

Disc. case study: death penalty
 See. 3 outcome variable (Z): $\begin{cases} 1 & \text{if death} \\ 0 & \text{not death} \end{cases}$
 (effect) predictor variable (X): $\begin{cases} 1 & \text{if defendant white} \\ 0 & \text{not (DB) or (DW)} \end{cases}$
 (cause)
 basic design: Threat to validity: bias
 alternative study factors (PLFs) Z_1, \dots, Z_k

one possible
 $P_{\text{LF}}(Z) = \begin{cases} 1 & \text{if victim white (VW)} \\ 0 & \text{not (VB)} \end{cases}$
 ← victim
 black

as Z changes from VB to VW, quite
 possible that $P(\text{DP}) \uparrow$

as Z changes
 from VB to VW, quite possible that

$P(\text{DW}) \uparrow$
 so Z (ethnicity of victim) is

→ PLF; control for it by holding it constant.

study relationship between DP imposition⁽²⁾
and ethnicity of defendant separately for

VB and VW
+
(bottom)
table
(middle)
table
(top)
table

naiive analysis based
only on top (aggregate)
table:

if a number is chosen at random

$$P(DP) = \frac{36}{326} \approx 11.0\%$$

$$P(DP|DW) = \frac{19}{160} \approx 11.9\%$$

$$P(DP|DB) = \frac{17}{166} \approx 10.2\%$$

it appears that
white defendants
receive the death
penalty more often
than black defendants,
which is a surprise

analysis of middle table (VW)

$$P(DP|VW) = \frac{30}{214} \approx 14.0\%$$

$$P(DP|VW, DW) = \frac{19}{151} \approx 12.6\%$$

$$P(DP|VW, DB) = \frac{11}{63} \approx 17.5\%$$

holding ethnicity
of victim constant
at white, the rate
of imposition of
the death penalty

rises (!), from 11.0% (+, top table) to 14.0%, and
now black defendants get the DP more often than
white defendants.

analysis of bottom table (VB) ③

$$P(DP | VB) = \frac{6}{112} = 5.4\%$$

$$P(DP | VB, JW) = \frac{0}{9} = 0\%$$

$$P(DP | VB, JB) = \frac{6}{103} = 5.8\%$$

holding ethnicity, further constant at Black, the rate of imposition of the death penalty falls (!), from 11.0% (top table) to 5.4%, and (again) now Black defendants get the DP more often than White defendants.

so: overall, in the aggregate (top table), as ethnicity of defendant moves from Black to white, $P(DP)$ goes up, but separately for each of VW (middle table) and VB (bottom table), as ethnicity of defendant moves from Black to white, $P(DP)$ goes down (i.e., the relationship reverses direction). This is Simpson's Paradox, and ~~means~~ nothing paradoxical going on.

Why did this happen? ① Murder victims typically know their murderer.

② In the U.S., white people tend to hang out with white people, and Black with Black. [③ Therefore white defendants are mostly murdering white victims.]

④ Judges & juries in the U.S. impose the death penalty more often when the victim is white than when the victim is Black.

Homework for you, not to turn in:

Show that ethnicity is indeed a PEF here, by computing and comparing

$$P(DP)$$

$$P(DP|VB)$$

$$P(DP|Vw)$$

$$P(DM)$$

$$P(DM|VB)$$

$$P(DM|Vw)$$

ex. T-S case study : $\Sigma = \# \text{ of T-S baby} \quad \textcircled{5}$

Σ follows the Binomial distribution
T-S not

with parameters $n = \# \text{ children}$

and $p = P(\text{T-S baby on any 1 child})$

$$P(\Sigma = y) = \begin{cases} \binom{n}{y} p^y (1-p)^{n-y} & \text{for } y = 0, 1, \dots, n \\ 0 & \text{else} \end{cases}$$

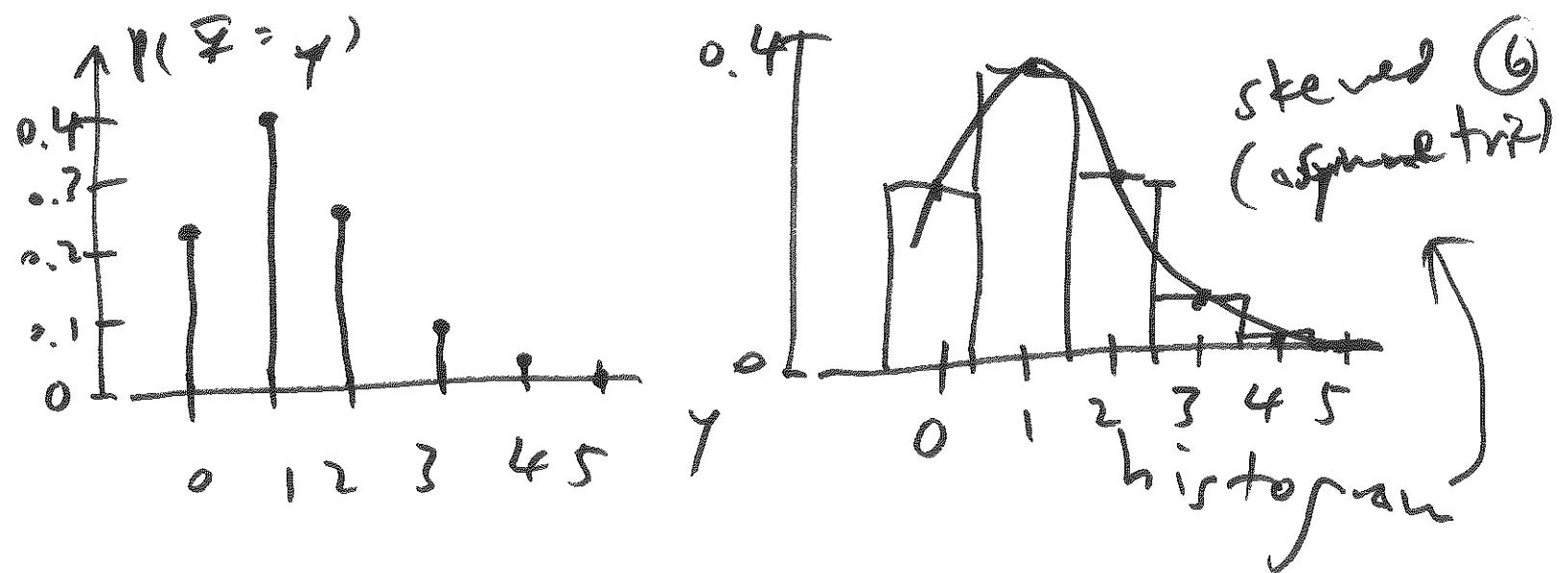
dbinom
computes these

$y \in \{0, 1, 2, 3, 4, 5\}$ is called the support
of the r.v. Σ

ex. $(n=5, p=\frac{1}{4})$

rbinom generates pseudo-random
random samples from $\text{Binomial}(n, p)$

$(\Sigma \text{ follows the Binomial}) \leftrightarrow (\Sigma | n, p) \sim \text{Binomial}(n, p)$



of replicates =

1,000,000

the entire family

$\text{Binomial}(n, p) : \{ n = 1, 2, \dots \}$

$$0 \leq p \leq 1$$

