

Skill and Luck in Performance Evaluation -Fama/French (2010)

Taisei Noda [GitHub Link](#)

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In [1]: using CSV, Plots, JuMP, Random, Statistics, Bootstrap, Distributions, LinearAlgebra, Dates, DataFrames, Gurobi, DataFrames

function estimateFF(lambda, alpha; N = 1000, T = 120, B = 100, market_return_mean = 0.05/12, market_return_sd = 0.2/sqrt(12),
    market_return_t = randn(T).*market_return_sd.+market_return_mean,
    market_return = zeros(N, T)
    for i = 1:N
        market_return[i, :] = market_return_t[i, :]
    end
    residual = randn(N, T).*residual_sd
    if lambda == 0.0
        true_alphas = zeros(N, T)
    elseif lambda > 0.0
        true_alphas = zeros(N, T)
        for i = 1:floor(Int64, N*lambda)
            true_alphas[i, :] = alpha/12
        end
    end
    fund_return = true_alphas.+market_return.+residual #beta = 1
    estimator = zeros(N, 2)
    est_residual = zeros(N, T)
    t_stats_cross = zeros(N)
    for n = 1:N
        y = fund_return[n, :]
        X = hcat(ones(T), market_return[n, :])
        estimator[n, :] = (X'X)\(X'y)
        est_residual[n, :] = y - X*estimator[n, :]
        ssr = sum((y - X*estimator[n, :]).^2)/length(y)
        var = ssr*inv(X'*X)
        t_stats_cross[n] = estimator[n, 1]/sqrt(var[1, 1])
    end
    bs_estimator = zeros(N, 2)
    bs_alphas = zeros(N, B)
    bs_t_stats = zeros(N, B)
    for b = 1:B
        bootstrap_ts = sample(1:T, T, replace=true)
        bs_market_return = zeros(N, length(bootstrap_ts))
        bs_fund_return = zeros(N, length(bootstrap_ts))
        for t = 1:length(bootstrap_ts)
            bs_market_return[:, t] = market_return[:, bootstrap_ts[t]]
            bs_fund_return[:, t] = true_alphas[:, t] + market_return[:, bootstrap_ts[t]].*estimator[:, 2]
        end
        for n = 1:N
            X = hcat(ones(T), bs_market_return[n, :])
            y = bs_fund_return[n, :]
            bs_estimator[n, :] = (X'X)\(X'y)
            ssr = sum((y - X*estimator[n, :]).^2)/length(y)
            var = ssr*inv(X'*X)
            bs_alphas[n, b] = bs_estimator[n, 1]
            bs_t_stats[n, b] = bs_estimator[n, 1]/sqrt(var[1, 1])
        end
    end
    bs_t_sort = zeros(N, B)
    bs_t_average = zeros(N)
    bs_t_5 = zeros(N)
    bs_t_95 = zeros(N)
    for n = 1:N
        bs_t_sort[n, :] = sort(bs_t_stats[n, :])
        bs_t_average[n] = sum(bs_t_stats[n, :])/length(bs_t_stats[n, :])
        bs_t_5[n] = bs_t_sort[n, floor(Int64, B*0.05)]
        bs_t_95[n] = bs_t_sort[n, floor(Int64, B*0.95)]
    end
    h1 = histogram(t_stats_cross, xaxis = ((-10, 10), -10:2:10), yaxis = ((0, 300), 0:50:300), xlabel="T-stat cross-section", legend=:none)
    h2 = histogram(bs_t_average, xaxis = ((-10, 10), -10:2:10), yaxis = ((0, 300), 0:50:300), xlabel="Bootstrap Average", legend=:none)
    h3 = histogram(bs_t_5, xaxis = ((-10, 10), -10:2:10), yaxis = ((0, 300), 0:50:300), xlabel="Bootstrap 5 percentile", legend=:none)
    h4 = histogram(bs_t_95, xaxis = ((-10, 10), -10:2:10), yaxis = ((0, 300), 0:50:300), xlabel="Bootstrap 95 percentile", legend=:none)
    l1 = @layout [a{.lh}; grid(2, 2)]
    hist = plot(plot(annotation=(0.5, 0.5, text("Lambda = $lambda, Alpha = $alpha", :center, 48)), framestyle=:none), h1, h2, h3, h4, l1)
    return hist
end
```

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

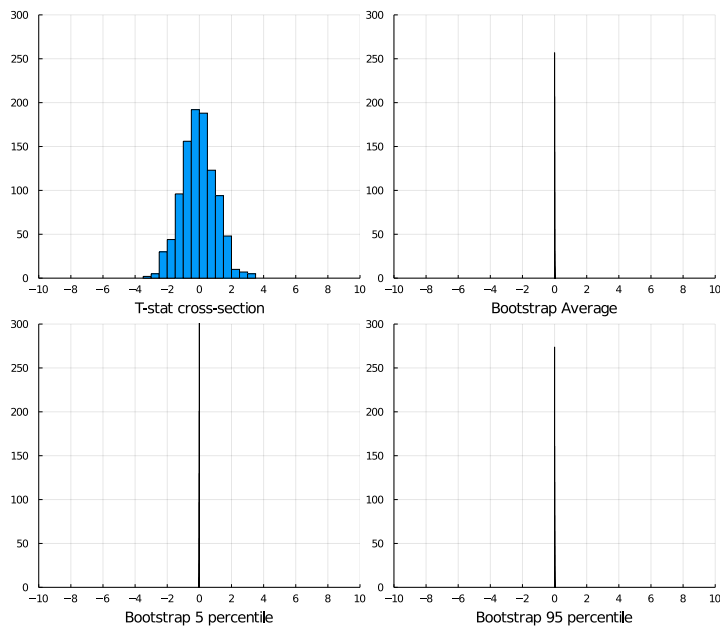
Part 1- No Skilled Funds

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In [2]: Plots.scalefontsizes(2.5)
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In [3]: res_no_skill = estimateFF(0.0, 0.0)
res_no_skill
```

Out[3]:

Lambda = 0.0, Alpha = 0.0



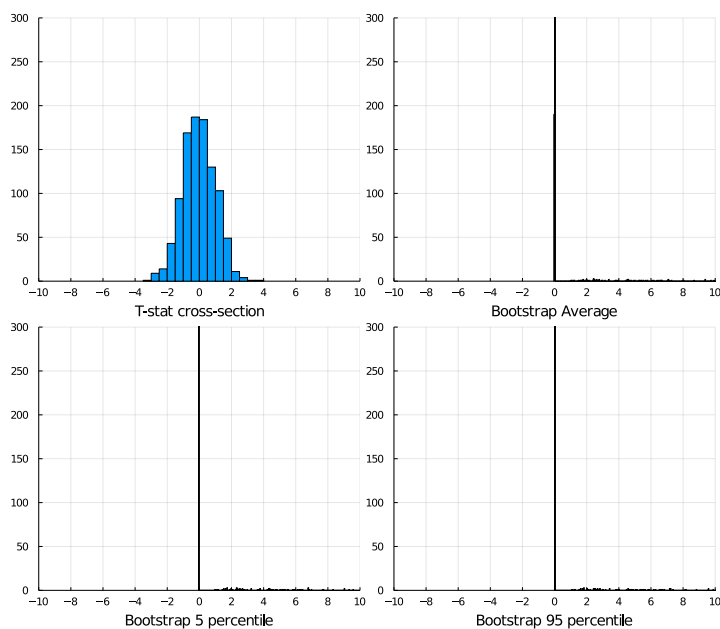
Part 2- Some Skilled Funds

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In [4]: using IJulia
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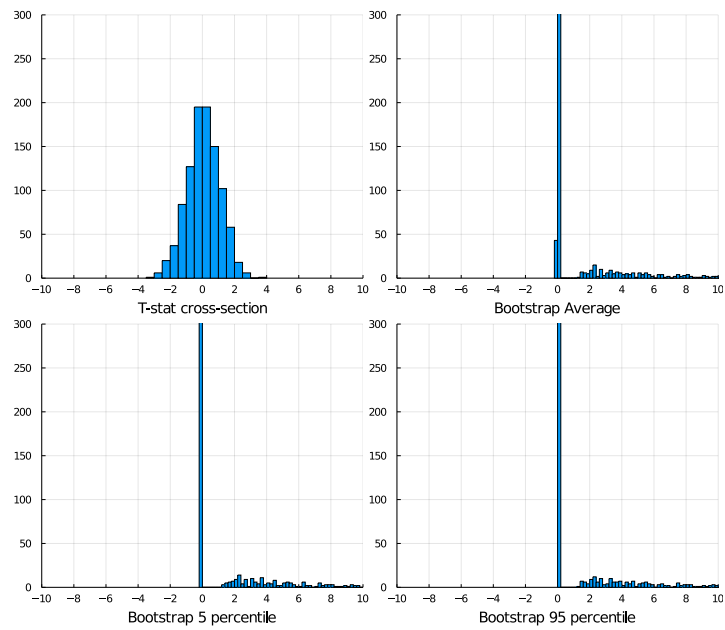
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In [5]: Lambdas = [0.1,0.25,0.5,0.75];  
Alphas = [0.01,0.025,0.05];
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In [6]: for a = 1:length(Alphas)  
    for l = 1:length(Lambdas)  
        Plots.display(estimateFF(Lambdas[l],Alphas[a]))  
    end  
end
```

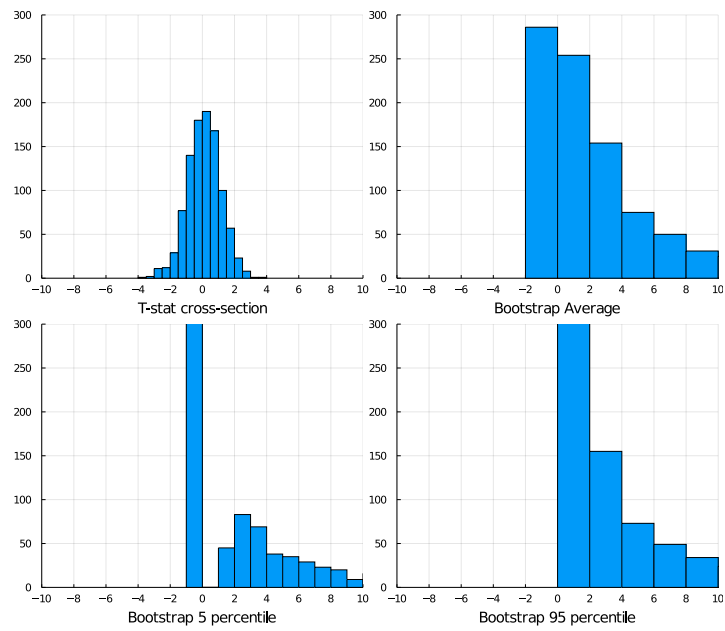
Lambda = 0.1, Alpha = 0.01



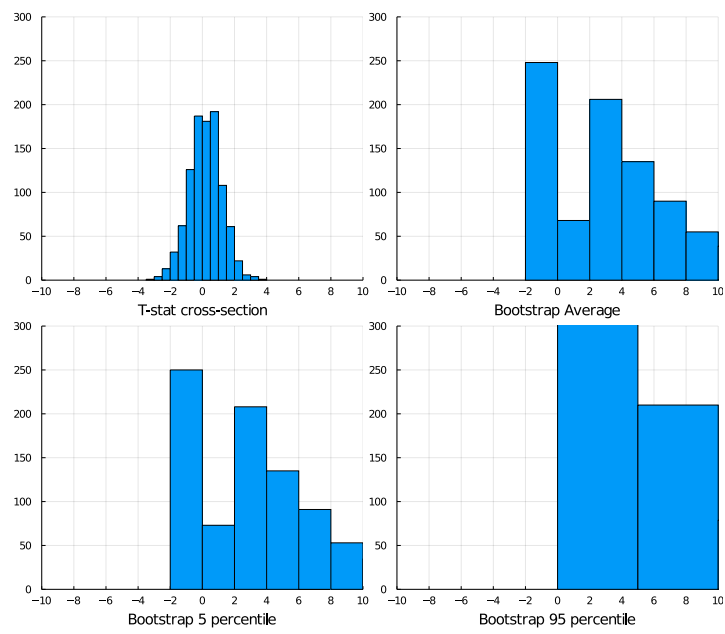
Lambda = 0.25, Alpha = 0.01



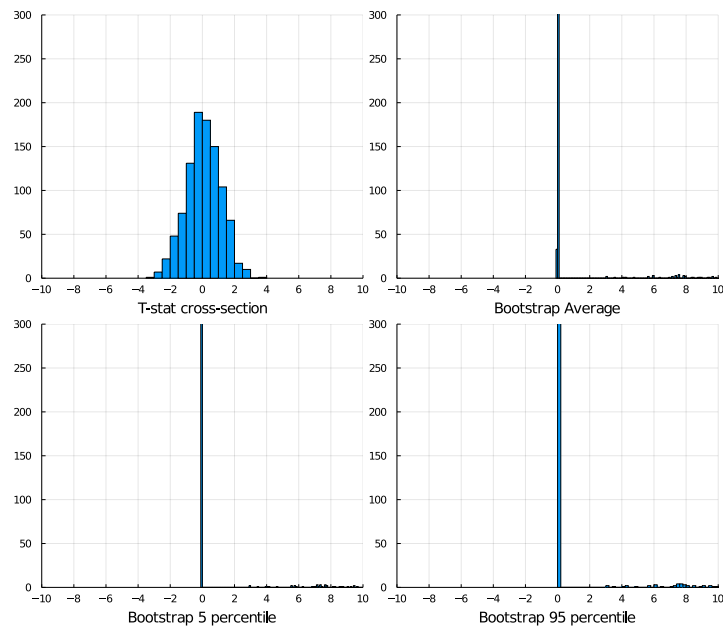
Lambda = 0.5, Alpha = 0.01



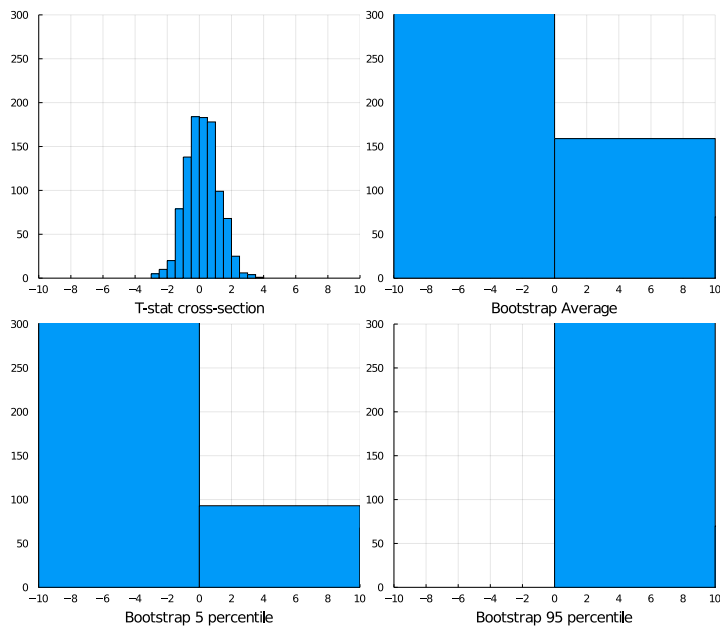
Lambda = 0.75, Alpha = 0.01



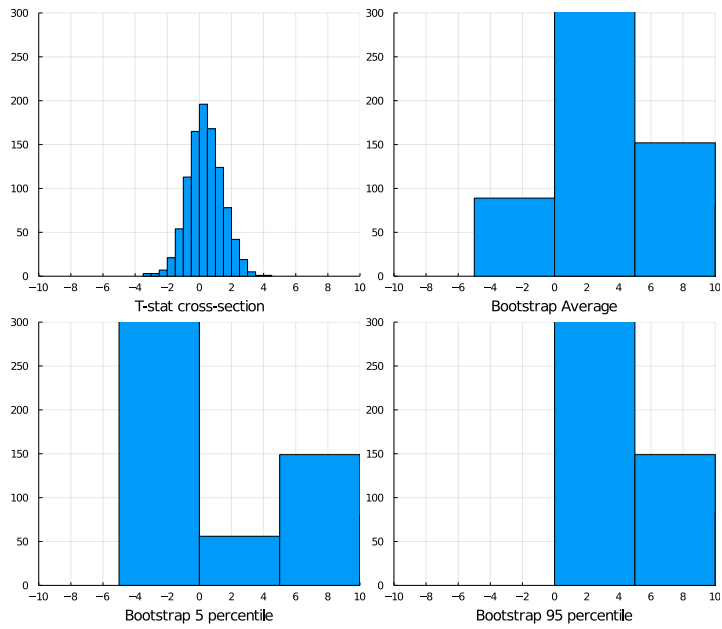
Lambda = 0.1, Alpha = 0.025



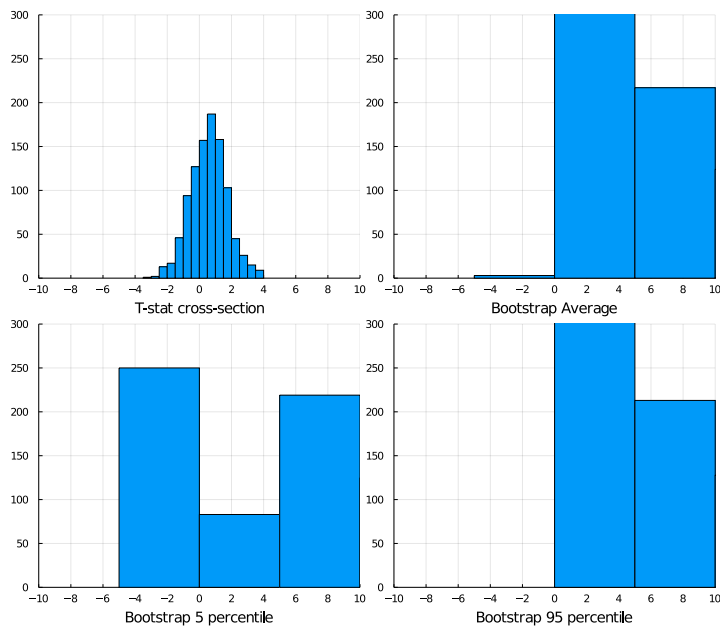
Lambda = 0.25, Alpha = 0.025



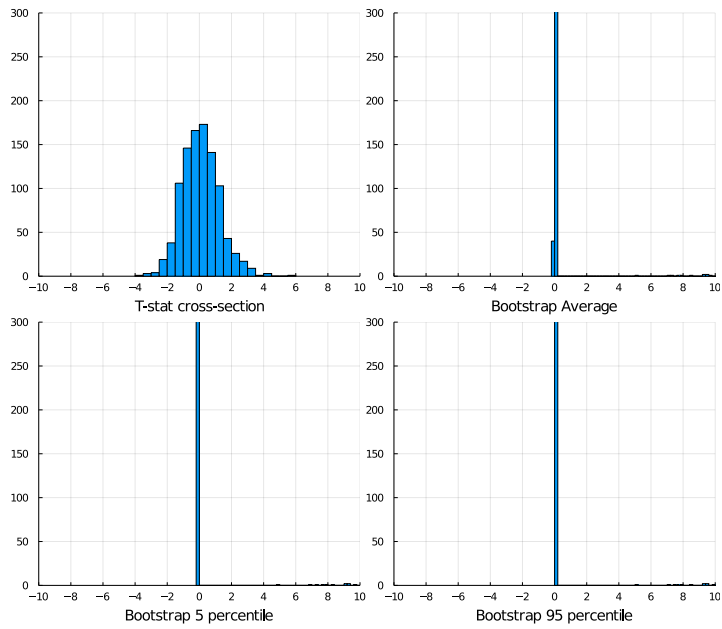
Lambda = 0.5, Alpha = 0.025



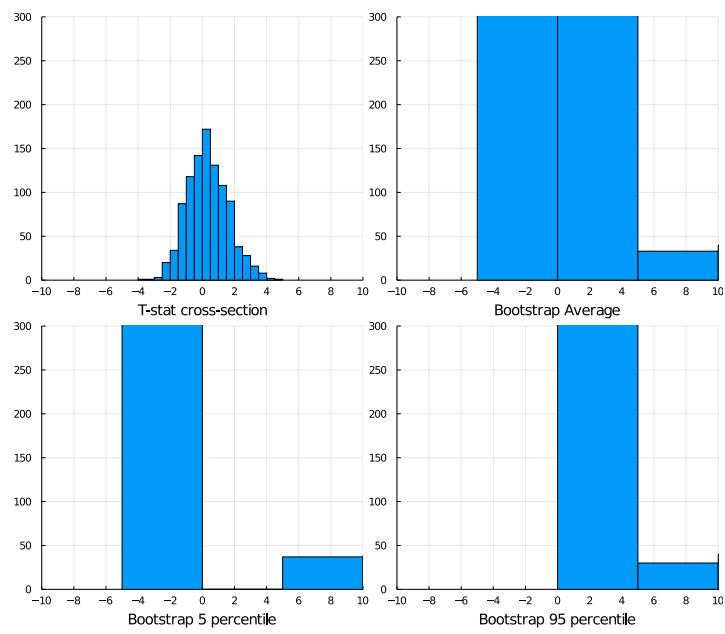
Lambda = 0.75, Alpha = 0.025



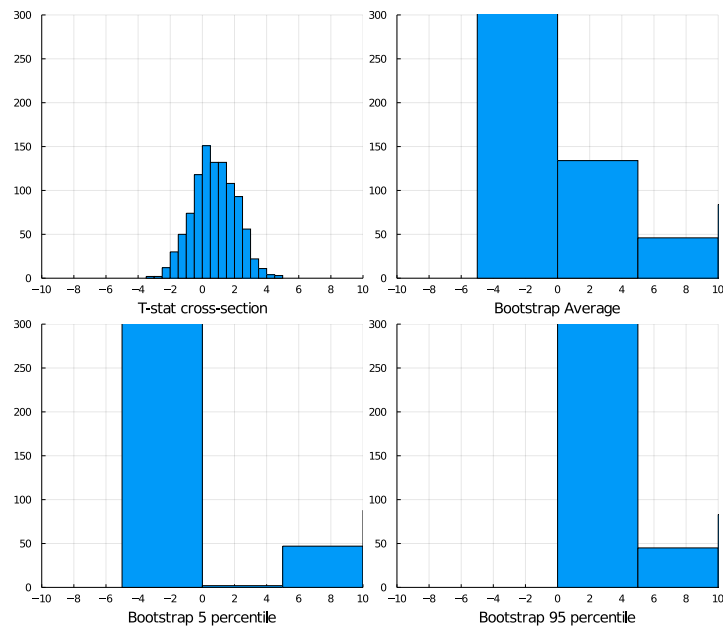
Lambda = 0.1, Alpha = 0.05



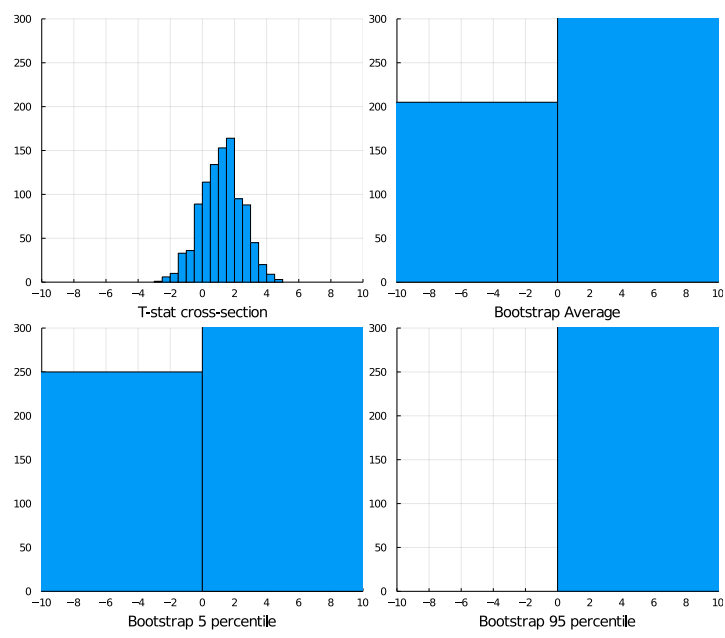
Lambda = 0.25, Alpha = 0.05



Lambda = 0.5, Alpha = 0.05



Lambda = 0.75, Alpha = 0.05



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In [ ]:
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