

QR factorization example

```
In [2]: a1=[1,2,3]
```

```
Out[2]: 3-element Array{Int64,1}:  
 1  
 2  
 3
```

```
In [3]: a2=[2,-1,-3]
```

```
Out[3]: 3-element Array{Int64,1}:  
 2  
 -1  
 -3
```

```
In [4]: a3=[1,1,1]
```

```
Out[4]: 3-element Array{Int64,1}:  
 1  
 1  
 1
```

```
In [5]: tq1=copy(a1)
```

```
Out[5]: 3-element Array{Int64,1}:  
 1  
 2  
 3
```

```
In [7]: using LinearAlgebra
```

```
In [8]: q1=tq1/norm(tq1)
```

```
Out[8]: 3-element Array{Float64,1}:  
 0.2672612419124244  
 0.5345224838248488  
 0.8017837257372732
```

```
In [9]: [1,2,3]/sqrt(14)
```

```
Out[9]: 3-element Array{Float64,1}:  
 0.2672612419124244
```

```
0.5345224838248488
```

```
In [10]: tq2=a2-(q1'*a2)*q1
```

```
Out[10]: 3-element Array{Float64,1}:  
 2.642857142857143  
 0.2857142857142858  
-1.0714285714285714
```

```
In [11]: q2=tq2/norm(tq2)
```

```
Out[11]: 3-element Array{Float64,1}:  
 0.9221228546165697  
 0.09968895725584541  
-0.37383358970942016
```

```
In [12]: tq3=a3-(q1'*a3)*q1-(q2'*a3)*q2
```

```
Out[12]: 3-element Array{Float64,1}:  
-0.026086956521739313  
 0.07826086956521729  
-0.043478260869565244
```

```
In [13]: q3=tq3/norm(tq3)
```

```
Out[13]: 3-element Array{Float64,1}:  
-0.27975144247209616  
 0.8392543274162815  
-0.4662524041201573
```

```
In [14]: A=[a1 a2 a3]
```

```
Out[14]: 3×3 Array{Int64,2}:  
 1  2  1  
 2 -1  1  
 3 -3  1
```

```
In [15]: Q=[q1 q2 q3]
```

```
Out[15]: 3×3 Array{Float64,2}:  
 0.267261  0.922123 -0.279751  
 0.534522  0.099689  0.839254  
 0.801784 -0.373834 -0.466252
```

```
In [16]: Q'*Q
```

```
Out[16]: 3x3 Array{Float64,2}:
 1.0      0.0      -1.33227e-15
 0.0      1.0      -1.80411e-15
-1.33227e-15 -1.80411e-15  1.0
```

Note that e-15 means 10^{-15} so those off-diagonal entries are zero to within the limits of computer rounding errors. Thus $Q^T Q \approx I$ except for rounding.

```
In [17]: R=Q'*A
```

```
Out[17]: 3x3 Array{Float64,2}:
 3.74166      -2.40535      1.60357
 2.22045e-16   2.86606      0.647978
-5.10703e-15  -1.9984e-15   0.0932505
```

Note that the three numbers in the lower left corner of the matrix are essentially zero (up to rounding errors).

```
In [18]: q1'*a2
```

```
Out[18]: -2.4053511772118195
```

```
In [19]: q2'*a3
```

```
Out[19]: 0.6479782221629949
```

```
In [20]: norm(tq2)
```

```
Out[20]: 2.866057521105554
```

the QR factorization is so important that Julia has a built in subroutine that just does it.

```
In [22]: Q2,R2=qr(A)
```

```
Out[22]: LinearAlgebra.QRCompactWY{Float64,Array{Float64,2}}
Q factor:
3x3 LinearAlgebra.QRCompactWYQ{Float64,Array{Float64,2}}:
-0.267261  0.922123  0.279751
-0.534522  0.099689 -0.839254
-0.801784 -0.373834  0.466252
R factor:
3x3 Array{Float64,2}:
```

```

-3.74166  2.40535  -1.60357
 0.0      2.86606  0.647978
 0 0      0 0      -0.0932505

```

In [23]: `Q2=Matrix(Q2)`

Out[23]: 3x3 Array{Float64,2}:
 -0.267261 0.922123 0.279751
 -0.534522 0.099689 -0.839254
 -0.801784 -0.373834 0.466252

In [24]: `Q2*R2`

Out[24]: 3x3 Array{Float64,2}:
 1.0 2.0 1.0
 2.0 -1.0 1.0
 3.0 -3.0 1.0

In [25]: `Q*R`

Out[25]: 3x3 Array{Float64,2}:
 1.0 2.0 1.0
 2.0 -1.0 1.0
 3.0 -3.0 1.0

In [26]: `Q`

Out[26]: 3x3 Array{Float64,2}:
 0.267261 0.922123 -0.279751
 0.534522 0.099689 0.839254
 0.801784 -0.373834 -0.466252

In [27]: `Q2`

Out[27]: 3x3 Array{Float64,2}:
 -0.267261 0.922123 0.279751
 -0.534522 0.099689 -0.839254
 -0.801784 -0.373834 0.466252

In [28]: `R`

Out[28]: 3x3 Array{Float64,2}:
 3.74166 -2.40535 1.60357
 2.22045e-16 2.86606 0.647978
 -5.10703e-15 -1.9984e-15 0.0932505

```
In [29]: R2
```

```
Out[29]: 3x3 Array{Float64,2}:  
 -3.74166  2.40535  -1.60357  
  0.0      2.86606  0.647978  
  0.0      0.0      -0.0932505
```

Note that the sign changes were done by the computer to reduce rounding error. More about that sort of thing and many more things are discussing in Math 466.

Here is an example of a non-square matrix, to anticipate some interesting results about left and right inverses that will be coming up in Chapter 11.

```
In [31]: A=rand(5,3)
```

```
Out[31]: 5x3 Array{Float64,2}:  
 0.96454  0.71409  0.729139  
 0.15811  0.551558  0.540658  
 0.468164 0.907535  0.198505  
 0.95522  0.842411  0.767145  
 0.10794  0.447302  0.911846
```

```
In [33]: Q3,R3=qr(A);
```

```
In [34]: Q3=Matrix(Q3)
```

```
Out[34]: 5x3 Array{Float64,2}:  
 -0.665816  0.313529  0.130694  
 -0.109143 -0.541256  0.169316  
 -0.323171 -0.61292  -0.632682  
 -0.659383  0.126062  0.0663205  
 -0.0745102 -0.466025  0.741327
```

```
In [35]: Q3*R3
```

```
Out[35]: 5x3 Array{Float64,2}:  
 0.96454  0.71409  0.729139  
 0.15811  0.551558  0.540658  
 0.468164 0.907535  0.198505  
 0.95522  0.842411  0.767145  
 0.10794  0.447302  0.911846
```

```
In [36]: R3
```

```
Out[36]: 3x3 Array{Float64,2}:
```

```
-1.44866  -1.41774  -1.18242
 0.0      -0.73315  -0.513931
 0.0       0.0      0.788099
```

In [37]: `Q3'*Q3`

Out[37]: 3x3 Array{Float64,2}:
 1.0 -7.35995e-17 -7.36745e-17
 -7.35995e-17 1.0 -7.74265e-17
 -7.36745e-17 -7.74265e-17 1.0

In [38]: `Q3*Q3'`

Out[38]: 5x5 Array{Float64,2}:
 0.558692 -0.0749024 -0.0596833 0.487219 0.000384543
 -0.0749024 0.333538 0.259895 0.0149642 0.385889
 -0.0596833 0.259895 0.880397 0.0938681 -0.159309
 0.487219 0.0149642 0.0938681 0.455076 0.0395482
 0.000384543 0.385889 -0.159309 0.0395482 0.772297

Therefore, $Q^T Q = I$ but you don't get the identity when the order is reversed. This is because $Q \in \mathbf{R}^{5 \times 3}$ is not square in this case. On the other hand the Q (denoted by $Q2$) earlier was square and in that case $Q Q^T = I$.

Chapter 11 starts with the definition of left and right inverses because they are different when the matrices are not square.

In [39]: `Q2'*Q2`

Out[39]: 3x3 Array{Float64,2}:
 1.0 0.0 1.11022e-16
 0.0 1.0 1.11022e-16
 1.11022e-16 1.11022e-16 1.0

In [40]: `Q2*Q2'`

Out[40]: 3x3 Array{Float64,2}:
 1.0 -1.11022e-16 0.0
 -1.11022e-16 1.0 0.0
 0.0 0.0 1.0

In []: