ESD.86 Random Incidence A Major Source of Selection Bias

> Richard C. Larson February 21, 2007

# Examples

Waiting for a bus at 77 Mass. Avenue.
 – "Clumping"
 Interview passengers disembarking from an airplane.

## **Doctoral Exam Question**

- You arrive at a bus stop where busses arrive according to a Poisson Process with rate λ per unit time.
- Use no-memory property of Poisson processes. Time until next bus arrives has negative exponential density with mean 1/ λ.
- Looking backwards, time since last bus was at the bus stop has negative exponential density with mean 1/ λ.

Thus, mean time between buses is 2/ λ, not 1/ λ. What's wrong here?

#### Random Incidence: Tending to "Land" in Bigger Gaps



Photo courtesy of Kevin King. http://www.flickr.com/photos/divemasterking2000/541537501/



-----





#### **Definitions of the random variables:**

 $Y_i$  = time interval between the *i*<sup>th</sup> and *i* + 1<sup>st</sup> arrival event W = length of the inter-arrival gap in which you fall V = time remaining in the gap in which you fall



All 3 random variables have probability density functions:

$$f_{Y}(x) = f_{Y_{1}}(x) = f_{Y_{2}}(x) = \dots$$

 $f_W(W)$ 

 $f_V(y)$ 

### **The Inter-Arrival Times**

- $f_{Y}(x) = f_{Y_{1}}(x) = f_{Y_{2}}(x) = \dots$
- •If the *Y*<sub>*i*</sub>'s are mutually independent then we have a *renewal process*.
- •But the Random Incidence results we are about to obtain do not require that we have a renewal process.

The Gap We Fall Into by Random Incidence

 $f_W(w)dw = P\{\text{length of gap is between } w \text{ and } w+dw\}$  $f_W(w)dw$  is proportional to two things:

(1) the relative frequency of gaps [w, w+dw]
(2) the length of the gap w (!!).

Thus, normalizing so we have a proper pdf, We can write

 $f_W(w)dw = wf_Y(w)dw/E[Y]$ , or

$$f_W(w) = wf_Y(w)/E[Y]$$

#### Time Remaining in the Gap Until Next Arrival

 $f_V(y)$ 

Consider  $f_{V/W}(y|w)$ 

We can argue that  $f_{V/W}(y|w) = (1/w)$  for 0 < y < w.

So we can write

$$f_{V}(y)dy = dy \int_{y}^{\infty} f_{V|W}(y \mid w) f_{W}(w)dw$$
$$f_{V}(y)dy = dy \int_{y}^{\infty} (1/w) \frac{wf_{Y}(w)}{E[Y]}dw$$
$$f_{V}(y)dy = dy(1 - P\{Y \le y\})/E[Y]$$

## Mean Time Until Next Arrival

$$\begin{split} E[V] &= \int_0^\infty E[V \mid w] f_W(w) dw \\ E[V] &= \int_0^\infty (w/2) \frac{w f_Y(w)}{E[Y]} dw \\ E[V] &= E[Y^2] / (2E[Y]) = \frac{\sigma_Y^2 + E^2[Y]}{2E[Y]} \\ E[V] &= E^2[Y] \frac{1 + \sigma_Y^2 / E^2[Y]}{2E[Y]} = E^2[Y] \frac{1 + \eta^2}{2E[Y]}, \end{split}$$

where  $\eta \equiv \text{coefficient of variation of } Y = \sigma_Y / E [Y].$ 



Key result:

# $E[V] = E[Y]^{2}(1+\eta^{2})/(2E[Y])$

where

 $\eta$  = coefficient of variation of the R.V. Y

Let's Visit Several Examples, Including that Bus Stop Doctoral Exam Question!