

**ANA RITA PIRES:** In lecture, you've learned about Gram-Schmidt orthogonalization, and that's what today's problem is about.

We have a matrix  $A$ , and its columns are  $a$ ,  $b$ , and  $c$ . And I want you to find orthonormal vectors  $q_1$ ,  $q_2$ , and  $q_3$  from those three columns. Then I want you to write  $A$  as  $A = QR$  decomposition where  $Q$  is an orthogonal matrix, and  $R$  is an upper triangular matrix. Remember, an orthogonal matrix is a matrix whose columns are orthonormal vectors.

Work on it for a little while, hit pause, and when you're ready I'll come back and we'll do it together. Did you manage to solve that all right? Well let's start solving it together.

So Gram-Schmidt orthogonalization, as you should remember from lecture, consists of the following. At each step, you find your orthonormal vector by taking the vector that you started with,  $a$ ,  $b$ , or  $c$  in this case, and making it orthonormal to the previous ones. Let's actually do it.

We want to find  $q_1$ . Well, to find  $q_1$ , start with  $a$ , and make it orthonormal to the previous one. There's no previous one, so that's very easy. The direction of  $a$  is fine and you just need to ensure that your vector has length 1. Well,  $a$  is the vector  $[1, 0, 0]$ . So you should divide it by its length, but its length is 1, so this is simply  $[1, 0, 0]$ .  $q_1$  is done. Now let's do  $q_2$ .

So with  $q_2$ , I will start with my vector  $b$ . And then I want to make it, well first of all, orthogonal to what I already have, which is  $q_1$ . For that, I'm going to subtract off from  $b$  the projection of  $b$  onto  $q_1$ . Minus  $b \cdot q_1$  times  $q_1$ . Usually, when you're doing the projection of a vector onto another vector, you have to divide it by the length of, in this case,  $q_1$ . But because  $q_1$  has length 1, you don't need to do that.

So what will it be here? Well  $b \cdot q_1$  is going to be--  $b$  is  $[2, 0, 3]$ , minus,  $b \cdot q_1$  will be 2, and  $[1, 0, 0]$ . So this will be  $[0, 0, 3]$ . This vector is orthogonal to this one, and you can check by doing your dot product. It should be 0, and it is.

We need it also to be length 1, because we want these two vectors to be orthonormal. So this is not actually  $q_2$ . Let's call this one  $q_2'$ , and set  $q_2$  equals to  $q_2'$  divided by its length, which in this case is 3.  $[0, 0, 1]$ . That's my vector  $q_2$ .

Let's go on to the third one,  $q_3$ . Well again, I start with my third vector,  $c$ . And then I want to subtract the projection of  $c$  onto  $q_1$  and onto  $q_2$ , and that will give me a  $q_3$  that is

orthogonal to both  $q_1$  and  $q_2$ .  $c - c \cdot q_1 \cdot q_1 - c \cdot q_2 \cdot q_2$ . This will be  $c - [4, 5, 6] \cdot [1, 0, 0] - 6 \cdot [0, 0, 1]$ , so  $4 - 6 = -2$ , so this vector will be  $[0, 5, -2]$ . And once again, this one is orthogonal to  $q_1$  and  $q_2$ , but it is not norm 1 yet. So  $q_3$ -- I'll call that one  $q_3$  prime, and I'll set  $q_3$  equal to  $q_3$  prime divided by its length which is 5.  $q_3$  is the vector  $[0, 1, 0]$ .

One thing that I want you to note is that my vectors  $q_1, q_2, q_3$  are very nice in this case. Usually, when you perform Gram-Schmidt orthogonalization, you end up with lots of square roots because you're dividing by the length. In this case, we have everything is integers, which is, well, very lucky.

Next part of the problem is we want to write the QR decomposition of the matrix A.  $A = QR$ . Well, the matrix A, you already know what it is. It is the matrix  $\begin{bmatrix} 1 & 2 & 4 \\ 0 & 0 & 5 \\ 0 & 3 & 6 \end{bmatrix}$ . And Q you want to be an orthogonal matrix. Like I said before, an orthogonal matrix has orthonormal vectors for its columns. And we already have such a matrix. It's the matrix that has  $q_1, q_2, q_3$  as its column vectors.  $\begin{bmatrix} 1 & 0 & 0 \\ 0 & 0 & 1 \\ 0 & 1 & 0 \end{bmatrix}$ .

Now, we need an upper triangular matrix that makes this equality true. Take a moment to look at your matrix Q. It is simply a permutation matrix, so it's very easy to come up with a matrix that should fit here. What this permutation matrix does is it exchanges rows two and three from my matrix R to give you A. So you know what R must be. It must be  $\begin{bmatrix} 1 & 2 & 4 \\ 0 & 3 & 6 \\ 0 & 0 & 5 \end{bmatrix}$ -- that's the third row of A-- and then  $0, 0, 5$ , which is the second row of A.

And indeed, R is upper triangular. This is your QR decomposition of the matrix A. Q is orthogonal, R is upper triangular. But let's see where these numbers in the matrix R are coming from. Let me label these columns for you, a, b, c and  $q_1, q_2, q_3$ . And then I have my matrix R.

You know from the way that matrix multiplication works that A is going to be this matrix Q times the first column of R. So you can regard that as these numbers in the first column of R are giving you the linear coefficients in which you need to take these vectors to add up to A. Let me write that down. A is going to be  $1 \cdot q_1 + 0 \cdot q_2 + 0 \cdot q_3$ .

Let's do it for b. The second column of this matrix will be Q times this column. So it will be  $2 \cdot q_1 + 3 \cdot q_2 + 0 \cdot q_3$ . And finally, for c I will have c is equal to this matrix times this vector,  $4 \cdot q_1 + 6 \cdot q_2 + 5 \cdot q_3$ . Now let's go back and see where these

numbers are showing up.

I wanted to have  $A$  equals 1 times  $q_1$ . Well that's very easy. It comes from here,  $a$  equals 1 times  $q_1$ . Let's try the second one.  $b$  equals  $2q_1$  plus  $3q_2$ . Well  $q_2$ , let's see.  $q_2$  prime is equal to 3 times  $q_2$ , so let me write this here to help.  $3q_2$ . Now let me remind you that  $b$  dot  $q_1$  was equal to 2. Now look at this equation. You we have  $b$  is equal to  $2q_1$  plus  $3q_2$ , which is what we wanted.

Let's check  $q_3$ .  $q_3$  prime is equal to  $5q_3$  so let me write that here,  $5q_3$ . And now I have  $c$  is equal to-- this number was 4, and this number was 6--  $c$  is equal to  $4q_1$  plus  $6q_2$  plus  $5q_3$ , which indeed, is what we wanted. So this is where these numbers from the matrix  $R$  are coming from.

And that finishes this problem. I hope you have a better grasp of the QR decomposition now. Bye. See you next time.