

## Recall: Renewal Theory

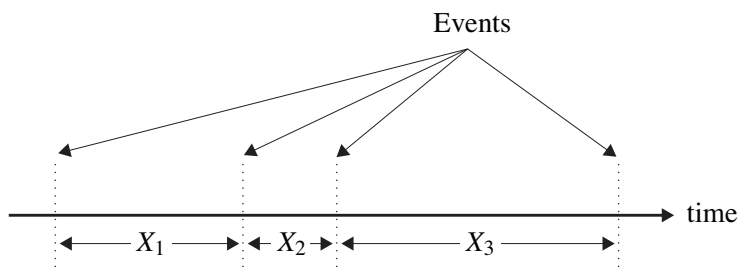


Figure 1: A renewal process. The  $X_i$ 's all have common distribution with mean  $\mathbf{E}[X]$ .

**Recall the Renewal Theorem (Thm 9.33):** Given a renewal process. Let  $0 < \mathbf{E}[X] < \infty$  be the mean time between renewals (events). Let  $N(t)$  be the number of events by time  $t$ . Then, w.p.1:

$$\frac{N(t)}{t} \longrightarrow \text{_____} \text{ as } t \rightarrow \infty$$

## Immediate consequence of Renewal Theorem for DTMCs

**Theorem 9.28:** For a positive recurrent, irreducible DTMC, w.p.1.,

$$p_j \equiv \lim_{t \rightarrow \infty} \frac{N_j(t)}{t} = \text{_____}$$

## Renewal Reward Theory

During  $i$ th renewal, earn reward  $R_i$ .

$R_i$ 's are i.i.d. with mean  $\mathbf{E}[R]$ .

$R_i$  may depend on  $X_i$ .

**Renewal-Reward Theorem 23.4:** Given a renewal-reward process, where  $\mathbf{E}[X]$  is the mean time between renewals and  $\mathbf{E}[R]$  is the mean reward earned during a renewal, where  $0 \leq \mathbf{E}[R] < \infty$  and  $0 < \mathbf{E}[X] < \infty$ .  
Let  $R(t)$ : total reward earned by time  $t$ . Then, with probability 1:

$$\frac{R(t)}{t} \longrightarrow \text{_____ as } t \rightarrow \infty$$

## Proof of Renewal Reward Theorem

**Renewal-Reward Theorem 23.4:** Given a renewal-reward process, where  $\mathbf{E}[X]$  is the mean time between renewals and  $\mathbf{E}[R]$  is the mean reward earned during a renewal, where  $0 \leq \mathbf{E}[R] < \infty$  and  $0 < \mathbf{E}[X] < \infty$ .

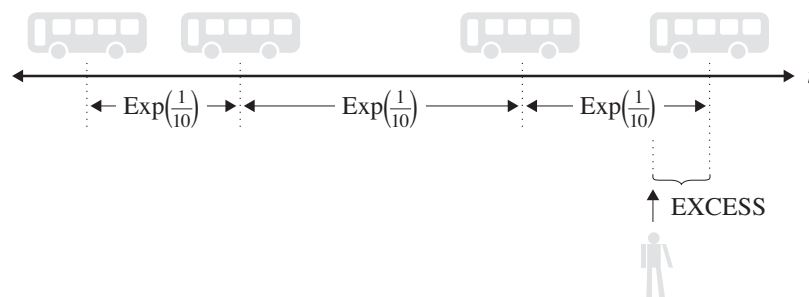
Let  $R(t)$ : total reward earned by time  $t$ . Then, with probability 1:

$$\frac{R(t)}{t} \longrightarrow \text{_____} \text{ as } t \rightarrow \infty$$

FILL IN PROOF:

**GOAL for today:** Closed-form analysis of M/G/1 (not M/PH/1).

## Bus Question



$A_i$ : time between bus  $i$  and bus  $i + 1$ .  $A_i$ 's are i.i.d. where  $A_i \sim \text{Exp}(\frac{1}{10})$ .

**Question:** If I arrive at random time, how long on average do I have to wait for bus?

- (a) 5 minutes?
- (b) 10 minutes?
- (c) 20 minutes?

**Question:** What if  $\mathbf{E}[A] = 10$ , but  $A$  is not Exponentially distributed?

**Definition:** If  $A$  denotes the time between busses, then  $\mathbf{A}_e$  is the **excess of  $A$** , which is the time until the *next* bus, given I arrive at a random time.

## M/G/1 queue

Draw queue where job sizes come from general distribution.  
 $S$  denotes job size.

Consider only times when server is busy.

**Question:** I observe the system at a random time.  
What do we call the remaining size for the job in service?

## Tagged Job Analysis of M/G/1

We “**tag**” an arbitrary Poisson arrival and look at its experience.

$T_Q$  : time in queue

$N_Q$  : number in queue

$N_Q^A$  : number in queue seen by arrival

$S_i$  : service time of the  $i^{th}$  job in the queue

$S$  : service time of a job, where  $\mathbf{E}[S] = \frac{1}{\mu}$

$S_e$ : excess of  $S$ . The remaining service time of the job in service, *given* that there's a job in service.

DERIVE  $\mathbf{E}[T_Q]$ :

## Computing $\mathbf{E}[T_Q]$

$$\mathbf{E}[T_Q] = \frac{\rho}{1 - \rho} \cdot \mathbf{E}[S_e]$$

**Question:** What does this say about M/M/1?

**Question:** What does this say about M/D/1?

**Question:** What does this say about M/ $E_k$ /1?

**Question:** What does this say about M/ $H_2$ /1?

**GOAL:** Need general formula for  $\mathbf{E}[S_e]$  for any distribution  $S$ .

## Commercial Break: Announcements

1. NEED REPLACEMENT GRADER for today. We are short 1 grader today (due to illness). Is anyone else available, or hungry for a free dinner?
2. HW 10 covers Chpt 23, specifically Renewal-Reward. Renewal-Reward problems have short solutions, but require cleverness. You'll need to define a reward process so that you can apply the formula:

$$\lim_{t \rightarrow \infty} \frac{R(t)}{t} = \frac{\mathbf{E}[R]}{\mathbf{E}[X]}.$$

Note that there are 3 terms in this formula. In every problem, you will see that you actually know 2 of the terms and are being asked to find the 3rd term. The difficulty is figuring out which 2 terms you already know.

3. If you have not signed up for a 1-on-1 research meeting with me, please do so. I love to hear how queueing might fit into your research or life!



## Recall: Renewal Reward Theorem

**Renewal-Reward Theorem:** Given a renewal-reward process:

Let  $R(t)$ : total reward earned by time  $t$ .

Let  $X$  denote the time between renewals.

If  $0 \leq \mathbf{E}[R] < \infty$  and  $0 < \mathbf{E}[X] < \infty$ , then, with probability 1,

$$\lim_{t \rightarrow \infty} \frac{R(t)}{t} = \underline{\hspace{2cm}}$$

We will use this to get  $\mathbf{E}[S_e]$ !

The question is how to represent  $\mathbf{E}[S_e]$  as a time-average reward rate.

## Using Renewal Reward Theory to Derive $\mathbf{E}[S_e]$

**Question:** Draw a picture of  $S_e$  as a function of time. Remember server is assumed to be always busy.

**Question:** Express  $\mathbf{E}[S_e]$  as a time average.

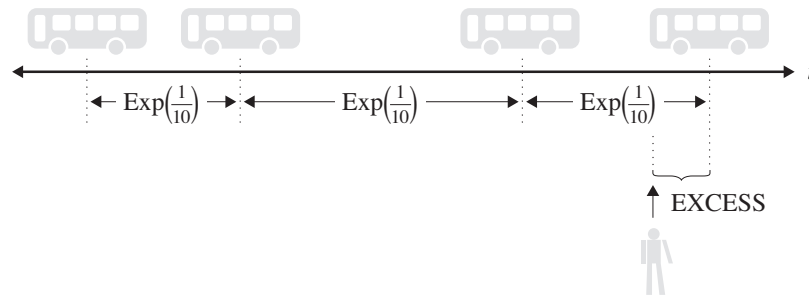
**Question:** Apply Renewal Reward to get  $\mathbf{E}[S_e]$ .

## Pollaczek-Khinchin (P-K) Formula for $\mathbf{E}[T_Q]$

**Question:** What is  $\mathbf{E}[T_Q]$ ?

**Question:** Rewrite  $\mathbf{E}[T_Q]$  in terms of  $C_S^2$ .

## Back to waiting for the bus ...



Assume times between buses are i.i.d. and are denoted by r.v.  $A$ .

**Question:** What is  $\mathbf{E}[A_e]$ ?

**Question:** How high can  $\mathbf{E}[A_e]$  be for general  $A$ ?

**Question:** What is the expected time between buses **as observed by person arriving at random time**?

**Question:** What is the Inspection Paradox? Why does it happen?

**Back to P-K formula. What we've learned about delay?**

FILL IN P-K FORMULA:

**Question:** How does load  $\rho$  influence delay?

**Question:** How does  $C_S^2$  influence delay?

**Question:** Company story: "Utilization is low, so why do I have high delay?"