

# Exercises for Thursday, first hour

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**Variational approximation** Two random variables  $X$  and  $Y$  interact according to the joint probability table on the right. We will call this probability distribution  $P$  and approximate it by a distribution  $Q$  which assumes that  $X$  and  $Y$  are independent.

$P(X, Y)$	$X = 1$	$X = 2$
$Y = 1$	0	1/2
$Y = 2$	1/4	1/4

1. Which distribution over independent  $X$  and  $Y$  minimizes  $D(Q || P)$ ?
2. Which distribution over independent  $X$  and  $Y$  minimizes  $D(P || Q)$ ?

**Competitive prediction** Two scientists compete about assigning good probability estimates to the outcomes of a random process. One scientist believes that the process is a series of coin flips with bias  $\theta = .6$ , and the other believes that it is a series of coin flips with bias  $\theta = .2$ . The process is in fact a coin flipping process, but the coin actually has a bias of  $\theta = .5$ .

We measure the relative performance of the two scientists by looking at the likelihood ratio between their respective probability estimates,

$$\frac{\Pr(x_1, x_2, \dots, x_k | \theta = .6)}{\Pr(x_1, x_2, \dots, x_k | \theta = .2)}$$

We consider one scientist as substantially better than the other if this likelihood ratio exceeds 20 or drops below  $1/20$ .

Roughly how many coin flips should it take before this happens?

**A substitution cipher** Crack the following substitution cipher:

GWAL VLITG IEW -- HLCLT ARHO UWF MWHE NTLBRGLMV -- UICRHE  
MRDDML WT HW AWHLV RH AV NYTGL, IHO HWDURHE NITDRBYMIT DW  
RHDLTGLD AL WH GUWTL, R DUWYEUD R FWYMO GIRM IPWYD I MRDDML  
IHO GLL DUL FIDLTV NITD WS DUL FWTMO. RD RG I FIV R UICL WS  
OTRCRHE WSS DUL GNMLLH IHO TLEYMIDRHE DUL BRTBYMIDRWH.

Spaces and punctuation have been left unencrypted to make things easier. The underlying plaintext string is in capitalized English.