## Class 16 in-class problems, 18.05, Spring 2022

## Concept questions

## Concept question 1. Increasing probability

To convert an $80 \%$ probability interval to a $90 \%$ interval should you shrink it or stretch it?

1. Shrink 2. Stretch.

Solution: 2. Stretch. A bigger probability requires a bigger interval.

## Board questions

## Problem 1. Treating severe respiratory failure*

Two treatments for newborns with severe respiratory failure.

1. CVT: conventional therapy (hyperventilation and drugs)
2. ECMO: extracorporeal membrane oxygenation (invasive procedure)

In 1983 in Michigan:
19/19 ECMO babies survived and 0/3 CVT babies survived.
Later Harvard ran a randomized study:
28/29 ECMO babies survived and 6/10 CVT babies survived.
*Adapted from Statistics: a Bayesian Perspective by Donald Berry
Name the probabilites of survival:
$\theta_{E}=$ probability that an ECMO baby survives
$\theta_{C}=$ probability that a CVT baby survives.
Consider the values 0.125, 0.375, 0.625, 0.875 for $\theta_{E}$ and $\theta_{C}$.
(a) Make the $4 \times 4$ prior table for a flat prior.
(b) Based on the Michigan results, create a reasonable informed prior table for analyzing the Harvard results (unnormalized is fine).
(c) Make the likelihood table for the Harvard results. (You might use $R$ to compute some of the values.)
(d) Find the posterior table for the informed prior.
(e) Using the informed posterior, compute the probability that ECMO is better than CVT.
(f) Also compute the posterior probability that $\theta_{E}-\theta_{C} \geq 0.6$.
(The posted solutions will also show 4-6 for the flat prior.)
Solution: (a) Flat prior

|  |  | $\theta_{E}$ |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | 0.125 | 0.375 | 0.625 | 0.875 |
| $\theta_{C}$ | 0.125 | 0.0625 | 0.0625 | 0.0625 | 0.0625 |
|  | 0.375 | 0.0625 | 0.0625 | 0.0625 | 0.0625 |
|  | 0.625 | 0.0625 | 0.0625 | 0.0625 | 0.0625 |
|  | 0.875 | 0.0625 | 0.0625 | 0.0625 | 0.0625 |

(b) Informed prior (This table is unnormalized)

|  |  | $\theta_{E}$ |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | 0.125 | 0.375 | 0.625 | 0.875 |
| $\theta_{C}$ | 0.125 | 18 | 18 | 32 | 32 |
|  | 0.375 | 18 | 18 | 32 | 32 |
|  | 0.625 | 18 | 18 | 32 | 32 |
|  | 0.875 | 18 | 18 | 32 | 32 |

Rationale: Since $19 / 19 \mathrm{ECMO}$ babies survived we believe $\theta_{E}$ is probably near 1.0. That $0 / 3$ CVT babies survived is not enough data to move from a uniform distribution. (Or we might distribute a little more probability to larger $\theta_{C}$.) So for $\theta_{E}$ we split $64 \%$ of probability in the two higher values and $36 \%$ for the lower two. Our prior is the same for each value of $\theta_{C}$.

## (c) Likelihood

Entries in the likelihood table: $c \theta_{E}^{28}\left(1-\theta_{E}\right) \theta_{C}^{6}\left(1-\theta_{C}\right)^{4}$. The constant $c$ is computed from binomial coefficients. It is unimportant for updating. The table was computed using $R$.

|  |  | $\theta_{E}$ |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | 0.125 | 0.375 | 0.625 | 0.875 |
| $\theta_{C}$ | 0.125 | $6.160 \mathrm{e}-28$ | $1.007 \mathrm{e}-14$ | $9.835 \mathrm{e}-09$ | $4.048 \mathrm{e}-05$ |
|  | 0.375 | $1.169 \mathrm{e}-25$ | $1.910 \mathrm{e}-12$ | $1.866 \mathrm{e}-06$ | $7.682 \mathrm{e}-03$ |
|  | 0.625 | $3.247 \mathrm{e}-25$ | $5.306 \mathrm{e}-12$ | $5.184 \mathrm{e}-06$ | $2.134 \mathrm{e}-02$ |
|  | 0.875 | $3.019 \mathrm{e}-26$ | $4.932 \mathrm{e}-13$ | $4.819 \mathrm{e}-07$ | $1.984 \mathrm{e}-03$ |

## Extra: flat posterior

The posterior table is found by multiplying the prior and likelihood tables and normalizing so that the sum of the entries is 1 . We call the posterior derived from the flat prior the flat posterior. (Of course the flat posterior is not itself flat.)

|  |  | $\theta_{E}$ |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | 0.125 | 0.375 | 0.625 | 0.875 |
| $\theta_{c}$ | 0.125 | $1.984 \mathrm{e}-26$ | $3.242 \mathrm{e}-13$ | $3.167 \mathrm{e}-07$ | 0.001 |
|  | 0.375 | $3.765 \mathrm{e}-24$ | $6.152 \mathrm{e}-11$ | $6.011 \mathrm{e}-05$ | 0.247 |
|  | 0.625 | $1.046 \mathrm{e}-23$ | $1.709 \mathrm{e}-10$ | $1.670 \mathrm{e}-04$ | 0.687 |
|  | 0.875 | $9.721 \mathrm{e}-25$ | $1.588 \mathrm{e}-11$ | $1.552 \mathrm{e}-05$ | 0.0639 |

The boxed entries represent most of the probability where $\theta_{E}>\theta_{C}$.
All our computations were done in R . For the flat posterior:
Probability ECMO is better than CVT is

$$
\begin{aligned}
& P\left(\theta_{E}>\theta_{C} \mid \text { Harvard data }\right)=0.936 \\
& P\left(\theta_{E}-\theta_{C} \geq 0.6 \mid \text { Harvard data }\right)=0.001
\end{aligned}
$$

(d) Informed posterior

|  |  | $\theta_{E}$ |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | 0.125 | 0.375 | 0.625 | 0.875 |
| $\theta_{C}$ | 0.125 | $1.116 \mathrm{e}-26$ | $1.823 \mathrm{e}-13$ | $3.167 \mathrm{e}-07$ | 0.001 |
|  | 0.375 | $2.117 \mathrm{e}-24$ | $3.460 \mathrm{e}-11$ | $6.010 \mathrm{e}-05$ | 0.2473 |
|  | 0.625 | $5.882 \mathrm{e}-24$ | $9.612 \mathrm{e}-11$ | $1.669 \mathrm{e}-04$ | 0.6871 |
|  | 0.875 | $5.468 \mathrm{e}-25$ | $8.935 \mathrm{e}-12$ | $1.552 \mathrm{e}-05$ | 0.0638 |

For the informed posterior:

$$
\begin{aligned}
P\left(\theta_{E}>\theta_{C} \mid \text { Harvard data }\right) & =0.936 \\
P\left(\theta_{E}-\theta_{C} \geq 0.6 \mid \text { Harvard data }\right) & =0.001
\end{aligned}
$$

Note: Since both flat and informed prior gave essentially the same answers, we gain confidence that these calculations are robust. That is, they are not too sensitive to our exact choice of prior.

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### 18.05 Introduction to Probability and Statistics

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