

James Hahn  
MATH1080  
Coding Assignment #2

The Q and R matrices for the Householder and MATLAB QR factorizations are almost completely identical. One thing to note is their orthogonality checks, the matrix E, are slightly different. However, they only differ by multiples  $1 \times 10^{-15}$ , which can be attributed to rounding errors in modern computing systems. For any given simulation, the bold font notes the matrix supplied in the coding assignment, as well as the QR Factorization algorithm used to compute Q and R. One key differences are the size of the matrices. Gram-Schmidt is only reduced factorization, so if A is  $M \times N$ , then Q is  $M \times N$  and R is  $N \times N$ . Meanwhile, Householder performs full factorization, so Q is  $M \times M$  and R is  $M \times N$ . Besides these differences in orthogonalities and resulting dimensions of Q and R, all algorithms factor A into two matrices whose product is A, successfully.

The next 3 pages display the Q, R, and E (orthogonality check) matrices for the Z, A, and B matrices respectively. Finally, the final 3 pages showcase the code for a snippet of the driver program, original Gram-Schmidt, modified Gram-Schmidt, and Householder Triangularization.

Z, original Gram-Schmidt	Z, modified Gram-Schmidt																																																																		
<div>Q (gs) =</div> <table><tr><td>0.1010</td><td>0.3162</td><td>0.5420</td></tr><tr><td>0.4041</td><td>0.3534</td><td>0.5162</td></tr><tr><td>0.7071</td><td>0.3906</td><td>-0.5248</td></tr><tr><td>0.4041</td><td>-0.5580</td><td>0.3871</td></tr><tr><td>0.4041</td><td>-0.5580</td><td>-0.1204</td></tr></table> <div>R (gs) =</div> <table><tr><td>9.8995</td><td>9.4954</td><td>9.6975</td></tr><tr><td>0</td><td>3.2919</td><td>3.0129</td></tr><tr><td>0</td><td>0</td><td>1.9701</td></tr></table> <div>E (gs) =</div> <div>1.0e-14 *</div> <table><tr><td>0</td><td>0.0599</td><td>-0.0455</td></tr><tr><td>0.0599</td><td>0</td><td>-0.2909</td></tr><tr><td>-0.0455</td><td>-0.2909</td><td>-0.0111</td></tr></table>	0.1010	0.3162	0.5420	0.4041	0.3534	0.5162	0.7071	0.3906	-0.5248	0.4041	-0.5580	0.3871	0.4041	-0.5580	-0.1204	9.8995	9.4954	9.6975	0	3.2919	3.0129	0	0	1.9701	0	0.0599	-0.0455	0.0599	0	-0.2909	-0.0455	-0.2909	-0.0111	<div>Q (mgs) =</div> <table><tr><td>0.1010</td><td>0.3162</td><td>0.5420</td></tr><tr><td>0.4041</td><td>0.3534</td><td>0.5162</td></tr><tr><td>0.7071</td><td>0.3906</td><td>-0.5248</td></tr><tr><td>0.4041</td><td>-0.5580</td><td>0.3871</td></tr><tr><td>0.4041</td><td>-0.5580</td><td>-0.1204</td></tr></table> <div>R (mgs) =</div> <table><tr><td>9.8995</td><td>9.4954</td><td>9.6975</td></tr><tr><td>0</td><td>3.2919</td><td>3.0129</td></tr><tr><td>0</td><td>0</td><td>1.9701</td></tr></table> <div>E (mgs) =</div> <div>1.0e-15 *</div> <table><tr><td>0</td><td>0.5992</td><td>-0.3680</td></tr><tr><td>0.5992</td><td>0</td><td>0.1811</td></tr><tr><td>-0.3680</td><td>0.1811</td><td>0</td></tr></table>	0.1010	0.3162	0.5420	0.4041	0.3534	0.5162	0.7071	0.3906	-0.5248	0.4041	-0.5580	0.3871	0.4041	-0.5580	-0.1204	9.8995	9.4954	9.6975	0	3.2919	3.0129	0	0	1.9701	0	0.5992	-0.3680	0.5992	0	0.1811	-0.3680	0.1811	0
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A, original Gram-Schmidt	A, modified Gram-Schmidt
Q (gs) = 0.5774    0.8165    0.0000 0.5774    -0.4082    0.7071 0.5774    -0.4082    -0.7071  R (gs) = 1.7321    1.7321    1.7322 0    0.0001    0.0001 0    0    0.0001  E (gs) = 1.0e-06 *  0.0000    -0.0000    0.0000 -0.0000    -0.0000    0.1154 0.0000    0.1154    0	Q (mgs) = 0.5774    0.8165    0.0000 0.5774    -0.4082    0.7071 0.5774    -0.4082    -0.7071  R (mgs) = 1.7321    1.7321    1.7322 0    0.0001    0.0001 0    0    0.0001  E (mgs) = 1.0e-11 *  0.0000    -0.4710    0.2720 -0.4710    -0.0000    -0.0000 0.2720    -0.0000    0.0000

A, Householder Triangularization	A, MATLAB QR Factorization
Q (house) = -0.5774    0.8165    0.0000 -0.5774    -0.4082    0.7071 -0.5774    -0.4082    -0.7071  R (house) = -1.7321    -1.7321    -1.7322 0    0.0001    0.0001 0    -0.0000    0.0001  E (house) = 1.0e-15 *  -0.1110    0.1472    0.0034 0.1472    -0.3331    -0.0414 0.0034    -0.0414    0	Q (qr) = -0.5774    0.8165    0.0000 -0.5774    -0.4082    -0.7071 -0.5774    -0.4082    0.7071  R (qr) = -1.7321    -1.7321    -1.7322 0    0.0001    0.0001 0    0    -0.0001  E (qr) = 1.0e-15 *  -0.1110    0.0768    0.0052 0.0768    -0.1110    0.0245 0.0052    0.0245    0

B, original Gram-Schmidt	B, modified Gram-Schmidt
Q (gs) = 0.5774    0.8165    0.8165 0.5774    -0.4083    -0.4082 0.5774    -0.4083    -0.4083  R (gs) = 1.7321    1.7321    1.7321 0    0.0000    -0.0000 0    0    0.0000  E (gs) = 0.0000    -0.0000    -0.0000 -0.0000    0.0000    1.0000 -0.0000    1.0000    -0.0000	Q (mgs) = 0.5774    0.8165    0.0000 0.5774    -0.4083    0.7071 0.5774    -0.4083    -0.7071  R (mgs) = 1.7321    1.7321    1.7321 0    0.0000    0.0000 0    0    0.0000  E (mgs) = 1.0e-05 *  0.0000    -0.4710    0.2719 -0.4710    0.0000    -0.0000 0.2719    -0.0000    0.0000

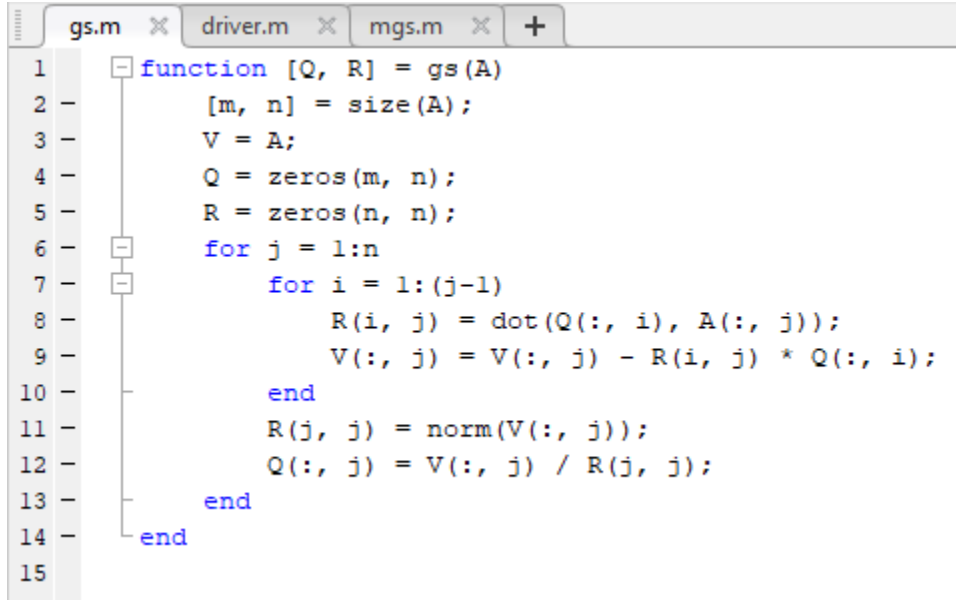
B, Householder Triangularization	B, MATLAB QR Factorization
Q (house) = -0.5774    0.8165    0 -0.5774    -0.4082    0.7071 -0.5774    -0.4082    -0.7071  R (house) = -1.7321    -1.7321    -1.7321 0    0.0000    0.0000 0    -0.0000    0.0000  E (house) = 1.0e-15 *  -0.1110    -0.1773    -0.0052 -0.1773    -0.8882    0.3803 -0.0052    0.3803    -0.2220	Q (qr) = -0.5774    0.8165    -0.0000 -0.5774    -0.4082    -0.7071 -0.5774    -0.4082    0.7071  R (qr) = -1.7321    -1.7321    -1.7321 0    0.0000    0.0000 0    0    -0.0000  E (qr) = 1.0e-15 *  -0.1110    0.0127    -0.0034 0.0127    -0.2220    -0.1088 -0.0034    -0.1088    0

**driver.m** – this program is used to run the other two algorithms and test their results

```
gs.m  driver.m  mgs.m  driver.m  house.m  +
1 -      Z = [1 2 3; 4 5 6; 7 8 7; 4 2 3; 4 2 2];
2 -      A = [1 1+10^(-4) 1+2*10^(-4); 1 1 1+10^(-4); 1 1 1];
3 -      B = [1 1+10^(-10) 1+2*10^(-10); 1 1 1+10^(-10); 1 1 1];
4
5 -      for i = 1:3
6 -          if i == 1
7 -              matrix = Z;
8 -          elseif i == 2
9 -              matrix = A;
10 -          elseif i == 3
11 -              matrix = B;
12 -          end
13 -          [Q1, R1] = gs(matrix);
14 -          [Q2, R2] = mgs(matrix);
15 -          [Q3, R3] = house(matrix);
16 -          [Q4, R4] = qr(matrix);
17
18 -          [m, n] = size(matrix);
19
20 -          E1 = Q1' * Q1 - eye(n);
21 -          E2 = Q2' * Q2 - eye(n);
22 -          E3 = Q3' * Q3 - eye(m);
23 -          E4 = Q4' * Q4 - eye(m);
24
25 -          disp("Q (gs) = ");
26 -          disp(Q1);
27 -          disp("R (gs) = ");
28 -          disp(R1);
29 -          disp("E (gs) = ");
30 -          disp(E1);
31 -          disp("Q (mgs) = ");
32 -          disp(Q2);
33 -          disp("R (mgs) = ");
34 -          disp(R2);
35 -          disp("E (mgs) = ");
36 -          disp(E2);
37 -          disp("Q (house) = ");
38 -          disp(Q3);
39 -          disp("R (house) = ");
40 -          disp(R3);
41 -          disp("E (house) = ");
42 -          disp(E3);
43 -          disp("Q (qr) = ");
44 -          disp(Q4);
```

sc

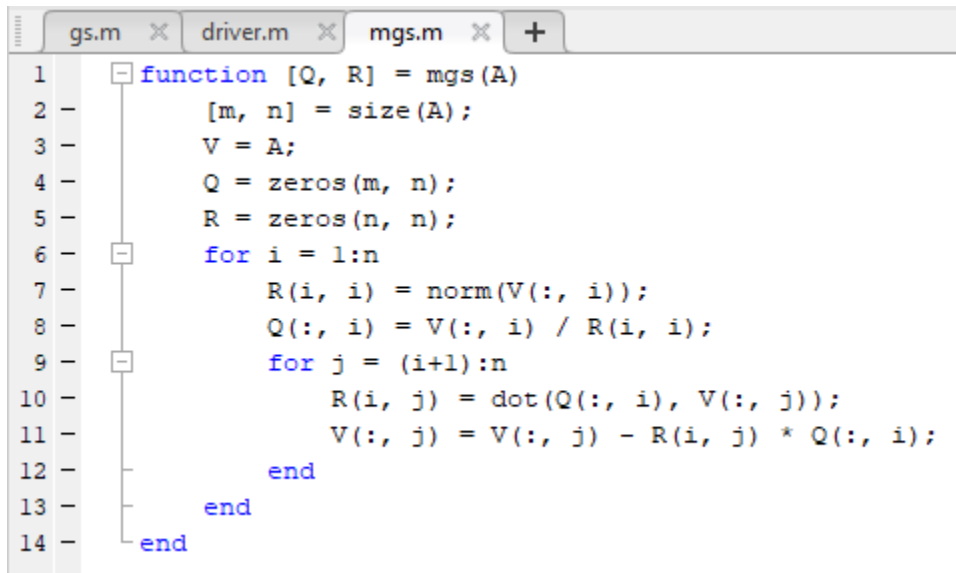
**gs.m** – this file implements classical Gram-Schmidt Orthogonalization for QR factorization



The image shows a MATLAB editor window with three tabs: 'gs.m', 'driver.m', and 'mgs.m'. The 'gs.m' tab is active, displaying the code for the classical Gram-Schmidt Orthogonalization function. The code is as follows:

```
1 function [Q, R] = gs(A)
2     [m, n] = size(A);
3     V = A;
4     Q = zeros(m, n);
5     R = zeros(n, n);
6     for j = 1:n
7         for i = 1:(j-1)
8             R(i, j) = dot(Q(:, i), A(:, j));
9             V(:, j) = V(:, j) - R(i, j) * Q(:, i);
10        end
11        R(j, j) = norm(V(:, j));
12        Q(:, j) = V(:, j) / R(j, j);
13    end
14 end
```

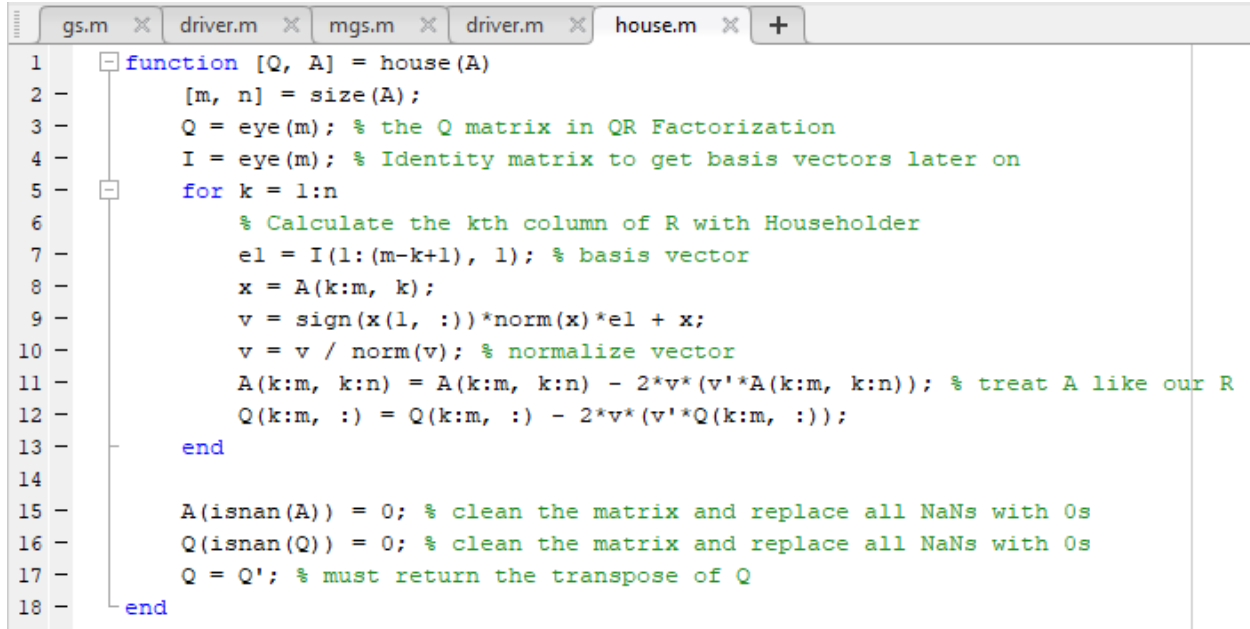
**mgs.m** – this file implements modern Gram-Schmidt Orthogonalization for QR factorization



The image shows a MATLAB editor window with three tabs: 'gs.m', 'driver.m', and 'mgs.m'. The 'mgs.m' tab is active, displaying the code for the modern Gram-Schmidt Orthogonalization function. The code is as follows:

```
1 function [Q, R] = mgs(A)
2     [m, n] = size(A);
3     V = A;
4     Q = zeros(m, n);
5     R = zeros(n, n);
6     for i = 1:n
7         R(i, i) = norm(V(:, i));
8         Q(:, i) = V(:, i) / R(i, i);
9         for j = (i+1):n
10            R(i, j) = dot(Q(:, i), V(:, j));
11            V(:, j) = V(:, j) - R(i, j) * Q(:, i);
12        end
13    end
14 end
```

**house.m** – this file implements Householder Triangularization for QR factorization



The image shows a MATLAB editor window with the file `house.m` open. The code implements Householder Triangularization for QR factorization. The editor has tabs for `gs.m`, `driver.m`, `mgs.m`, `driver.m`, and `house.m`. The code is as follows:

```
1 function [Q, A] = house(A)
2     [m, n] = size(A);
3     Q = eye(m); % the Q matrix in QR Factorization
4     I = eye(m); % Identity matrix to get basis vectors later on
5     for k = 1:n
6         % Calculate the kth column of R with Householder
7         e1 = I(1:(m-k+1), 1); % basis vector
8         x = A(k:m, k);
9         v = sign(x(1, :))*norm(x)*e1 + x;
10        v = v / norm(v); % normalize vector
11        A(k:m, k:n) = A(k:m, k:n) - 2*v*(v'*A(k:m, k:n)); % treat A like our R
12        Q(k:m, :) = Q(k:m, :) - 2*v*(v'*Q(k:m, :));
13    end
14
15    A(isnan(A)) = 0; % clean the matrix and replace all NaNs with 0s
16    Q(isnan(Q)) = 0; % clean the matrix and replace all NaNs with 0s
17    Q = Q'; % must return the transpose of Q
18 end
```