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I affirm that I have adhered to the honor code on this assignment.

*Hello again, scientist! I'll write in italics, and problems for you will always be in **bold**. As a general rule, I expect you to do at least as much writing as I do. Code should be part of your solution, but I expect variables to be clear and explanation to involve complete sentences. Cite your sources; if you work with someone in the class on a problem, that's an extremely important source.*

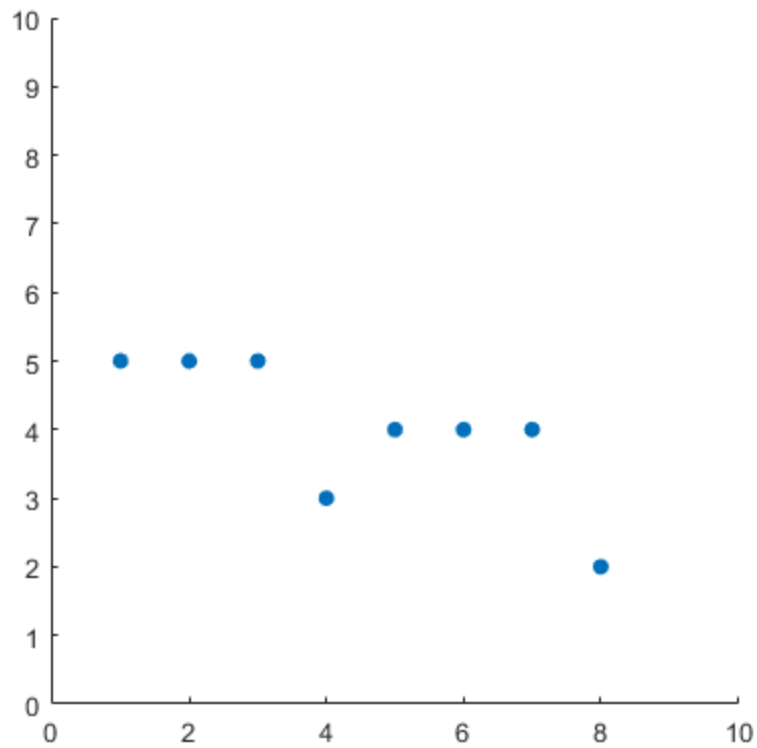
## Problem 5.1.a.

*It's 2020, right? We have super-powerful computers. Why don't we just fit curves exactly? That's a great rhetorical question, me! Let's find out.*

```
B = [1 5; 2 5; 3 5; 4 3; 5 4; 6 4; 7 4; 8 2];
```

*B is a list of 8 points in  $R^2$ . Show me a scatter plot of those 8 points. Explain why B stands for "Beethoven."*

```
scatter(B(:,1),B(:,2),'filled')  
axis square; axis([0 10 0 10]);
```



DUN DUN DUN DUUUUN....DUN DUN DUN DUNNNN.

There is a unique degree 7 polynomial that interpolates these 8 points, and you're about to find it. **Read this:** [https://en.wikipedia.org/wiki/Polynomial\\_interpolation#Constructing\\_the\\_interpolation\\_polynomial](https://en.wikipedia.org/wiki/Polynomial_interpolation#Constructing_the_interpolation_polynomial)

You can create a Vandermonde matrix with `vander()`. **Do that for the first column of *B*, and call the matrix *A*.**

```
A = vander(B(:,1))
```

A =

Columns 1 through 6

	1	1	1	1	1
1	128	64	32	16	8
4	2187	729	243	81	27
9	16384	4096	1024	256	64
16	78125	15625	3125	625	125
25					

```

      279936      46656      7776      1296      216
36      823543      117649      16807      2401      343
49      2097152      262144      32768      4096      512
64

```

Columns 7 through 8

```

      1      1
      2      1
      3      1
      4      1
      5      1
      6      1
      7      1
      8      1

```

*Once you've done that, uncomment the following. Then explain the output.*

```

R = rref([A B(:,2)])
p = poly2sym(R(:,9))

```

R =

Columns 1 through 7

```

1.0000      0      0      0      0      0      0
      0 1.0000      0      0      0      0      0
      0      0 1.0000      0      0      0      0
      0      0      0 1.0000      0      0      0
      0      0      0      0 1.0000      0      0
      0      0      0      0      0 1.0000      0
      0      0      0      0      0      0 1.0000
      0      0      0      0      0      0      0

```

Columns 8 through 9

```

      0 -0.0103
      0  0.3306
      0 -4.3306
      0 29.8056
      0 -115.0476
      0 245.3636
      0 -263.1119
1.0000 112.0000

```

p =

```

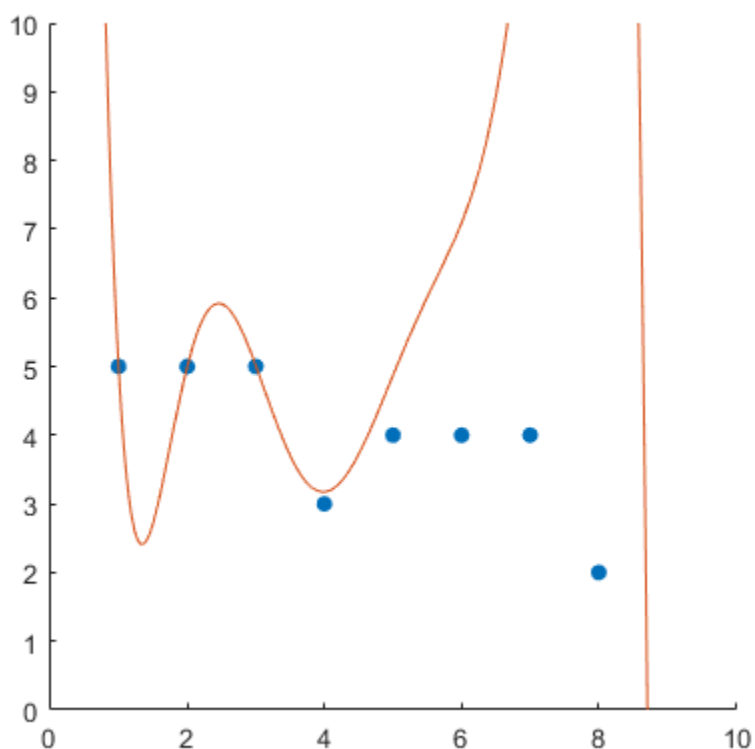
- x^7/97 + (40*x^6)/121 - (524*x^5)/121 + (1073*x^4)/36 -
(2416*x^3)/21 + (2699*x^2)/11 - (37625*x)/143 + 112

```

The first line of code creates the matrix  $R$  by creating an augmented matrix from the second column of the matrix  $B$  and its Vandermonde matrix  $A$ . The `poly2sym()` command then takes the 9th column of the resulting matrix and expresses it as a polynomial equation in the variable  $x$ .

*You did it! Now **plot  $B$  and  $p$  on the same axes; choose reasonable bounds.***

```
figure;
hold on;
scatter(B(:,1),B(:,2),'filled');
fplot(p,[0 10]);
axis square; axis([0 10 0 10]);
hold off;
```



*If you did this right, your polynomial should go pretty much exactly through the first three or four points and then start to freak out. That's intentional; as you've already seen, `rref()` is awful. Sorry.*

## Problem 5.1.b.

*Okay, well, we're not going to give up that easily. MATLAB is much, much better at inverting matrices than it is at `rref()`, for reasons that we'll see later. This time, **find the interpolating polynomial using matrix inversion and plot it and the points of  $B$  on the same set of axes.** If all goes well, your polynomial should hit every point.*

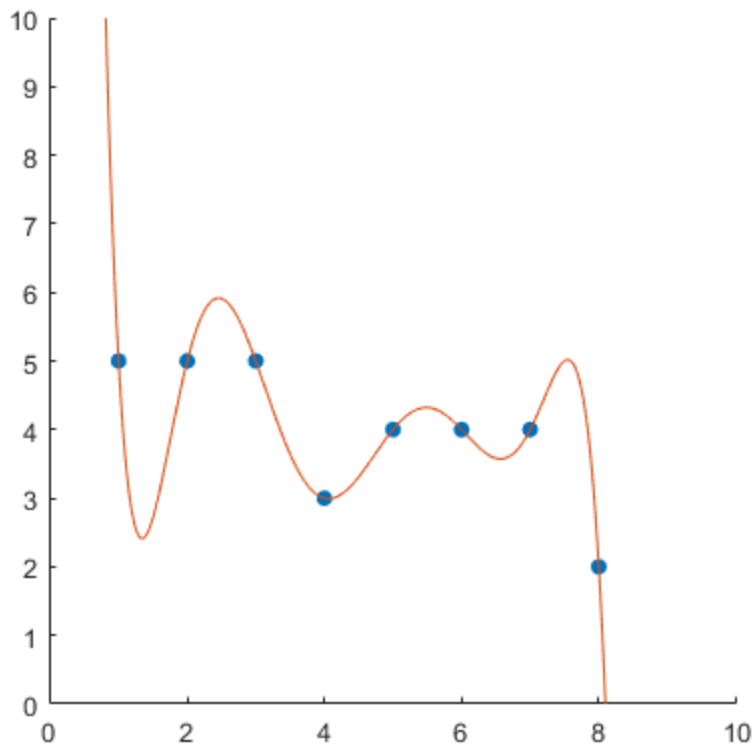
```
Q = A \ B(:,2);
```

```

t = poly2sym(Q);

figure;
hold on;
scatter(B(:,1),B(:,2),'filled');
fplot(t,[0 10]);
axis square; axis([0 10 0 10]);
hold off;

```



The vector  $Q$  is produced by solving the equation  $Ax=b$  by multiplying both sides by the matrix  $A^{-1}$ , represented here by  $A \setminus B(:,2)$ . When that resultant vector is supplied to `poly2sym()`, a polynomial is generated that interpolates through all 8 points of  $B$ .

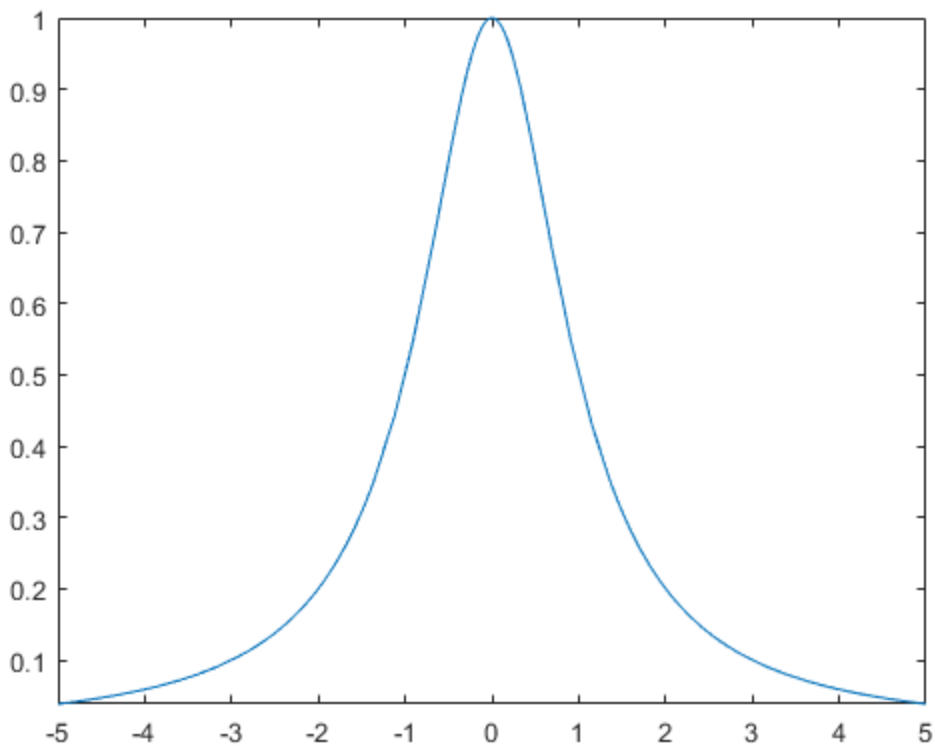
## Problem 5.1.c.

*Now here's the real problem. Even when MATLAB is working perfectly, polynomial interpolation is extremely sensitive to "ringing," or what's called Runge's phenomenon. ("Runge" is pronounced ROON-geh.)*

```

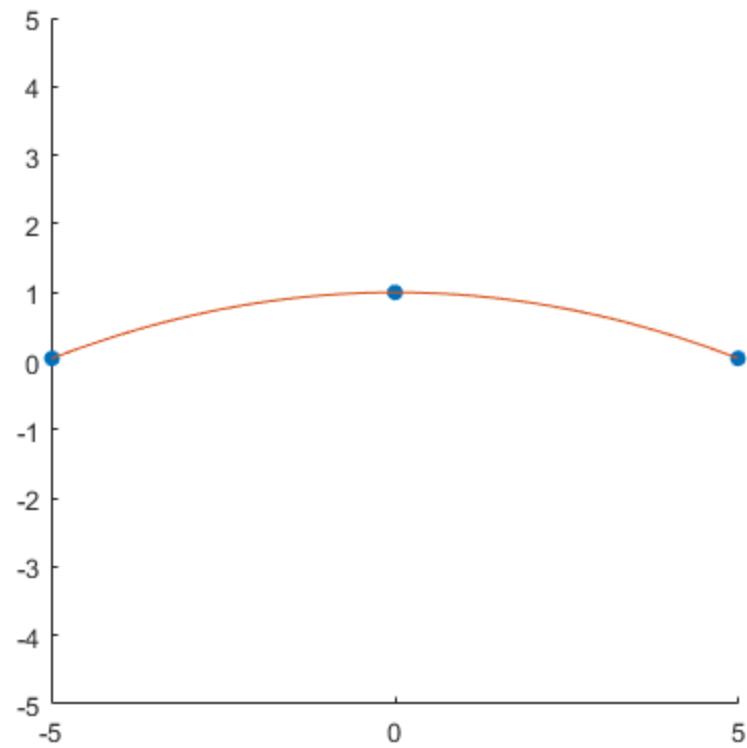
syms x;
runge = 1/(1+x^2);
figure;
fplot(runge,[-5,5]); % uncomment this when you're ready

```



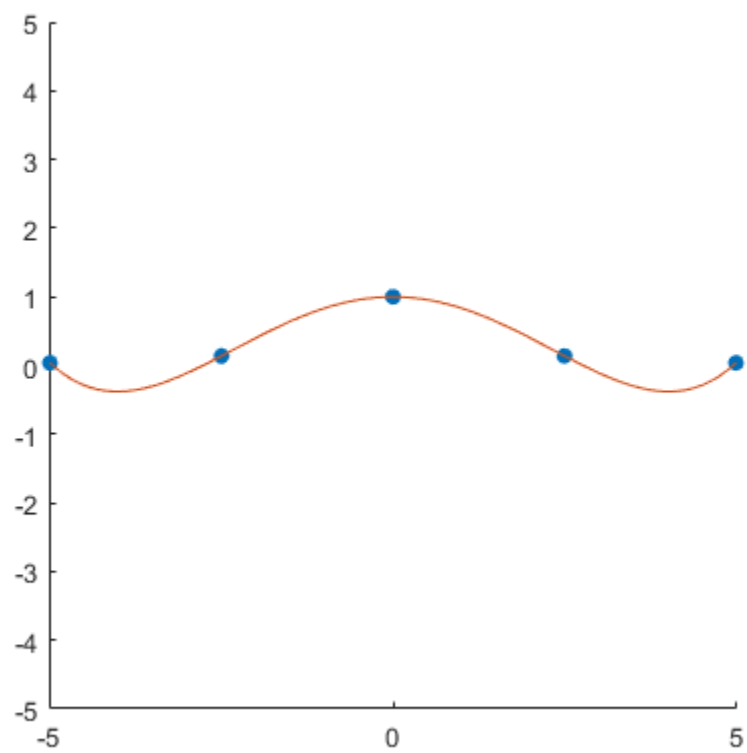
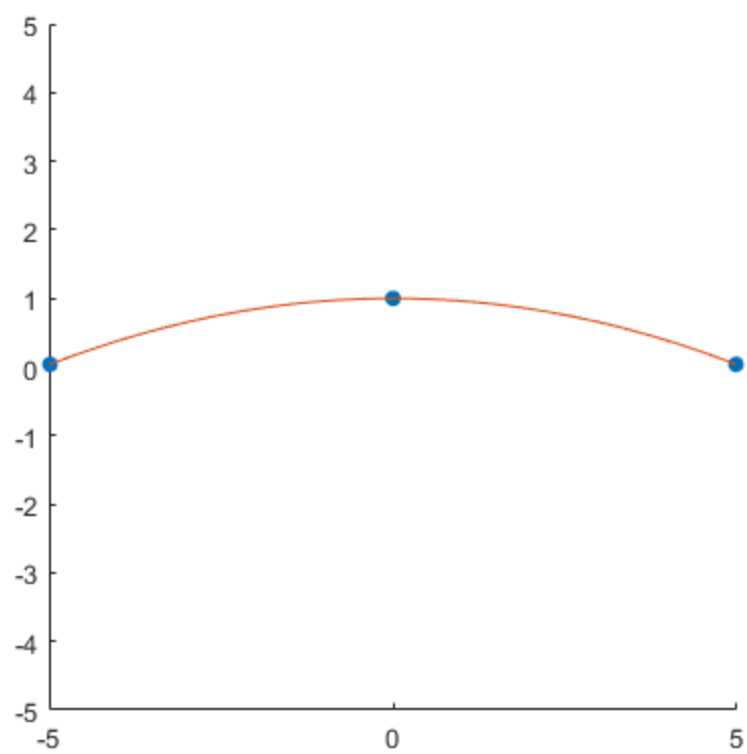
*By using an appropriate Vandermonde matrix and matrix inversion, find and plot the interpolating polynomial for  $\text{runge}(x)$  on the interval  $[-5, 5]$  using three equally-spaced points.*

```
runge_vec_3 = [-5 1/26; 0 1; 5 1/26];  
vand = vander(runge_vec_3(:,1));  
V = rref([vand runge_vec_3(:,2)]);  
threevand = poly2sym(V);  
inv = vand \ runge_vec_3(:,2);  
threeinv = poly2sym(inv);  
  
figure;  
hold on;  
scatter(runge_vec_3(:,1),runge_vec_3(:,2), 'filled');  
fplot(threeinv,[-5 5]);  
axis square; axis([-5 5 -5 5]);  
hold off;
```



***Five points.***

```
runge_vec_5 = [-5 1/26; -2.5 4/29; 0 1; 2.5 4/29; 5 1/26];  
vand = vander(runge_vec_5(:,1));  
V = rref([vand runge_vec_5(:,2)]);  
fivevand = poly2sym(V);  
inv = vand \ runge_vec_5(:,2);  
fiveinv = poly2sym(inv);  
  
figure;  
hold on;  
scatter(runge_vec_5(:,1),runge_vec_5(:,2), 'filled');  
fplot(fiveinv,[-5 5]);  
axis square; axis([-5 5 -5 5]);  
hold off;
```

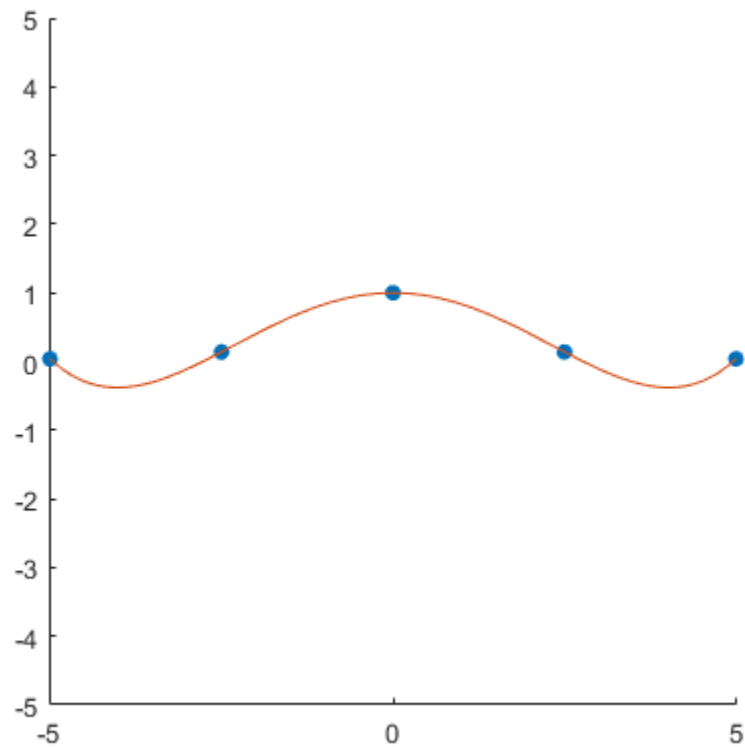


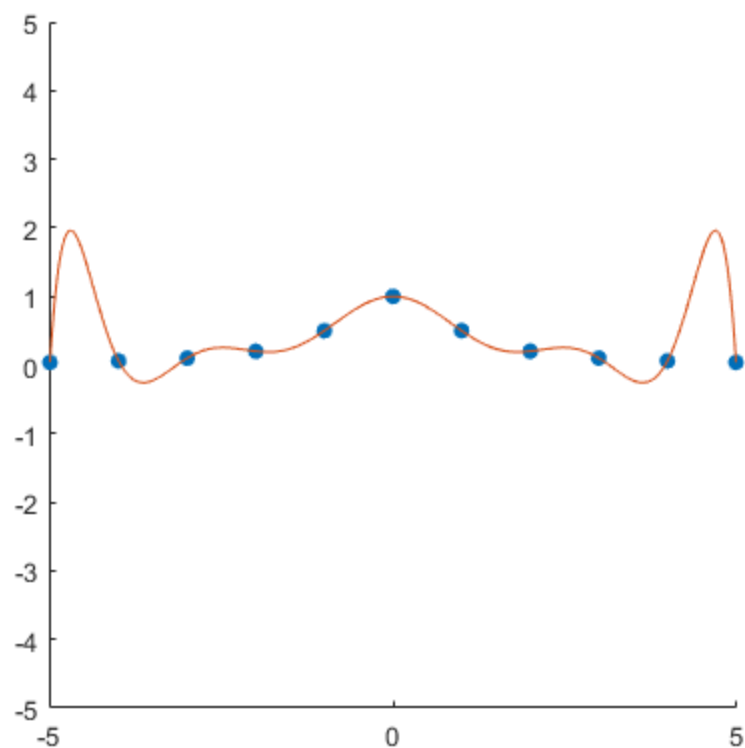


***Eleven points.***

```
xs = -5:5;
xs = xs';
ys = double(subs(runge,x,-5:5))';
runge_vec_11 = horzcat(xs,ys);
vand = vander(runge_vec_11(:,1));
V = rref([vand runge_vec_11(:,2)]);
elevenvand = poly2sym(V);
inv = vand \ runge_vec_11(:,2);
eleveninv = poly2sym(inv);

figure;
hold on;
scatter(runge_vec_11(:,1),runge_vec_11(:,2),'filled');
fplot(eleveninv,[-5 5]);
axis square; axis([-5 5 -5 5]);
hold off;
```





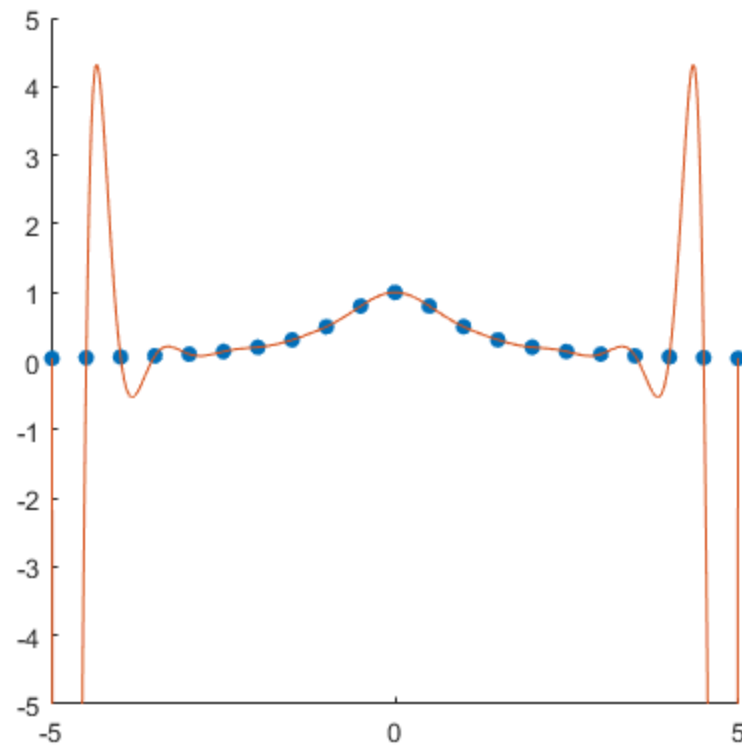
*Twenty-one points.*

```
xs_twentyone = -5:0.5:5;
xs_twentyone = xs_twentyone';
ys_twentyone = double(subs(runge,x,-5:0.5:5))';
runge_vec_21 = horzcat(xs_twentyone,ys_twentyone);
vand = vander(runge_vec_21(:,1));
V = rref([vand runge_vec_21(:,2)]);
twentyonevand = poly2sym(V);
inv = vand \ runge_vec_21(:,2);
twentyoneinv = poly2sym(inv);

figure;
hold on;
scatter(runge_vec_21(:,1),runge_vec_21(:,2),'filled');
fplot(twentyoneinv,[-5 5]);
axis square; axis([-5 5 -5 5]);
hold off;
```

*Warning: Matrix is close to singular or badly scaled. Results may be inaccurate.*

*RCOND = 1.452073e-16.*



*The discovery of this example (1901), along with the similar Gibbs phenomenon for Fourier series (1899), was a shock to the scientific community at the time. (The phenomenon was actually discovered earlier by physicists, but they assumed that it was just measurement error.) Designing high-quality interpolations that minimize ringing remains a major challenge in the field of signal processing.*

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