

## Problem 5

```
In [22]: # Julia only because numpy.polyfit produced unstable results
using Plots, LinearAlgebra, Statistics
```

```
In [23]: w0, w1 = 1, 1

function interpolate(n, D)
    α = sort!( 2 .* rand(n) .- 1 )
     $\tilde{y}$  = w0 .+ w1 .* α
    y =  $\tilde{y}$  + randn(n)

    X = hcat( [α.^i for i in 0:D]... )
    Q, R = qr(X)
    n > D+1 && ( R = vcat( R, zeros( n-(D+1), D+1 ) ) ) # qr factorization
                                                         # for backward stability

     $\hat{w}$  = R \ Q'y
    err = norm( X *  $\hat{w}$  -  $\tilde{y}$  ) / n

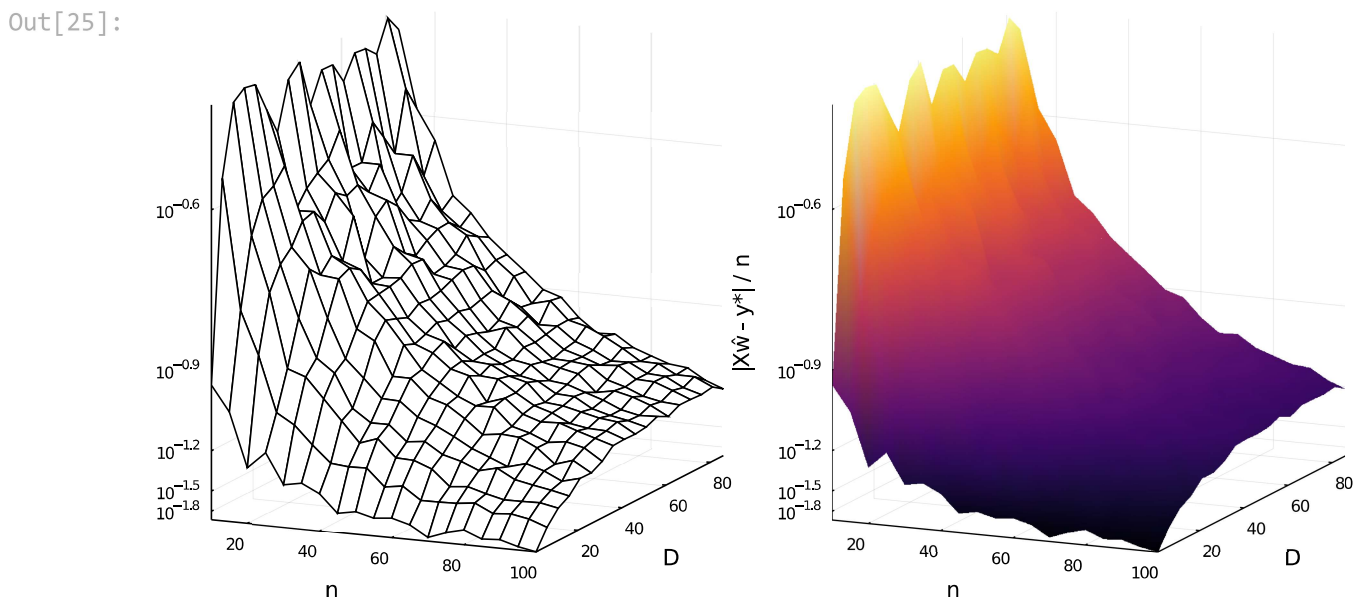
    return err
end

interpolate(n, D, trials) = mean( interpolate(n, D) for _ in 1:trials )

x, y = 10:5:100, 1:5:90
xy = [(n, D) for D in y, n in x];
```

```
In [24]: z = map(xy) do nD
    interpolate(nD..., 10)
end;
```

```
In [25]: fig1 = wireframe(x, y, z,
                        xaxis="n", yaxis="D", zaxis=:log10)
fig2 = surface(x, y, z,
               colorbar=false,
               xaxis="n", yaxis="D", zaxis=("|X $\hat{w}$  - y*| / n", :log10))
fig = plot(fig1, fig2, layout=2, size=(900, 450))
```



## Problem 7

```
In [26]: function interpolate(n, D)
           # redefine interpolate
           # function for exp(a)
           # undisturbed y
           # disturbed y
           α = sort!( 7 .* rand(n) .- 4 )
            $\tilde{y}$  = exp.(α)
           y =  $\tilde{y}$  + randn(n)

           X = hcat( [α.^i for i in 0:D]... )
           Q, R = qr(X)
           # qr factorization
           n > D+1 && ( R = vcat( R, zeros( n-(D+1), D+1 ) ) )

            $\hat{w}$  = R \ Q'y
           err = norm( X *  $\hat{w}$  -  $\tilde{y}$  ) / n

           return err
       end;
```

```
In [27]: x, y = 10:5:200, 1:50:201
           xy = [(n, D) for n in x, D in y]
           z = map(xy) do nD
               interpolate(nD..., 10)
           end
           fig1 = plot(x, collect(eachcol(z)),
                       xaxis="n", yaxis=:log10,
                       lab=permutedims(["constant D = $j" for j in y]));
```

```
In [37]: x, y = [50, 120, 200], 10:5:200
           xy = [(n, D) for D in y, n in x]
           z = map(xy) do nD
               interpolate(nD..., 10)
           end
           fig2 = plot(y, collect(eachcol(z)),
                       lab=permutedims(["constant n = $j" for j in x]),
                       xaxis="D", yaxis="|X $\hat{w}$  - y*| / n", :log10,
                       leg=:bottomright);
```

```
In [38]: fig = plot(fig1, fig2, layout=2, size=(900, 450))
```

