

## Problem Set #1

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The file `yss.csv` contains data generated from the following state space models:

$$\begin{aligned}x_{t+1} &= g_0 + g_1 x_t + \varepsilon_{t+1}, & \varepsilon_t &\sim N(0, \sigma_\varepsilon^2) \\ y_t &= h_0 + h_1 x_t + \eta_t, & \eta_t &\sim N(0, \sigma_\eta^2)\end{aligned}$$

Let  $\theta = \{g_0, g_1, \sigma_\varepsilon, h_0, h_1, \sigma_\eta\}$ . Estimate  $\theta$  under these two scenarios:

1. Flat prior on  $\theta$ , that is,  $p(\theta) \propto 1$ . For this scenario report the MLE and the asymptotic standard errors.
2. An informative prior with marginals

$$\begin{aligned}g_0 &\sim N(0, 100), & g_1 &\sim \text{Beta}(5, 1.4), & \sigma_\varepsilon &\sim \Gamma(1, 1.5) \\ h_0 &\sim N(0, 100), & h_1 &\sim \text{Beta}(5, 1.4), & \sigma_\eta &\sim \Gamma(1, 1.5)\end{aligned}$$

For each scenario report evidence that the Metropolis Hastings algorithm has converged and report the 95% credible region.

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The file `yss.csv` can be read by `Y = readcsv("Y.csv")`.

The following is a simple implementation of a (univariate) Kalman Filter which outputs both the likelihood and the filtered values of  $x_t$ . This can be easily adapted to maximum likelihood estimation and to Bayesian estimation.

```
function kf(g0, g1, m1, sigmae, h0, h1, sigmaeta, y)
    ##
    ## x[t+1] = g0 + g1*x[t] + m*(sigmae * [t])
    ## y[t] = h0 + h1*x[t] + sigmaeta*[t]
    ##
    ## Initialize at the long run mean and variance
    ## given parameters
    x0 = g0/(1-g1)
```

```

s0 = (m1*sigmae)^2/(1-g1^1)
T = size(y,1)
# x_{t/t}
filt = Array{Float64}(T+1)
pred = Array{Float64}(T+1)
Pt = Array{Float64}(T+1)
Ptt = Array{Float64}(T+1)
filt[1] = x0
Ptt[1] = s0

for j=1:T
    ## Predictions step
    pred[j] = g0+g1*filt[j]
    Pt[j] = g1*Ptt[j]*g1+m1^2*sigmae^2
    ## Updating step
    K = Pt[j]*h1*(h1^2*Pt[j]+sigmaeta^2)^(-1)
    filt[j+1] = pred[j] + K*(y[j]-h0-h1*pred[j])
    Ptt[j+1] = Pt[j] - K*(h1*Pt[j])
end

mu = h0+h1*pred
sd = h1*Pt*h1+sigmaeta^2
loglik = -T*log(2*sigmaeta^2)/2+sum(-log(sd[1:T])/2-(y-mu[1:T]).^2./(2*sd[1:T]));

loglik, filt
end

loglik, x = kf(g0, g1, 1.0, 1.0, h0, h1, 1.0, y)

```