

BUSI 525 Problem Set #3

Finite Sample Bias in Predictive Regressions

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```
In [1]: using Plots, Random, Statistics, Bootstrap, Distributions, LinearAlgebra, StatsBase

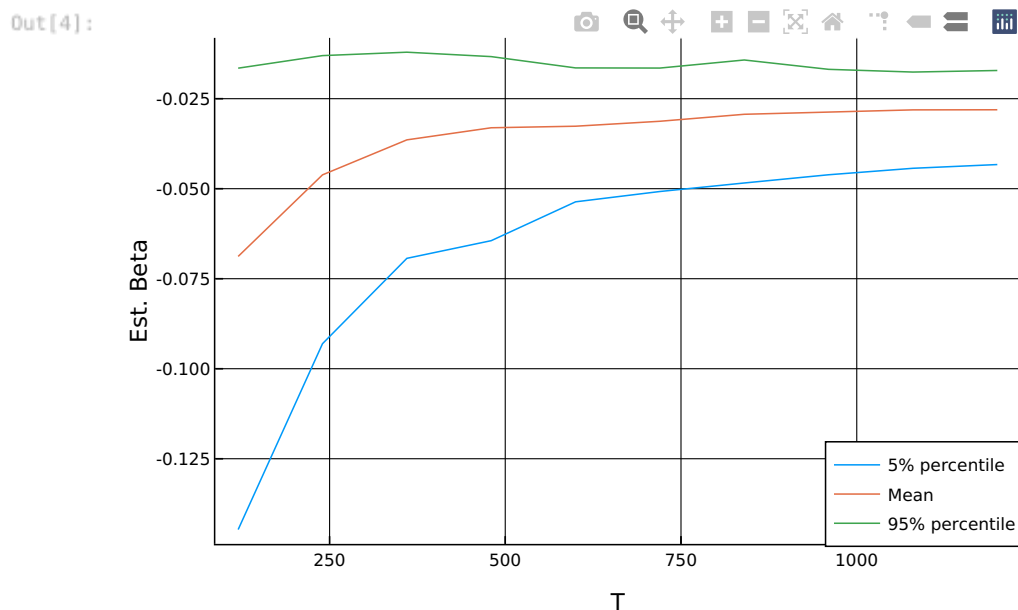
function Stambaugh(T, rho_uv; B=250, alpha=0.0, beta=0.015, sigma_u=0.053, theta=0, sigma_v=0.044, rho=0.98)
    d1 = MvNormal(zeros(2), [sigma_u^2, rho_uv*sigma_u*sigma_v; rho_uv*sigma_u*sigma_v, sigma_v^2])
    est_beta = zeros(B)
    for b = 1:B
        uv = rand(d1, T)
        u = uv[1,:]
        v = uv[2,:]
        x = zeros(T)
        r = zeros(T)
        for t = 1:T
            if t == 1
                x[t] = theta + rho*0.0 + v[t]
                r[t] = alpha + beta*0.0 + u[t]
            else
                x[t] = theta + rho*x[t-1] + v[t]
                r[t] = alpha + beta*x[t-1] + u[t]
            end
        end
        X = hcat(ones(T), x)
        estimator = (X'X)\(X'r)
        est_beta[b] = estimator[2]
    end
    beta_percentiles = [percentile(est_beta, 5), mean(est_beta), percentile(est_beta, 95)]
    return beta_percentiles
end
```

```
└ Info: Precompiling Plots [91a5bccdd-55d7-5caf-9e0b-520d859cae80]
└ @ Base loading.jl:1317
```

Out[1]: Stambaugh (generic function with 1 method)

Part 1: Finite Sample Bias

```
In [4]: Ts = 120:120:1200
beta_plots = zeros(length(Ts), 3)
for i=1:length(Ts)
    beta_plots[i, :] = Stambaugh(Ts[i], -0.8)
end
plotlyjs();
p1 = plot(xlabel="T", ylabel="Est. Beta", legend=:bottomright)
p1 = plot!(Ts, beta_plots[:, 1], label = "5% percentile")
p1 = plot!(Ts, beta_plots[:, 2], label = "Mean")
p1 = plot!(Ts, beta_plots[:, 3], label = "95% percentile")
```

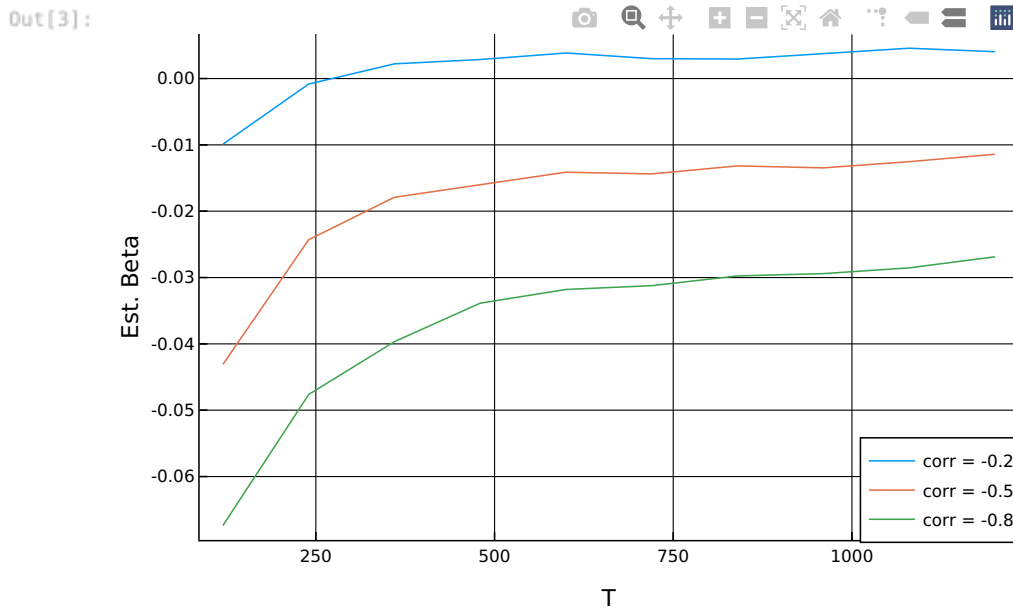


The larger T becomes, the smaller bias is in absolute sense. The 95 percentile of the biases approaches to zero. However, the gain is not significant if we have more than 1000 observations and the estimator has negative bias.

Part 2 - Effect of residual correlation

```
In [3]: rho_uvs = [-0.2,-0.5,-0.8]
beta_plots_corr = zeros(length(Ts),length(rho_uvs))
for j = 1:length(rho_uvs)
    for i=1:length(Ts)
        beta_plots_corr[i,j]=Stambaugh(Ts[i],rho_uvs[j])[2]
    end
end

p2 = plot(xlabel="T",ylabel="Est. Beta",legend=:bottomright)
p2 = plot!(Ts,beta_plots_corr[:,1],label = "corr = -0.2")
p2 = plot!(Ts,beta_plots_corr[:,2],label = "corr = -0.5")
p2 = plot!(Ts,beta_plots_corr[:,3],label = "corr = -0.8")
```



As the correlation between the errors becomes stronger, the estimates have larger negative bias. Larger sample size mitigates the bias.

In []: