

Project 4 Javier Salazar 1001144647.

1. Industrial Mobility and Peters's Principle. Suppose a position at a large firm is filled by a person at one of the following levels : T = trainee, J = junior, S = senior. Let $X(t)$ denote the level of the person holding a position at time t , and suppose $X(t)$ evolves as a Markov process according to the transition rate matrix Q as follows:

$$Q = \begin{pmatrix} \backslash & T & J & S \\ T & -a_T & a_T & 0 \\ J & a_{JT} & -a_J & a_{JS} \\ S & a_S & 0 & -a_S \end{pmatrix}$$

In words, a trainee stays at the rank for an exponentially distributed time $\sim a_T$ and then becomes a junior. A junior stays

at that rank for an exponentially distributed time $\sim a_J = a_{JT} + a_{JS}$ and subsequently will be promoted to a senior with probability $\frac{a_{JS}}{a_J}$ or the junior leaves the position with probability $\frac{a_{JT}}{a_J}$ and will be immediately replaced by a trainee. A senior stays

at that rank for an exponentially distributed time $\sim a_S$ and then leaves (or gets fired according to the Peter's Principle of reaching the level of incompetence) and will be immediately replaced by a trainee.

Suppose the mean time spent in positions T, J, S are as follows: 1, 2, 5 years ($-q_{ii} = \frac{1}{\text{mean time spent at } i}$ in the matrix Q). Assume in addition that the chance of being promoted from J to S is $\frac{2}{5}$.

(a) Find the transition probability matrix $P(t) = e^{Qt}$

In[]:=

<< BarCharts`

... **GeneralizedBarChart**: Symbol GeneralizedBarChart appears in multiple contexts {BarCharts`, Global`}; definitions in context BarCharts` may shadow or be shadowed by other definitions.

... **General**: BarCharts` is now obsolete. The legacy version being loaded may conflict with current functionality. See the Compatibility Guide for updating information.

In[]:= $Q = \begin{pmatrix} -1 & 1 & 0 \\ 3/10 & -1/2 & 1/5 \\ 1/5 & 0 & -1/5 \end{pmatrix};$

P[t_] := MatrixExp[Q * t];
P[t] // MatrixForm

Out[]:=MatrixForm=

$$\begin{pmatrix} \frac{1}{5} + \frac{90 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} + \frac{10 \sqrt{89} e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} - \frac{90 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{-89+17 \sqrt{89}} + \frac{10 \sqrt{89} e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{-89+17 \sqrt{89}} & \frac{2}{5} - \frac{130 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} - \frac{10 \sqrt{89} e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} + \frac{130 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{-89+17 \sqrt{89}} \\ \frac{1}{5} - \frac{31 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} - \frac{3 \sqrt{89} e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} + \frac{31 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{-89+17 \sqrt{89}} - \frac{3 \sqrt{89} e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{-89+17 \sqrt{89}} & \frac{2}{5} + \frac{25 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} + \frac{5 \sqrt{89} e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} - \frac{25 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{-89+17 \sqrt{89}} \\ \frac{1}{5} - \frac{14 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} - \frac{2 \sqrt{89} e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} + \frac{14 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{-89+17 \sqrt{89}} - \frac{2 \sqrt{89} e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{-89+17 \sqrt{89}} & \frac{2}{5} + \frac{40 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{89+17 \sqrt{89}} - \frac{40 e^{-\frac{17 t}{20} - \frac{\sqrt{89} t}{20}}}{-89+17 \sqrt{89}} \end{pmatrix}$$

(b) Find the stationary distribution $\pi = (\pi_T, \pi_J, \pi_S)$ by taking $\lim_{t \rightarrow \infty} P(t)$ (each row is π)

```
In[ ]:= M = Limit[P[t], t -> Infinity];
M // MatrixForm
```

Out[] // MatrixForm =

$$\begin{pmatrix} \frac{1}{5} & \frac{2}{5} & \frac{2}{5} \\ \frac{1}{5} & \frac{2}{5} & \frac{2}{5} \\ \frac{1}{5} & \frac{2}{5} & \frac{2}{5} \\ \frac{1}{5} & \frac{2}{5} & \frac{2}{5} \end{pmatrix}$$

(* $\pi_T=1/5$, $\pi_J=2/5$, $\pi_S=2/5$ *)

(c) Find the stationary distribution π by solving $\pi Q = 0$

```
In[ ]:= Solve[{ $\pi_T$ ,  $\pi_J$ ,  $\pi_S$ }.Q == {0, 0, 0}, { $\pi_T$ ,  $\pi_J$ ,  $\pi_S$ }]
```

... Solve: Equations may not give solutions for all "solve" variables.

```
Out[ ]:= { { $\pi_J \rightarrow 2 \pi_T$ ,  $\pi_S \rightarrow 2 \pi_T$ } }
```

(*By linear algebra and inspection the solution is $\pi_T=1/5$, $\pi_J=2/5$, $\pi_S=2/5$ *)

2. **Barber Shop.** There are 2 waiting chairs and 2 barbers. Customers arriving to fully occupied shop are turned away.

Assume that customers arrive according to Poisson process at rate of 5/hour (inter arrivals are exponential $\sim \lambda = 5$) and

the service rate is 2/hour (services are exponential $\sim \mu = 2$). If $X(t)$ = the number of the customers in the shop at time t ,

then it can be modelled by a birth-death process on states $\{0, 1, 2, 3, 4\}$ with the following transition rate matrix

$$Q = \begin{pmatrix} -5 & 5 & 0 & 0 & 0 \\ 2 & -7 & 5 & 0 & 0 \\ 0 & 4 & -9 & 5 & 0 \\ 0 & 0 & 4 & -9 & 5 \\ 0 & 0 & 0 & 4 & -4 \end{pmatrix}$$

Suppose that at the time of opening the shop at 8 AM there were 2 customers waiting.

(a) Using $p(t) = p(0) P(t)$ find the probability that the shop will be full at: 9AM, 10AM, 12PM, 4PM

$$Q = \begin{pmatrix} -5 & 5 & 0 & 0 & 0 \\ 2 & -7 & 5 & 0 & 0 \\ 0 & 4 & -9 & 5 & 0 \\ 0 & 0 & 4 & -9 & 5 \\ 0 & 0 & 0 & 4 & -4 \end{pmatrix};$$

```

P[t_] := MatrixExp[Q * t];
P[t] // N // MatrixForm;
p[t_] := {0, 0, 1, 0, 0}.P[t];
For[i = 1, i ≤ 8, i = i + 2, Print[p[i] // N]] (*The last entry in the
matrix is the probability that the shop is full at the respective time*)

{0.0717358, 0.17338, 0.207755, 0.247386, 0.299743}

{0.0658251, 0.16359, 0.203281, 0.252612, 0.314692}

{0.0648914, 0.162212, 0.202746, 0.253408, 0.316742}

{0.0648758, 0.16219, 0.202737, 0.253421, 0.316776}

```

(b) Find the stationary distribution π

```

In[ ]:= M = Limit[P[t] // N, t → Infinity];
M // MatrixForm
(*Stationary distribution is along the diagonal for each respective state*)

```

Out[] // MatrixForm =

```

{0.0648758 0.16219 0.202737 0.253421 0.316776}
{0.0648758 0.16219 0.202737 0.253421 0.316776}
{0.0648758 0.16219 0.202737 0.253421 0.316776}
{0.0648758 0.16219 0.202737 0.253421 0.316776}
{0.0648758 0.16219 0.202737 0.253421 0.316776}

```

(c) Assume $X(0) = 2$. Simulate $n = 365$ days sample (assume the shop operates 8AM - 8PM).

Compare the frequencies of states to the stationary distribution π .

(d) Repeat (c) for $n = 10,000$.

$$\text{In}[*]:= Q = \begin{pmatrix} -5 & 5 & 0 & 0 & 0 \\ 2 & -7 & 5 & 0 & 0 \\ 0 & 4 & -9 & 5 & 0 \\ 0 & 0 & 4 & -9 & 5 \\ 0 & 0 & 0 & 4 & -4 \end{pmatrix};$$

```

P[t_] := MatrixExp[Q * t];
P[t] // N // MatrixForm;
p[t_] := {0, 0, 1, 0, 0}.P[t];
p[365 * 12] // N
p[10000 * 12] // N

```

General: Exp[-68542.8] is too small to represent as a normalized machine number; precision may be lost.

General: Exp[-68542.8] is too small to represent as a normalized machine number; precision may be lost.

General: Exp[-45537.1] is too small to represent as a normalized machine number; precision may be lost.

General: Further output of General::munfl will be suppressed during this calculation.

Out[*]= {0.0648758, 0.16219, 0.202737, 0.253421, 0.316776}

General: Exp[-1.87789 × 10⁶] is too small to represent as a normalized machine number; precision may be lost.

General: Exp[-1.87789 × 10⁶] is too small to represent as a normalized machine number; precision may be lost.

General: Exp[-1.24759 × 10⁶] is too small to represent as a normalized machine number; precision may be lost.

General: Further output of General::munfl will be suppressed during this calculation.

Out[*]= {0.0648758, 0.16219, 0.202737, 0.253421, 0.316776}

3. Car Service. A service is carried out sequentially as follows: T(tune-up), A(air-conditioning), B(brakes). The mean service times are respectively 1,2,3 hours. Assume the services are independent and exponentially distributed. If $X(t)$ denotes the state of service at time t then it can be modelled by a birth-death process on states {1,2,3,4} where 4 corresponds to the absorbing state (i.e., all three services 1-T, 2-A, 3-B have been completed and therefore the transition rate to leave 4 is 0).

Then the transition rate matrix has the form

$$Q = \begin{pmatrix} -1 & 1 & 0 & 0 \\ 0 & -1/2 & 1/2 & 0 \\ 0 & 0 & -1/3 & 1/3 \\ 0 & 0 & 0 & 0 \end{pmatrix}$$

Notice that the transition rate = $\frac{1}{\text{mean times spent at } a \text{ given state}}$.

(a) What is the probability that 5 hours after the service started the car is still in the brake repair stage?

$$Q = \begin{pmatrix} -1 & 1 & 0 & 0 \\ 0 & -1/2 & 1/2 & 0 \\ 0 & 0 & -1/3 & 1/3 \\ 0 & 0 & 0 & 0 \end{pmatrix};$$

`P[t_] := MatrixExp[Q * t];`

`P[5] // N // MatrixForm (*0.189*)`

Out[]//MatrixForm=

$$\begin{pmatrix} 0.00673795 & 0.150694 & 0.367537 & 0.475031 \\ 0. & 0.082085 & 0.320372 & 0.597543 \\ 0. & 0. & 0.188876 & 0.811124 \\ 0. & 0. & 0. & 1. \end{pmatrix}$$

(b) What is the probability that the service has been completed at the end of the 6-th hour?

`P[6] // N // MatrixForm (*0.864*)`

Out[]//MatrixForm=

$$\begin{pmatrix} 0.00247875 & 0.0946166 & 0.314004 & 0.5889 \\ 0. & 0.0497871 & 0.256645 & 0.693568 \\ 0. & 0. & 0.135335 & 0.864665 \\ 0. & 0. & 0. & 1. \end{pmatrix}$$

4. Linear Growth Model with Immigration. Let $X(t)$ has the parameters $\lambda_0 = \lambda$, $\mu_0 = \mu$, $\mu_n = n\mu$, $\lambda_n = n\lambda + \theta$ for $n \geq 1$

and let $\lambda < \mu$. Then the expected population size $m(t) = x_0 e^{(\lambda-\mu)t} + \frac{\theta}{\lambda-\mu} [e^{(\lambda-\mu)t} - 1] \rightarrow \frac{\theta}{\mu-\lambda} =$ equilibrium size, as $t \rightarrow \infty$.

Let the population of 100 has the birth rate $\lambda = 1$ /individual/year, death rate $\mu = 1.2$ individual/year, and the immigration factor

$\theta = 1$ /year.

(a) Simulate $n = 1000$ samples of the population size at time $t = 30$ years, calculate the sample average and compare to $m(t)$.

```

Table[ $\lambda p[n\_]$  :=  $n * 1 + 1$ , {n, 1, 1000}];
Table[ $\mu p[n\_]$  :=  $n * 1.2$ , {n, 1, 1000}];
t = 30; x0 = 100;
exactmean :=  $1 / (1.2 - 1)$ 
TotCust = {};
Do[s = 0; NumCust = x0; n = NumCust;
  Label[start];
  r = Random[ExponentialDistribution[ $\lambda p[n] + \mu p[n]$ ]]; s = s + r;
  If[s ≤ t, If[RandomReal[{0, 1}] <  $\lambda p[n] / (\lambda p[n] + \mu p[n])$ , NumCust = NumCust + 1;
    n = NumCust;
    Goto[start], NumCust = NumCust - 1;
    n = NumCust;
    Goto[start]]];
  AppendTo[TotCust, NumCust]
, {1000}]
Print["The average mean is ", Mean[TotCust] // N]
Print["The exact mean is ", exactmean]

```

The average mean is 5.236

The exact mean is 5.

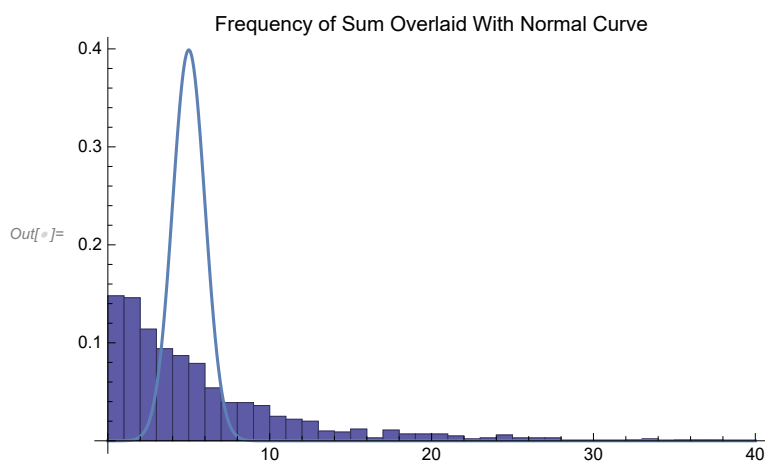
- (b) Calculate probability frequencies of population size at $t = 30$ for $n = 1000$ samples and graph the frequencies together with the stationary distribution for comparison.

```

In[ ]:= bcount = BinCounts[TotCust, {0, 40, 1}];
Total[bcount]
Show[GeneralizedBarChart[Table[{.5 + (i - 1) * 1, bcount[[i]] / (1 * 1000), 1}, {i, 1, 40}],
  PlotLabel → "Frequency of Sum Overlaid With Normal Curve",
  Plot[ $1 / \sqrt{2 * \text{Pi}} * \text{Exp}[-(x - 5)^2 / 2]$ , {x, 0, 40}, PlotRange → All]]

```

Out[]:= 1000



- (c) Graph a single sample of population evolution in 30 years

`In[]:= Plot[100 * Exp[-1.2 * x] - 5 * (Exp[-1.2 * x] - 1), {x, 0, 30}, PlotRange -> All]`

