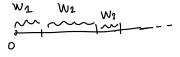
STATS 217: Introduction to Stochastic Processes I

Lecture 6

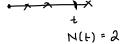
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- For $t \geq 0$, let

$$N(t) = \max\{i : W_1 + \cdots + W_i \le t\}.$$



2/13

a.k.a. interarrival times

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- So, N(t) denotes the number of events that happen by time t.
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2/13

Lecture 6 STATS 217

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- In particular, N(0) = 0.
- It turns out that for all $t \geq 0$,

Randomness
$$N(t) \sim Pois(t)$$
.

comes from some norneg randomness of W_i , integer

Lecture 6 STATS 217

2/13

• For all $t \ge 0$, $N(t) \sim Pois(t)$. Why?

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$$= \int_0^\infty f_{W_1 + \dots + W_j}(s) \mathbb{P}[W_{j+1} > t - s] ds$$

$$\mathbb{P}[W_1 + \dots + W_j \le s]^{n} \text{ if } \mathbb{P}[W_j + y = s]$$

$$\text{amma dishibation}$$

Lecture 6 STATS 217 3 / 13

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Lecture 6 STATS 217 3/13

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= \mathbb{P}[\text{Pois}(t) = j].$$

For
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, let $N(t) = \max\{i : W_1 + \cdots + W_i \leq t\}$.

• We saw that $N(t) \sim \text{Pois}(t)$.

$$\mathcal{S}_{\mathsf{101}} - \mathcal{S}_{\mathsf{100}} \quad \mathcal{S}_{\mathsf{100}$$

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- We also have for any $0 \le s < t$ that

4/13

N(t) - N(s) and $\{N(u)\}_{0 \le u \le s}$ are independent.

Why?

Lecture 6 STATS 217

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 and $\{N(u)\}_{0\leq u\leq s}$ are independent.

• Why? This follows from the memorylessness property of the exponential distribution.

4/13 Lecture 6 STATS 217

For any $0 \le s < t$ that

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 and $\{N(u)\}_{0 \le u \le s}$ are independent.

- Suppose N(s) = k and the **arrival times** before s are $0 \le \alpha_1 \le \cdots \le \alpha_k \le s$.
- This just means that $W_1=\alpha_1,W_1+W_2=\alpha_2,\ldots,W_1+\cdots+W_k=\alpha_k$.

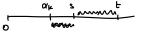
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- This just means that $W_1 = \alpha_1, W_1 + W_2 = \alpha_2, \dots, W_1 + \dots + W_k = \alpha_k$.
- Since N(s) = k, we must have $W_{k+1} \ge s \alpha_k$.
- But by the memorylessness property of the exponential distribution $\mathbb{P}[W_{k+1} > s \alpha_k + t \mid W_{k+1} > s \alpha_k] = \mathbb{P}[W_{k+1} > t] = e^{-t}.$
- So, the waiting times for arrivals after s are iid Exp(1) random variables which are independent of $\{N(u)\}_{0 \le u \le s}$.

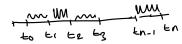
Lecture 6 STATS 217 5 / 13

The Poisson Point Process

Let $\lambda > 0$. A collection of random variables $\{N(s), s \ge 0\}$ is said to be a **Poisson** point process with rate λ if length of int is t.

- N(0) = 0. (NORMALIZATION)
- $N(t+s) N(s) \sim Pois(\lambda t)$,
- N(t) has independent increments, i.e., for any $t_0 < t_1 < \cdots < t_n$,

$$N(t_1)-N(t_0), N(t_2)-N(t_1), \ldots, N(t_n)-N(t_{n-1})$$
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6/13

Lecture 6 STATS 217

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 are independent.

We already saw above that taking $W_0=0,\ W_1,W_2,\dots$ to be iid $\mathsf{Exp}(\lambda)$ and

$$N(s) := \max\{i : W_1 + \dots + W_i \le s\}$$

gives a Poisson process with rate λ .

Lecture 6 STATS 217 6/13

In fact, our construction of the PPP is unique.

start with PPP
" Reverse our
construction"

In fact, our construction of the PPP is unique.

- Let $\{N(s)\}_{s>0}$ be a Poisson point process with rate λ .
- Let $\alpha_0 = 0$.
- For $i \geq 1$, let $\alpha_i := \inf\{t : N(t) = i\}$.



- So, α_i is the (random) i^{th} arrival time i.e. the time that the i^{th} event happens.
- Let $W_i = \alpha_i \alpha_{i-1}$ denote the (random) waiting time for the i^{th} event.

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- Let $W_i = \alpha_i \alpha_{i-1}$ denote the (random) waiting time for the i^{th} event.
- Then, W_1, W_2, \ldots , are iid $\text{Exp}(\lambda)$.

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$$\mathbb{P}[W_{i+1} > t] = \int_0^\infty \mathbb{P}[\alpha_{i+1} - s > t \mid \alpha_i = s] f_{\alpha_i}(s) ds.$$

Note that

$$\alpha_{i+1} - s > t \mid \alpha_i = s \iff N(s+t) - N(s) = 0 \mid N(s) = i.$$

$$\sim \text{Pois}(s+t-s) = \text{Pois}(t)$$

$$\text{Pois}(t) = 0 \text{ } = e^{-t}$$

Lecture 6 STATS 217

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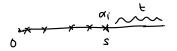
• But by the independent increment property,

$$\mathbb{P}[N(s+t) - N(s) = 0 \mid N(s) = i] = \mathbb{P}[N(s+t) - N(s) = 0]$$
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9/13

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• Since by the independent increments property,

$$\mathbb{P}[W_{i+1} > t \mid \alpha_i = s] = \mathbb{P}[W_{i+1} > t \mid \alpha_i = s, \alpha_{i-1} = *, \dots, \alpha_1 = *],$$

this shows that $W_{i+1} = \alpha_{i+1} - \alpha_i$ is independent of $\alpha_1, \ldots, \alpha_i$, and hence of W_1, \ldots, W_i .

9/13

Lecture 6 STATS 217

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10 / 13

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Lecture 6 STATS 217

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(P2) N(+) - N(s1) ~ Pois () (+-5))

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10 / 13

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Idea: the second and third conditions, together with the Poisson approximation of the Binomial distribution show that indeed, for any $0 \le s \le t$,

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$$N(t) - N(s) \sim \text{Pois}(\lambda(t-s)),$$

and the third condition guarantees independence of increments.

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- For instance, more phone calls start during the day than in the middle of the night.
- In such cases, one can consider the more general condition

$$\mathbb{P}[\text{there is a point in } [t, t + dt]] = \lambda(t) \cdot dt.$$

The inhomogeneous PPP may be described infinitesimally by

- N(t) is the number of points in [0, t].
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3rd description for inhomogeneous III.

what about

$$D(t+s) - D(s)$$

is this also I oissen distributed.

Soning check

indeed, it is.

 $D(t+s) - D(s) \sim D(s) \left(\int_{S} \lambda(u) du \right)$
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Lecture 6 STATS 217 12 / 13

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Let

$$\Lambda(s,t) := \int_s^t \lambda(u) du.$$
 $\Lambda(o,t) = \int_o^t \lambda(u) du$

• $N(t) = N^{\text{hom}}(\Lambda(0, t))$ is an inhomogeneous PPP, where $N^{\text{hom}}(\cdot)$ is a (homogeneous) PPP with rate 1. Why?

$$x L^{T}(0) = 0$$
(*) ind inc. is clear (b/c Nhom has ind.)

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$$N(t+dt) - N(t) = N^{\text{hom}}(\Lambda(0, t+dt)) - N^{\text{hom}}(\Lambda(0, t))$$

 $\approx N^{\text{hom}}(\Lambda(0, t) + \lambda(t)dt) - N^{\text{hom}}(\Lambda(0, t))$

Lecture 6 STATS 217 13 / 13

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$$egin{aligned} \mathcal{N}(t+dt) - \mathcal{N}(t) &= \mathcal{N}^{\mathsf{hom}}(\Lambda(0,t+dt)) - \mathcal{N}^{\mathsf{hom}}(\Lambda(0,t)) \ &pprox \mathcal{N}^{\mathsf{hom}}(\Lambda(0,t) + \lambda(t)dt) - \mathcal{N}^{\mathsf{hom}}(\Lambda(0,t)) \ &pprox \lambda(t)dt. \end{aligned}$$