

# Forward Error in QR

```
In [0]: n = 128
println("Size of matrix ", n)

# Initialize the matrix
Qe, Re = qr(rand(n,n))
# Qe is orthogonal, Re is upper triangular
for i = 1 : n
    # Multiply row i by 1/2^i
    Re[i,:] = 1.0/2.0^(i-1) * Re[i,:]
end

# A = Qe * Re
A = Qe * Re
# Compute QR factorization of A
Q, R = qr(A)

# Fix possible differences in the sign of the diagonal entries of R
for i = 1 : n
    if R[i,i] * Re[i,i] < 0
        R[i,:] = -R[i,:]
        Q[:,i] = -Q[:,i]
    end
end

# We now expect that Q=Qe and R=Re.

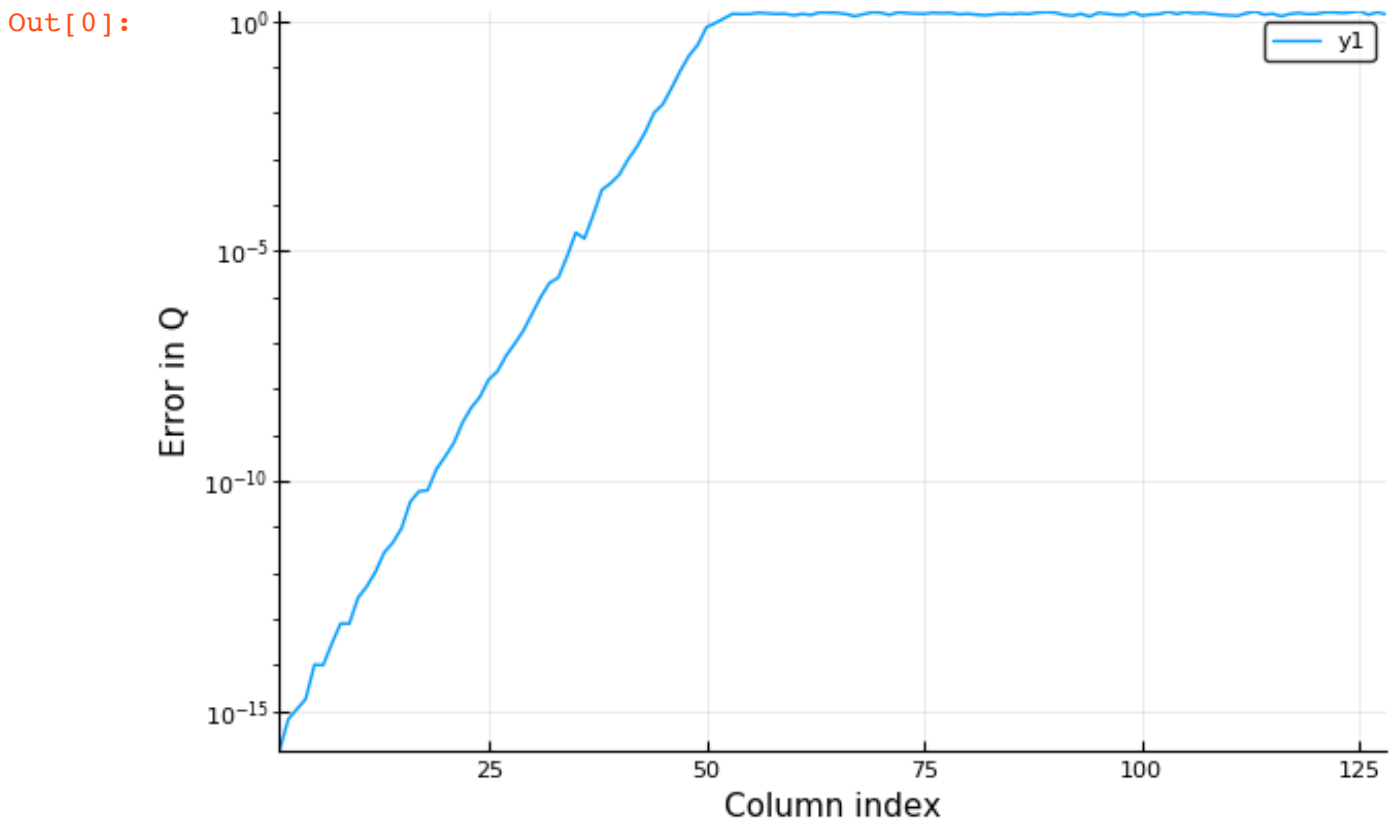
# Calculate the error in Q
err = zeros(n)
for j = 1 : n
    # Processing column j
    err[j] = norm(Q[:,j] - Qe[:,j])
end
```

Size of matrix 128

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In [0]: using Plots
pyplot()
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Out[0]: Plots.PyPlotBackend()
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In [0]: # Plot the error in Q
plot(err, yscale=:log10)
xlabel!("Column index")
ylabel!("Error in Q")
```



**Explain why the error in the columns of  $Q$  becomes very large. Consider roundoff errors that occur during the calculation. In double precision, the computer represents floating point numbers using only approximately 16 decimal digits.**

Observation: As  $i$  gets from zeros to around 53, the error in  $Q$  gets linearly from zero to  $2^0 = 1$ . Starting from 53 to 128, error stays big and the addition no longer adds up.

Assume Gram-Schmidt for this QR decomposition. In double precision, we know that the floating points are represented using 16 decimal digits. Then, since  $2^{53} = 1.11 \times 10^{-16}$ , the 53 bit significand precision gives about 16 significant digits precision.

As seen from previous homework, we know digits beyond certain point would be dropped during addition. Since  $Q_1$  has norm of 1 as it is orthogonalized, the order of  $Q_1$  is 1 initially. Then, it would be '1.[(53-i) significands]' where error is  $O(2^{-53+i})$

$Q_1$  has 53-i significand where  $i$  is column index. At each step of QR,  $R$  is decreasing in a way that some digits would be dropped linearly as shown in graph. The decomposition is like

$A_k = R_{1k}Q_1 + R_{2k}Q_2 + \dots + R_{kk}Q_k$  where each term has order 1, 2, ...,  $2^{-k+1}$  respectively. However, when adding these up, the latter terms might be too far from the decimal point. And when  $k > 53$ , the whole value exceeds the limit and disappears. And thinking of this decomposition, the part starting from  $Q_{53}$  up to  $Q_{128}$  doesn't count towards the decomposition.