

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• What can we say about the relationship between the transition intensities  $\mu^{gh}_{x+t}$ ,  $g \neq h$  and the transition probabilities  $tp^{gh}_x$ ?

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• The **general Kolmogorov equations** generalise the previous two examples. We show that https://powcoder.com

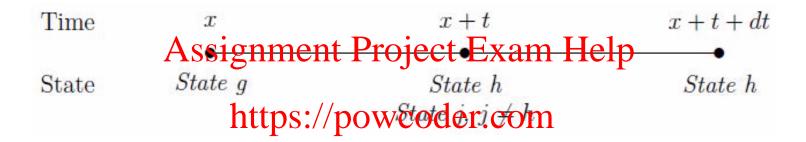
$$\frac{\partial}{\partial t} t p_x^g h \underbrace{Add}_{j \neq h} \underbrace{We Chat}_{t p_x} \mu_{x+t}^{at} \underbrace{power}_{t p_x} \mu_{x+t}^{at}), \quad g \neq h$$
(32)

• We are interested in transfers from state g at time x to state h at time x + t + dt. So at time x + t we are already in state h, or we have still to reach state h from some other state j.

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• Our diagram is

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• Hence we have that (next slide):

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$$= \underbrace{\frac{\operatorname{Add}_{g}We \operatorname{Chat}_{x+t} \operatorname{pewcoder}_{j\neq h}}_{tp_{x}} \times \underbrace{\frac{\operatorname{Ad}_{x+t}}{\operatorname{dt}_{x+t}} \times \frac{\operatorname{Ad}_{x+t}}{\operatorname{dt}_{x+t}}}_{j\neq h} \times \underbrace{\left(1 - \sum_{x} \mu_{x+t}^{hj} dt + 0(dt)\right)}_{Hel \not\ni h} + \underbrace{\sum_{x} tp_{x}^{gj} \left(\mu_{x+t}^{hj} dt + 0(dt)\right)}_{Hel \not\ni h}$$

# • Rearranging we get https://powcoder.com

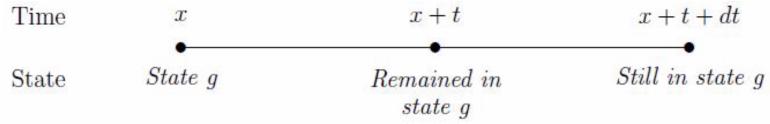
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$$\frac{t+dtp_x^{gh} - tp_x^{gh}}{dt} = \sum_{j \neq h_t} (p_x^{gj} \mu_{x+t}^{jh} - tp_x^{gh} \mu_{x+t}^{hj}) + \frac{\mathbf{0}(dt)}{dt}$$
(34)

and the result follows on letting  $dt \rightarrow 0$ .

- Assignment Project Exam Help
   We can also apply the same argument to finding the Kolmogorov equation for  $tp_x^{\overline{gg}}$  , the probability that the state is occupied continuously from time x to time x + t.
- As in the previous examples, Pure jest I Ting a differ the lip equation can be solved to give a closed form expression for  $tp_x^{\overline{gg}}$ . The diagram https://powcoder.com

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tells us that (next slide):

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$$\underbrace{\operatorname{Add}_{gg}}_{t+dt} \underbrace{\operatorname{Perhot}_{x}} \underbrace{\operatorname{poweoder}_{j\neq g}}_{t} dt + \operatorname{O}(dt)$$
(35)

• Rearranging Assignment Project Exam Help

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$$\frac{t+dtp_{x}^{\overline{gg}}-tp_{x}^{\overline{gg}}}{\Delta t} = \cot p \underbrace{\partial}_{j\neq g} \underbrace{\partial}_{gg} \underbrace{\partial}$$

on letting  $dt \rightarrow 0$ .

### Assignment Project Exam Help • Integrating (36) we find

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$$tp_x^{gg} = \exp\left(-\int_0^\infty \sum_{j \neq g} \mu_{x+s}^{gj} ds\right)$$
(37)

Comment: This formula generalises the Well-known formula:

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