



Opinionated Lessons in Statistics

by Bill Press

#4 The Jailer's Tip

Our next topic is **Bayesian Estimation of Parameters**. We'll ease into it with an example that looks a lot like the Monte Hall Problem:



The Jailer's Tip:

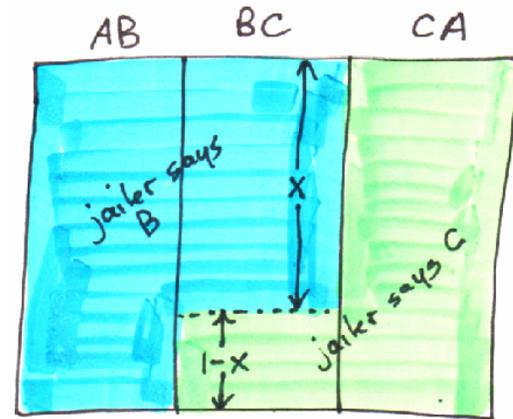
- Of 3 prisoners (A,B,C), 2 will be released tomorrow.
- A, who thinks he has a $2/3$ chance of being released, asks jailer for name of one of the lucky – but not himself.
- Jailer says, truthfully, “B”.
- “Darn,” thinks A, “now my chances are only $1/2$, C or me”.

Is this like Monty Hall? **Did the data (“B”) change the probabilities?**

Further, suppose (unlike Monty Hall) the jailer is not indifferent about responding “B” versus “C”. Does that change your answer to the previous question?

$$P(S_B|BC) = x, \quad (0 \leq x \leq 1)$$

“says B”



$$\begin{aligned}
 P(A|S_B) &= P(AB|S_B) + P(\cancel{AC|S_B}) \\
 &= \frac{P(\cancel{S_B|AB})P(\cancel{AB})}{P(S_B|AB)P(AB) + P(\cancel{S_B|BC})P(\cancel{BC}) + P(S_B|CA)P(CA)} \\
 &= \frac{\frac{1}{3}}{1 \cdot \frac{1}{3} + x \cdot \frac{1}{3} + 0} = \frac{1}{1+x}
 \end{aligned}$$

So if A knows the value x , he can calculate his chances.

If $x=1/2$ (like Monty Hall), his chances are $2/3$, same as before; so (unlike Monty Hall) he got no new information.

If $x \neq 1/2$, he does get new info – his chances change.

But what if he doesn't know x at all?

“Marginalization” (this is important!)

- When a model has unknown, or uninteresting, parameters we “integrate them out” ...
- ...multiplying by any knowledge of their distribution
 - At worst, just a prior informed by background information
 - At best, a narrower distribution based on data
- This is not any new assumption about the world
 - it’s just the Law of de-Anding

(e.g., Jailer’s Tip):

$$\begin{aligned} P(A|S_B I) &= \int_x P(A|S_B x I) p(x|I) dx \\ &= \int_x \frac{1}{1+x} p(x|I) dx \end{aligned}$$

law of de-Anding:
x’s are EME!



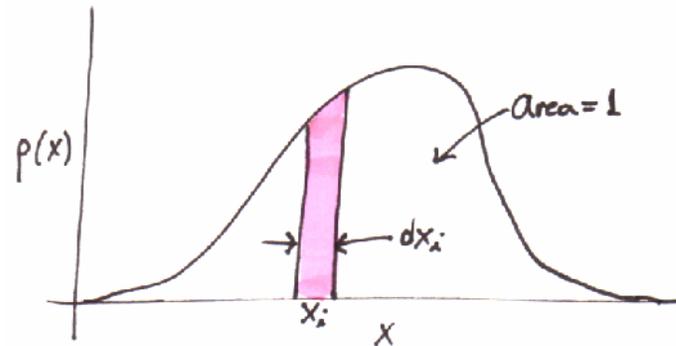
(repeating previous equation:)

$$\begin{aligned} P(A|S_B I) &= \int_x P(A|S_B x I) p(x|I) dx \\ &= \int_x \frac{1}{1+x} p(x|I) dx \end{aligned}$$

first time we've seen a *continuous* probability distribution, but we'll skip the obvious repetition of all the previous laws

$$p(x) \equiv p(x|I)$$

(Notice that $p(x)$ is a probability of a probability!
That is fairly common in Bayesian inference.)



$$\sum_i P_i = 1 \leftrightarrow \sum_i p(x_i) dx_i = 1 \leftrightarrow \int_x p(x) dx = 1$$

(repeating previous equation:)

$$\begin{aligned} P(A|S_B I) &= \int_x P(A|S_B x I) p(x|I) dx \\ &= \int_x \frac{1}{1+x} p(x|I) dx \end{aligned}$$

What should Prisoner A take for $p(x)$?
Maybe the “uniform prior”?

$$\begin{aligned} p(x) &= 1, \quad (0 \leq x \leq 1) \\ P(A|S_B I) &= \int_0^1 \frac{1}{1+x} dx = \ln 2 = 0.693 \end{aligned}$$



Not the same as the “massed prior at $x=1/2$ ”

$$\begin{aligned} p(x) &= \delta(x - \frac{1}{2}), \quad (0 \leq x \leq 1) \\ P(A|S_B I) &= \frac{1}{1+1/2} = 2/3 \end{aligned}$$

“Dirac delta function”

← substitute value and remove integral