

Answer to Bayesian Practice Exercise

The log likelihood for the sample is

$$\ell(\beta, \sigma; y, x) = \sum_{j=1}^6 \left\{ \left(\frac{(y_j - x_j \beta)^2}{2\sigma^2} - \log(\sigma \sqrt{2\pi}) \right) \mathcal{I}(y_j > 0) + \log \left(\Phi \left(\frac{-x_j \beta}{\sigma} \right) \right) \mathcal{I}(y_j = 0) \right\}. \quad (1)$$

Once this is in hand, the rest of the assignment is just a matter of getting the computer to draw the contours. A program to compute the log likelihood in matlab is listed below. It is set up to take vector arguments and to return the whole matrix of values of ℓ for different β 's and σ 's in a single function call.

After the program listing, there are contour plots for the three cases in the problem set and for an additional case, with $y = [0, 0, 0.3760, 0.8630, 0, 3.5727]$, that was generated as a random draw from a model with $\beta = 0$.

Program listing

```
function [lhnaive, lh, llh, mle, mler, mlec]=TobitEx(y,x,b,sigma)
%function [lhnaive, lh, llh, mle, mler, mlec]=TobitEx(y,x,b,sigma)
[B,S]=meshgrid(b,sigma);
ny=length(y);
u=(repmat(y,[1 size(B)])-repmat(x,[1,size(B)]).*rrepmat(B,ny,1))...
./rrepmat(S,ny,1);
zindex=find(y==0);
nzindex=find(y~=0);
nz=length(zindex);
nnz=length(nzindex);
llh=sum(-.5*u(nzindex,:).^2)-sum(log(rrepmat(S,nnz,1))-.5*log(2*pi));
uz=u(zindex,:);
llh2=sum(log(max(.5*(erf(uz/sqrt(2))+1),1e-200)));
llh=squeeze(llh+llh2);
[mx,ix]=max(llh);
[mle,mlec]=max(mx);
mler=ix(mlec);
lh=exp(llh-mle);
lhnaive=sum(-.5*u.^2)-sum(log(rrepmat(S,6,1))-.5*log(2*pi));
mlen=max(max(lhnaive));
lhnaive=exp(squeeze(lhnaive)-mlen);
```

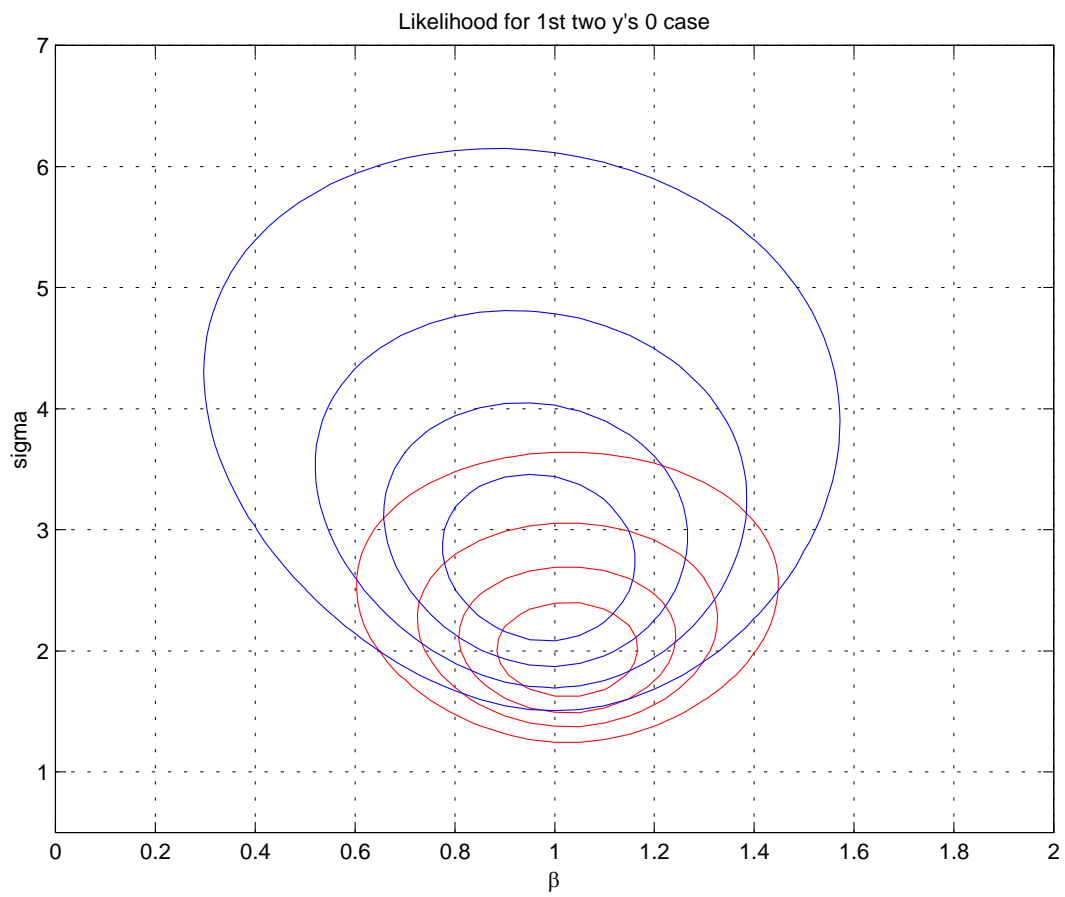


FIGURE 1. Likelihood b (red is naive OLS likelihood)

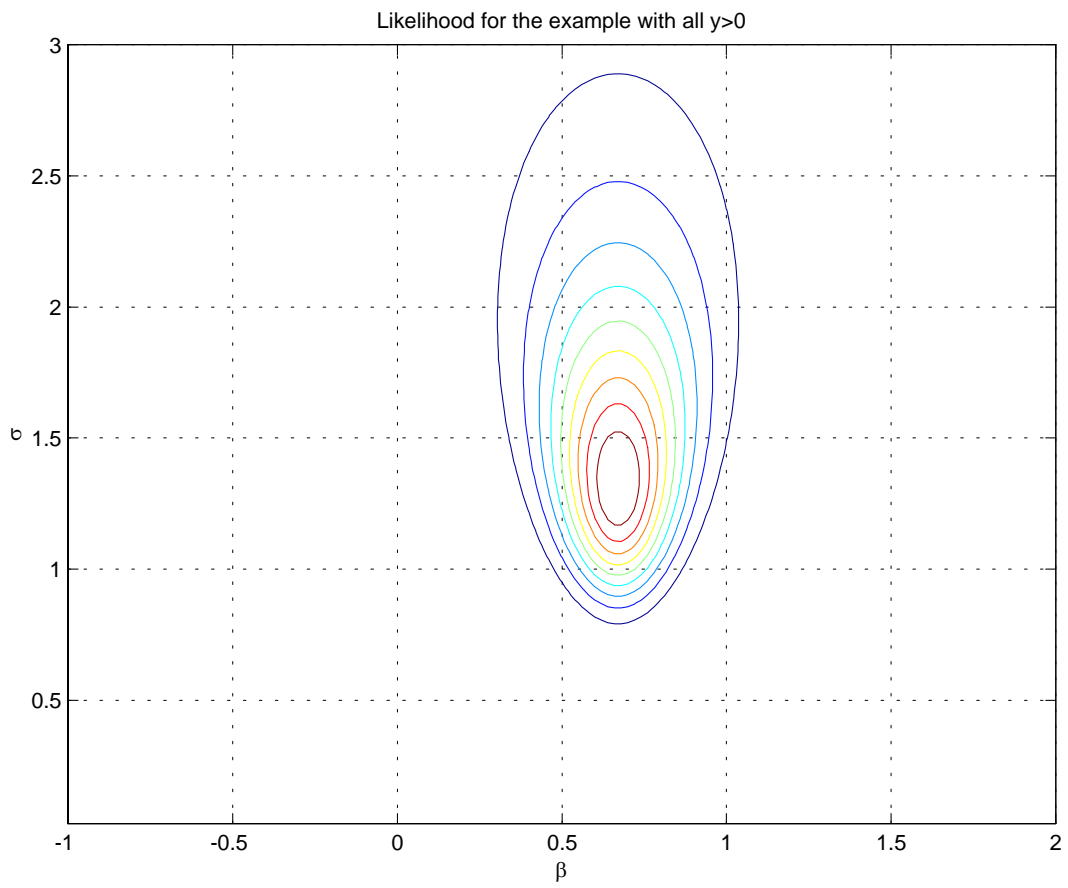


FIGURE 2. Likelihood c

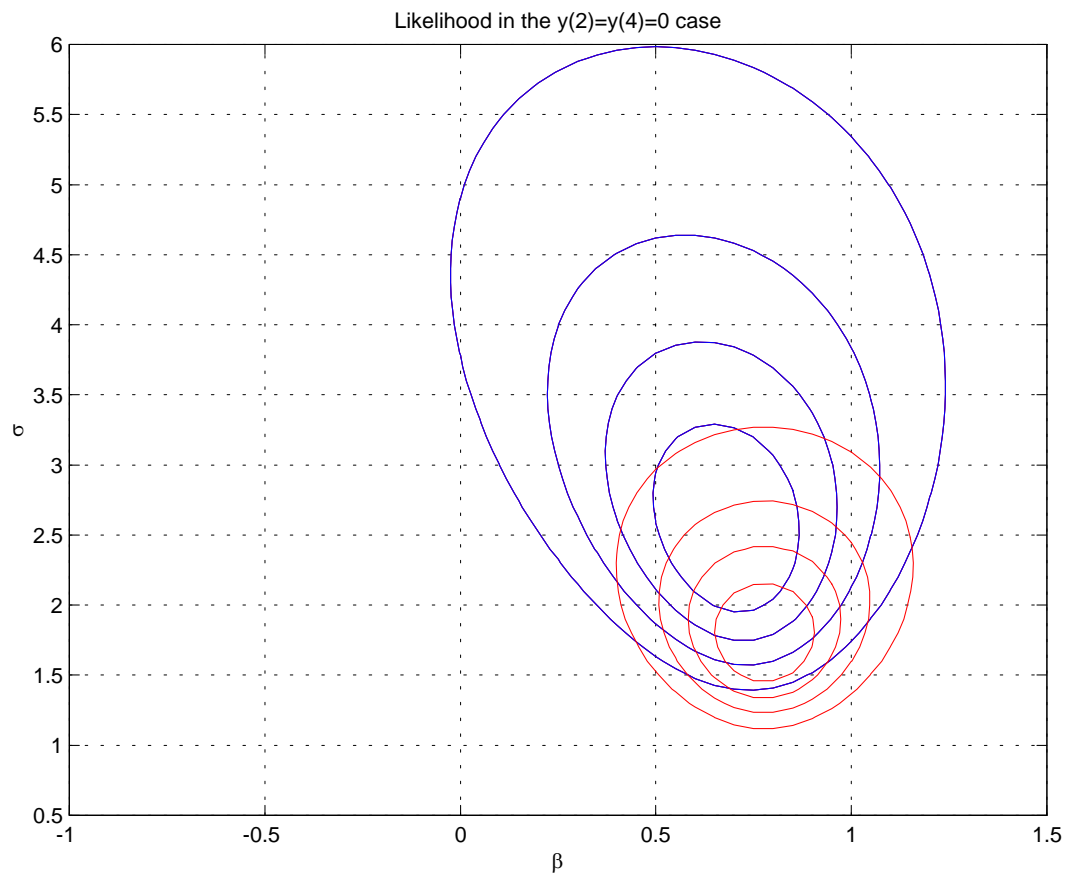


FIGURE 3. Likelihood d , (red is naive OLS likelihood)

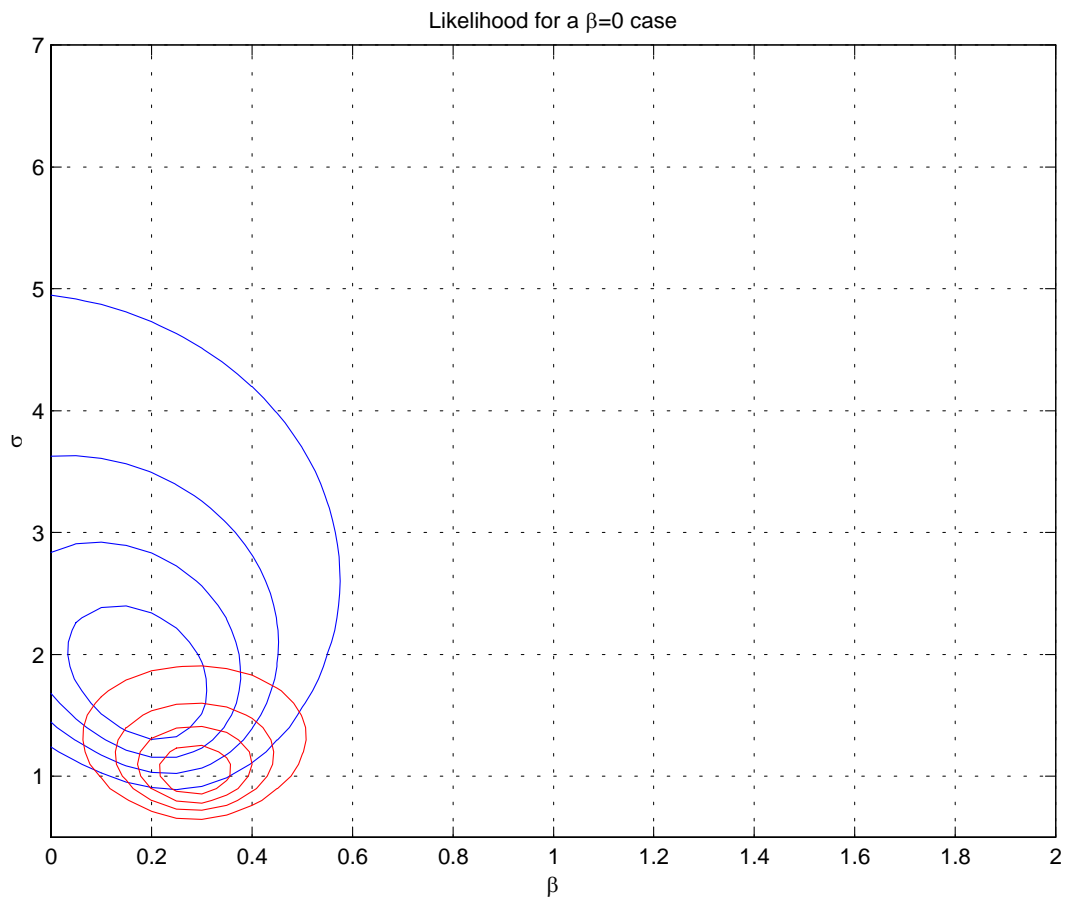


FIGURE 4. Likelihood for $\beta=0$ sample