

Introduction to Matlab

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Research Analytics



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Matlab background

- Developed by Cleve Moler in the 1970s to give students easier access to numerical libraries for linear algebra
- MathWorks company founded in 1984 for commercial development
- The fundamental datatype is the matrix (array)



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Matlab IU availability

- STC labs
- IUAnyware
- Karst, Big Red II, Carbonate, RED
- Free academic license via IUware with 46 toolboxes (depending on how you count Simulink)



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Matlab research use



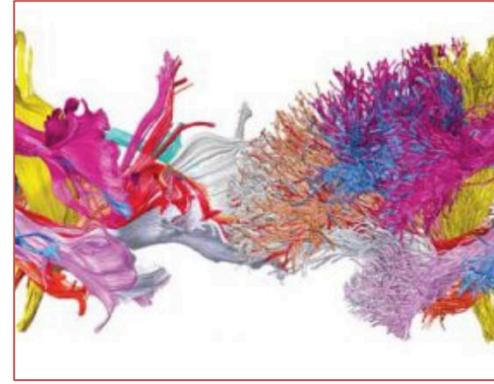
Dr. Spencer Hall,
Biology

infectious disease in food webs. Run simulations; solve systems; fit models; visualize



Dr. Shirin Hassan
School of Optometry

organize and analyze street crossing decisions of the visually impaired



Dr. Franco Pestilli,
Psych. & Brain Sciences

Study brain structure, function, and behavior



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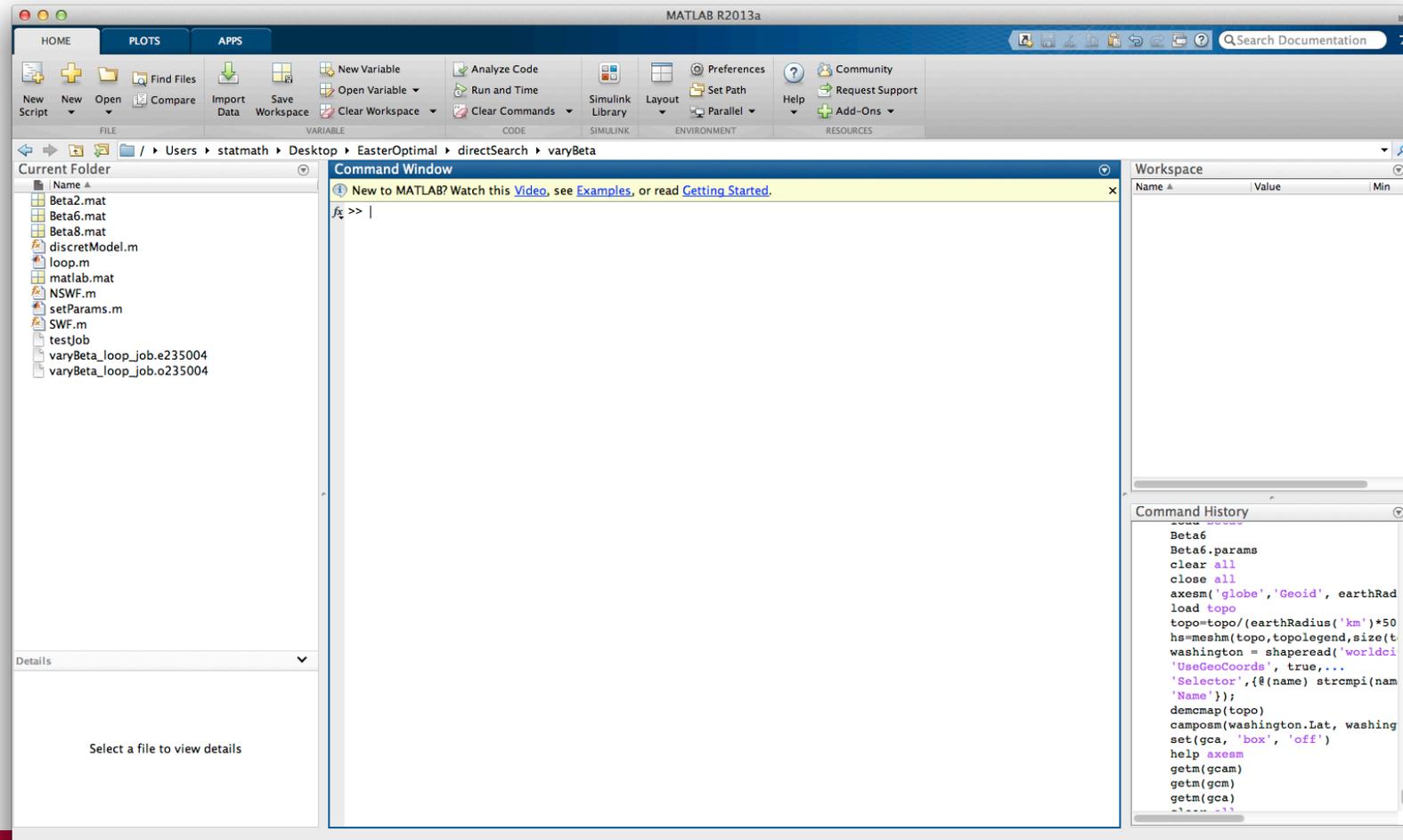


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Taking a look at the interface



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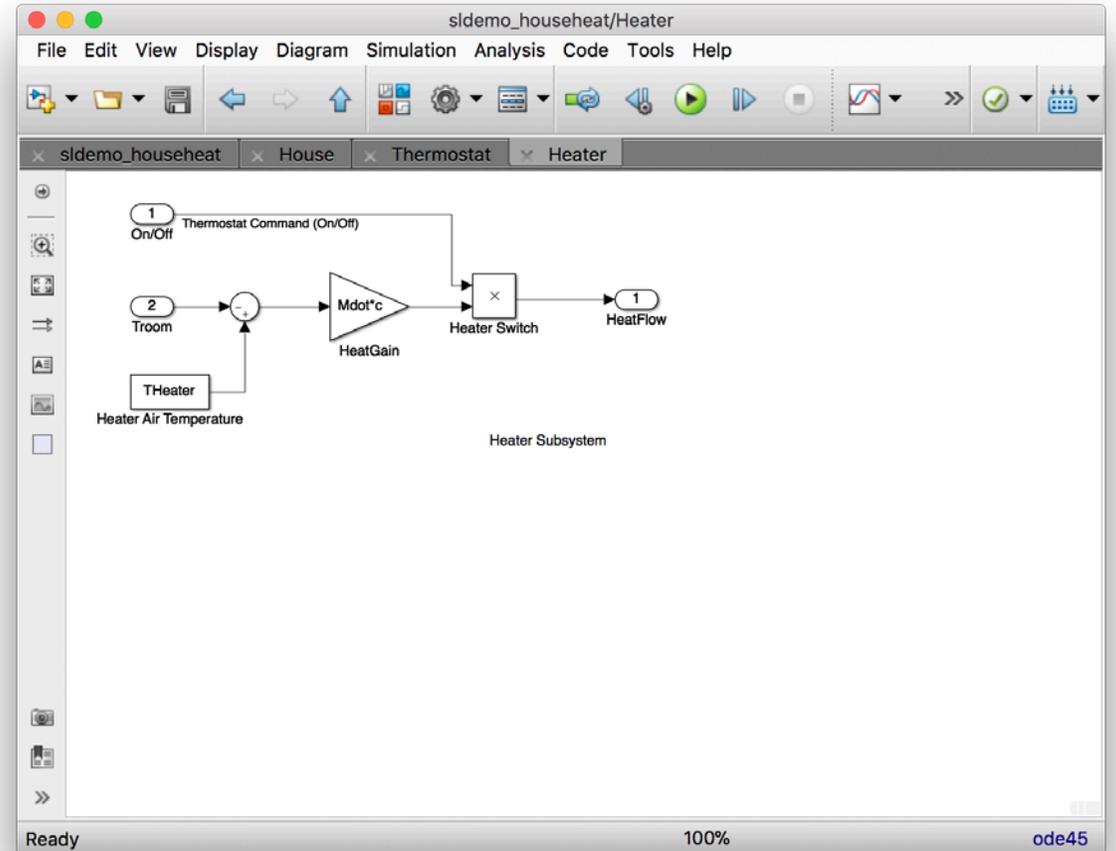
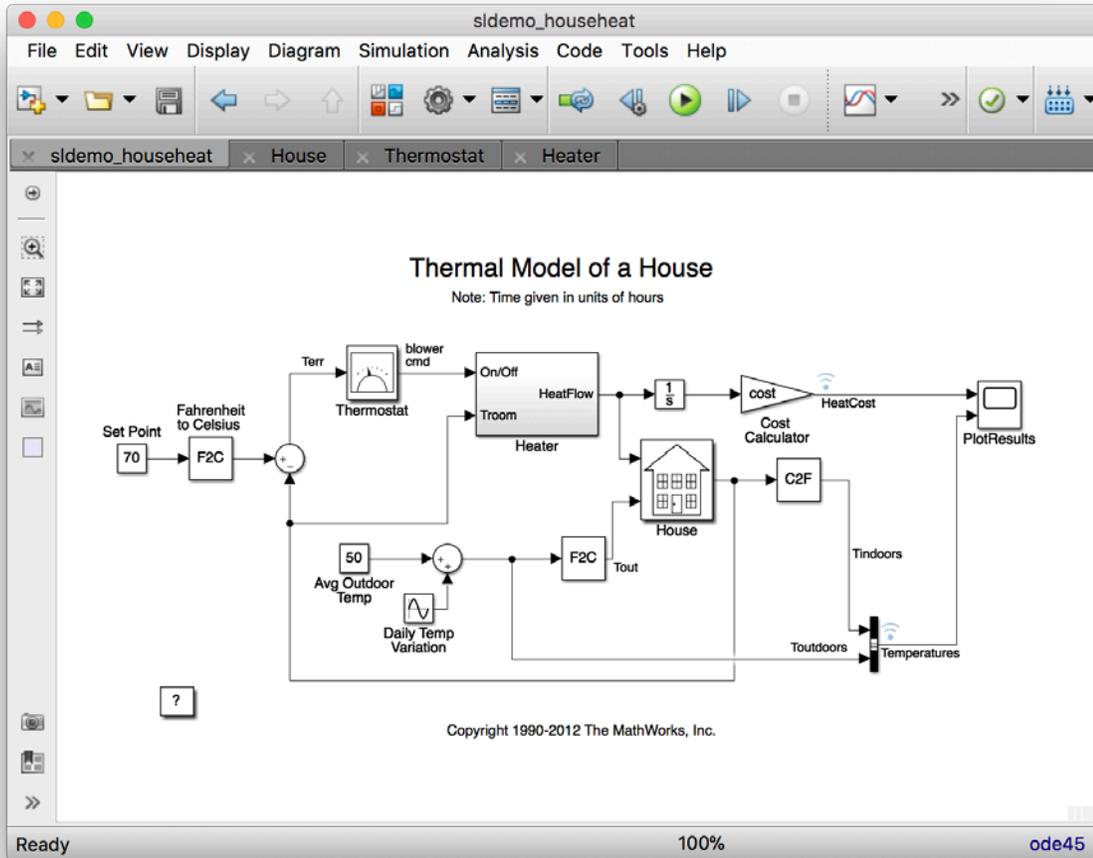


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Taking a look at the interface



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Arithmetic in Matlab

<code>2 + 3</code>	<code>ans = 5</code>
<code>a = 34 * 8</code>	<code>a = 272</code>
<code>pi</code>	<code>ans = 3.1416</code>
<code>i</code>	<code>ans = 0.0000 + 1.0000i</code>
<code>sin(pi)</code>	<code>ans = 1.2246e-16</code>
<code>eps</code>	<code>ans = 2.2204e-16</code>



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Vectors in Matlab

<code>f = 1:6</code>	f = 1 2 3 4 5 6
<code>g = 0:2:6</code>	g = 0 2 4 6
<code>sin(g)</code>	ans = 0 0.9093 -0.7568 -0.2794
<code>g(3)</code>	4
<code>g(1:3)</code>	0 2 4
<code>g'</code>	ans = 0 2 4 6



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More Vectors

<code>gg'</code>	<code>ans =</code> 0 2 4 6
<code>gg + gg</code>	<code>ans =</code> 0 4 8 12
<code>gg * gg'</code>	<code>ans =</code> 120
<code>gg * gg</code>	Error using * Inner matrix dimensions must agree.
<code>gg .* gg</code>	<code>ans =</code> 0 4 16 36 64



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Matrices in Matlab

<code>h = [1 2 3; 4 5 6; 7 8 9]</code>	<code>h =</code> <table><tr><td>1</td><td>2</td><td>3</td></tr><tr><td>4</td><td>5</td><td>6</td></tr><tr><td>7</td><td>8</td><td>9</td></tr></table>	1	2	3	4	5	6	7	8	9
1	2	3								
4	5	6								
7	8	9								
<code>h ^ 2</code>	<code>ans =</code> <table><tr><td>30</td><td>36</td><td>42</td></tr><tr><td>66</td><td>81</td><td>96</td></tr><tr><td>102</td><td>126</td><td>150</td></tr></table>	30	36	42	66	81	96	102	126	150
30	36	42								
66	81	96								
102	126	150								
<code>h .^ 2</code>	<code>ans =</code> <table><tr><td>1</td><td>4</td><td>9</td></tr><tr><td>16</td><td>25</td><td>36</td></tr><tr><td>49</td><td>64</td><td>81</td></tr></table>	1	4	9	16	25	36	49	64	81
1	4	9								
16	25	36								
49	64	81								



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A few useful notes

- The help command will display a function's help text. The doc command brings up more information

`help sin`

`doc sin`

- The semi-colon (;) will suppress output
- The up arrow key will go back to previous commands
- Typing and then using the up arrow key goes back to previous commands that start with that text
- The exclamation point is used for shell commands
`! rm matlab_crash_dump.*`
- The percent sign is used for comments
`%This is a Matlab comment`



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Vectorized code

Matlab is optimized for operations on matrices and vectors. Avoiding loops to access matrix values is a good idea.

Consider two ways to create a 1 x 10,000,000 vector
[1, 4, 9, 16, ..., 10000000²]

<pre>tic a=zeros(1,10000000); for i=1:10000000 a(i)=i^2; end toc</pre>	<pre>tic a=[1:10000000].^2; toc</pre>
Elapsed time is 0.110672 seconds.	Elapsed time is 0.064941 seconds.



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A note on initializing variables

Do it.

<pre>tic a=zeros(1,10000000); for i=1:10000000 a(i)=i^2; end toc</pre>	<pre>tic for i=1:10000000 a(i)=i^2; end toc</pre>
Elapsed time is 0.107770 seconds.	Elapsed time is 0.983030 seconds. Yikes.



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Matlab: implicit parallelism in svd

Many functions will recognize the multicore environment and create an appropriate number of threads. A good example is singular value decomposition (SVD), rewriting a matrix as the product of “nice” matrices.

<pre>> matlab tic svd(rand(5000)) toc</pre>	<pre>> matlab -singleCompThread tic svd(rand(5000)) toc</pre>
<pre>Elapsed time is 15.343513 seconds.</pre>	<pre>Elapsed time is 157.930566 seconds.</pre>



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Matlab: svd using the gpu

<pre>> qsub -I -q debug_gpu -l gres=ccm > ccmlogin > matlab tic svd(rand(5000)) toc</pre>	<pre>> qsub -I -q debug_gpu - lgres=ccm > ccmlogin > matlab tic svd(rand(5000, 'gpuArray')); toc</pre>
<pre>Elapsed time is 62.310409 seconds.</pre>	<pre>Elapsed time is 16.616624 seconds.</pre>



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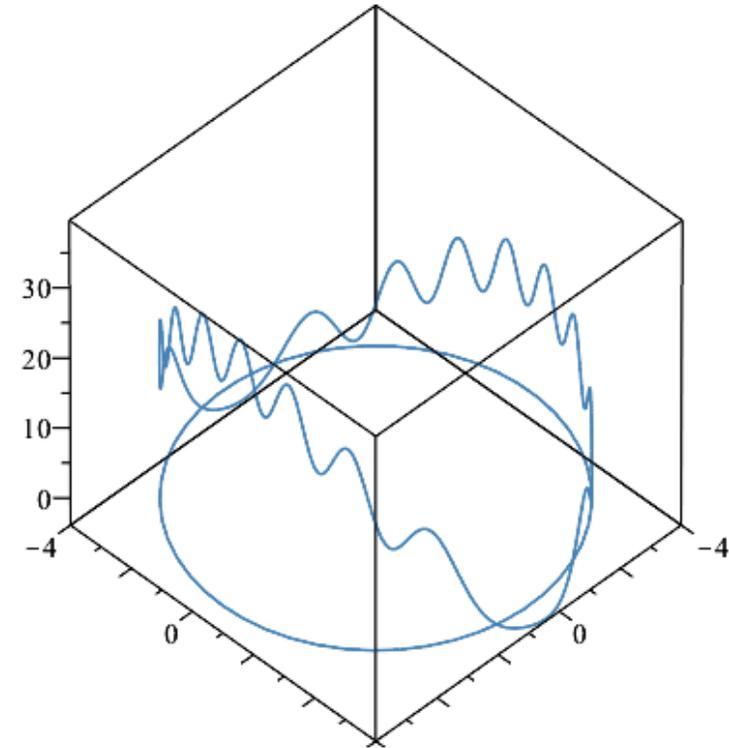


Matlab: parallel-enabled functions

Sample problem: maximize the function $x_1^2 + 4 \cdot \sin(5 \cdot x_2)$ subject to the constraint $(x_1 - 1)^2 + (x_2 - 1)^2 = 25$

We first write a function to define the constraint mycon.m.

```
function [c,ceq] = mycon(x)
    c = (x(1)-1)^2 + (x(2)-1)^2 - 25;
    ceq = [];
```



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Matlab: parallel-enabled functions

Then we set up the problem

```
opts = optimset('Algorithm','sqp');  
problem = createOptimProblem('fmincon','objective', ...  
    @(x) x(1)^2 + 4*sin(5*x(2)), 'x0',[3 3], 'lb',[-5-5], ...  
    'ub',[5 5], 'nonlcon',@mycon,'options',opts);  
ms = MultiStart;
```

```
ms.UseParallel = false;  
tic  
[x,f] =  
run(ms,problem,2000);  
toc
```

Elapsed time is 52.175676 seconds.

```
ms.UseParallel = true;  
tic  
[x,f] =  
run(ms,problem,2000);  
toc
```

Elapsed time is 5.533175 seconds.



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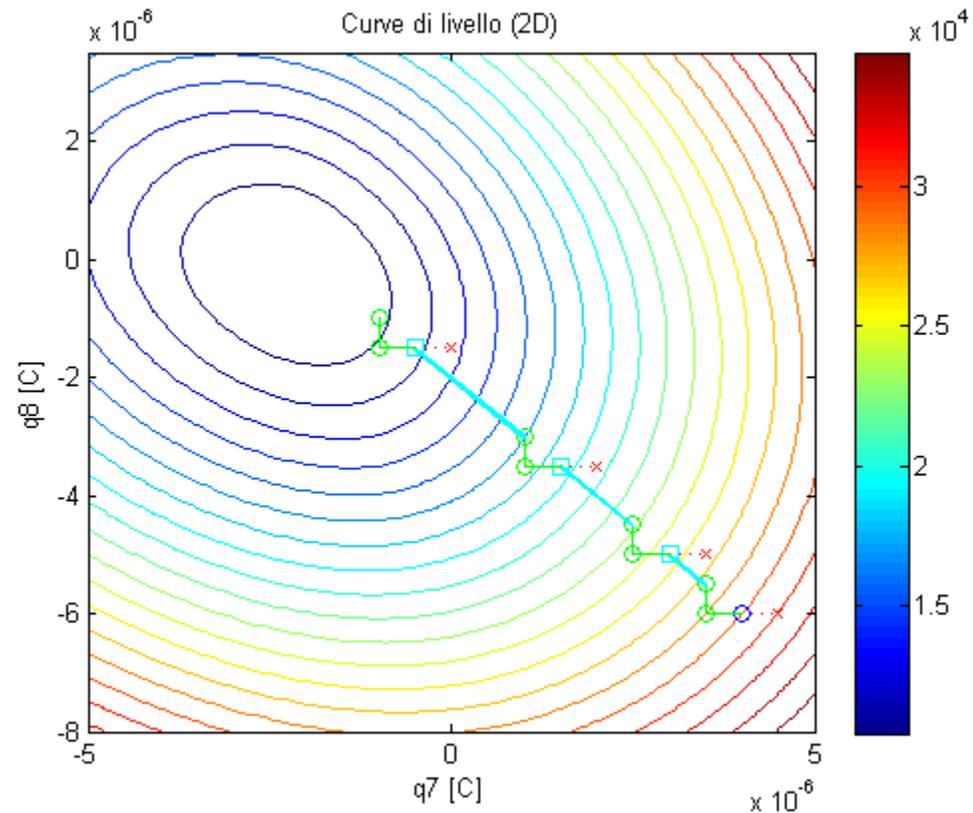


Matlab: parallel-enabled functions

The optimizer patternsearch is an example. At each step patternsearch checks the values of the objective function at near the current point. The first point with a lower value becomes the current point for the next step.

You can, however, use a pool of workers and check them in parallel. This means checking all the nearby points in the mesh.

Is this a good idea?



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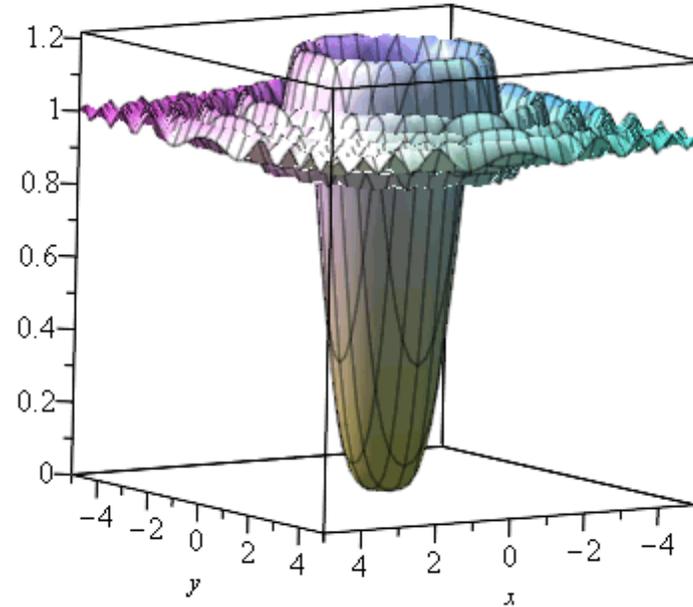
Matlab: parallel-enabled functions

For example, say we want to minimize the function

$$1 - \frac{\sin\left(\sum_{i=1}^{100} x_i^2\right)}{\sum_{i=1}^{100} x_i^2}$$

We define a function in Matlab

```
function y = f(x)
y = 1 - sin(sum(x.^2)) ./ sum((x.^2));
```



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Matlab: parallel-enabled functions

<pre>x0=ones(100,1)/100; tic patternsearch(@(x)f(x),x0); toc</pre>	<pre>parpool(15) options = psoptimset('UseParallel', true,... 'CompletePoll', 'on', 'Vectorized', 'off'); x0=ones(100,1)/100; tic patternsearch(@(x)f(x),... x0,[],[],[],[],[],[],[],... options); toc delete(gcp)</pre>
Elapsed time is 6.662042 seconds.	Hits iteration limit at 137.731795 seconds.



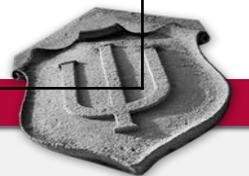
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Matlab: parallel for loops

If you have a pool of parallel workers you can use them to run a for-loop with parfor.

<pre>tic for i=1:5000000 a(i)=max(rand(100,1)); end toc</pre>	<pre>parpool(15) tic parfor i=1:5000000 a(i)=max(rand(100,1)); end toc delete(gcp)</pre>
Elapsed time is 21.712727 seconds.	Elapsed time is 2.548504 seconds.



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Matlab: parallel for loops

There are some restrictions on the loop, but the main one is that the order of evaluation can't matter. So the code below fails

```
%Fibonacci failure
a(1)=1;a(2)=1;
parpool(2)
parfor i=3:100
    a(i)=a(i-1)+a(i-2);
end
delete(gcp)
```

%Should have used Binet's formula



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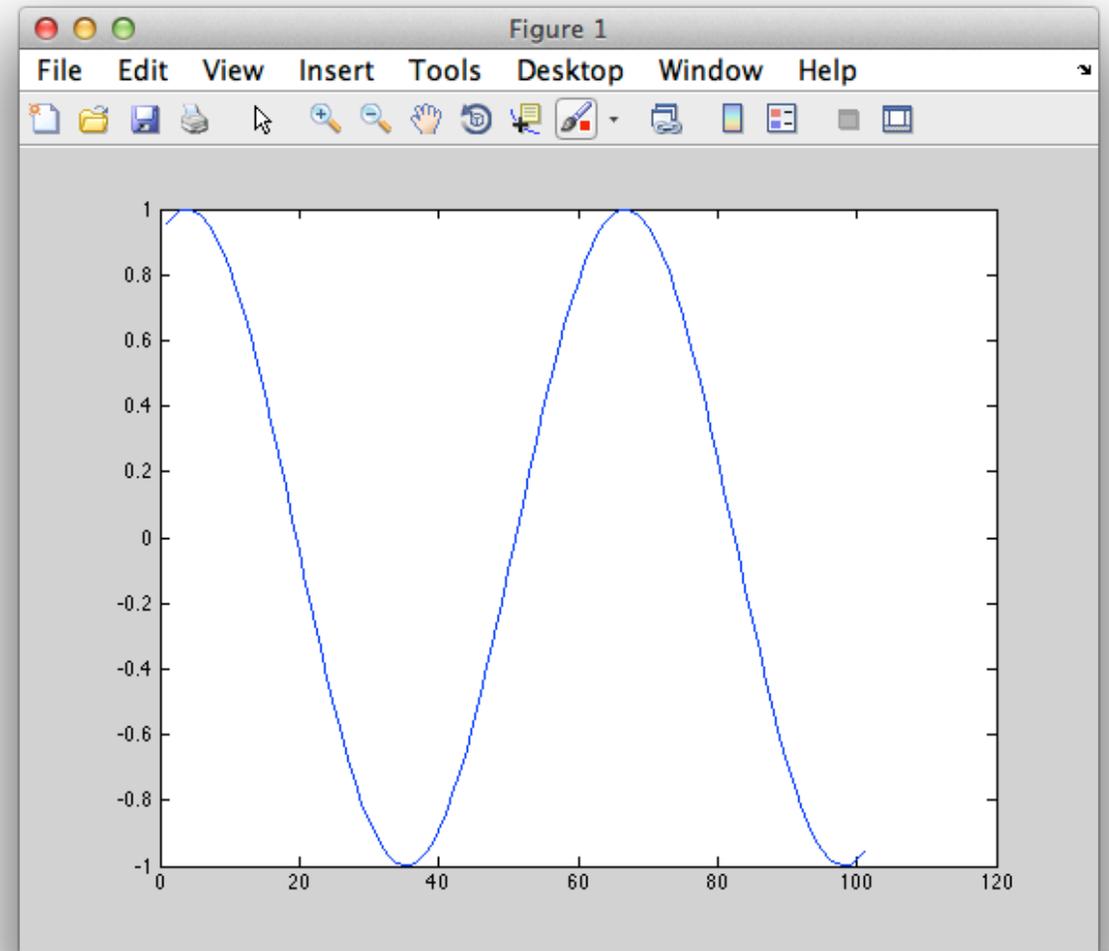


Plotting curves in Matlab

It's pretty straightforward!

```
x=-5:.1:5;  
plot(sin(x))
```

Note that both x and $\sin(x)$ are vectors of size 1×101 .



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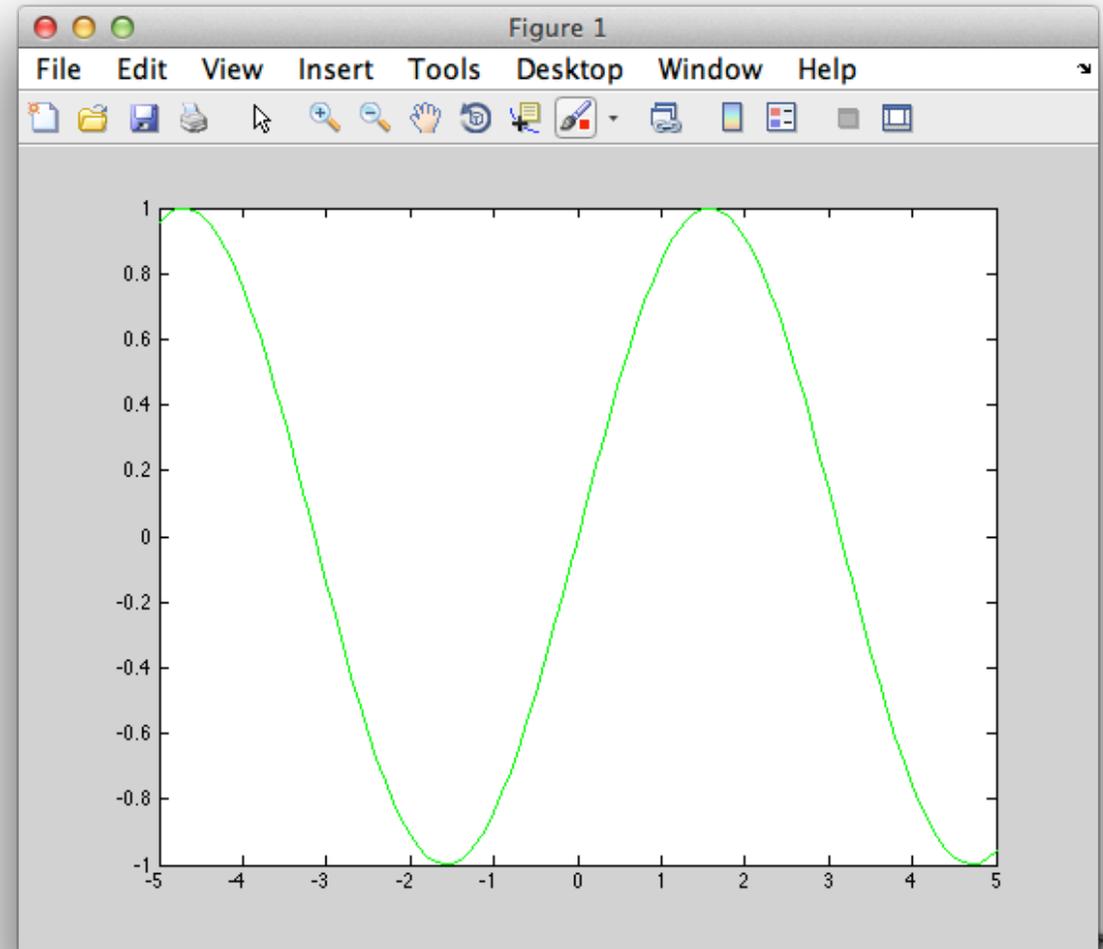
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Plotting curves in Matlab

```
x=-5:.1:5;  
plot(x,sin(x), 'g')
```



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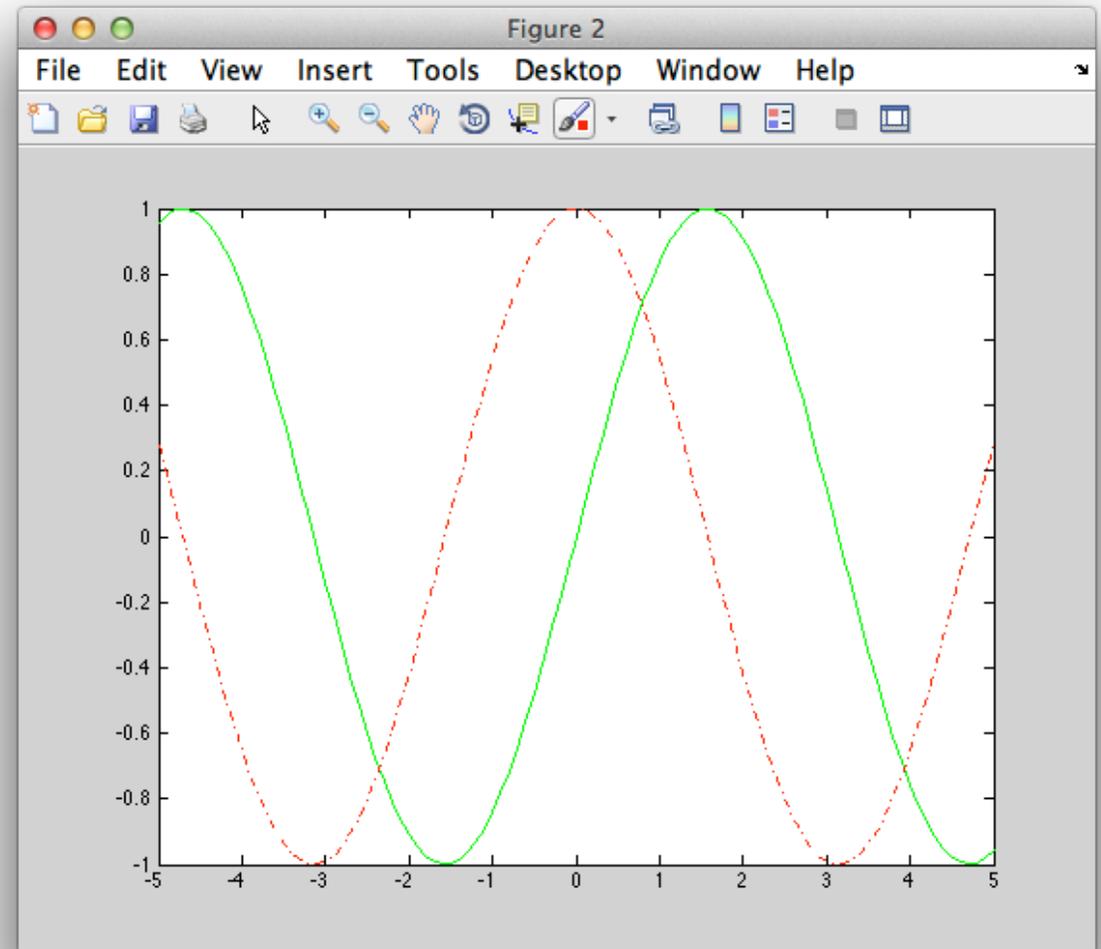
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Plotting curves in Matlab

```
figure(2)  
plot(x,sin(x),'g')  
hold on  
plot(x,cos(x),'r-.')
```



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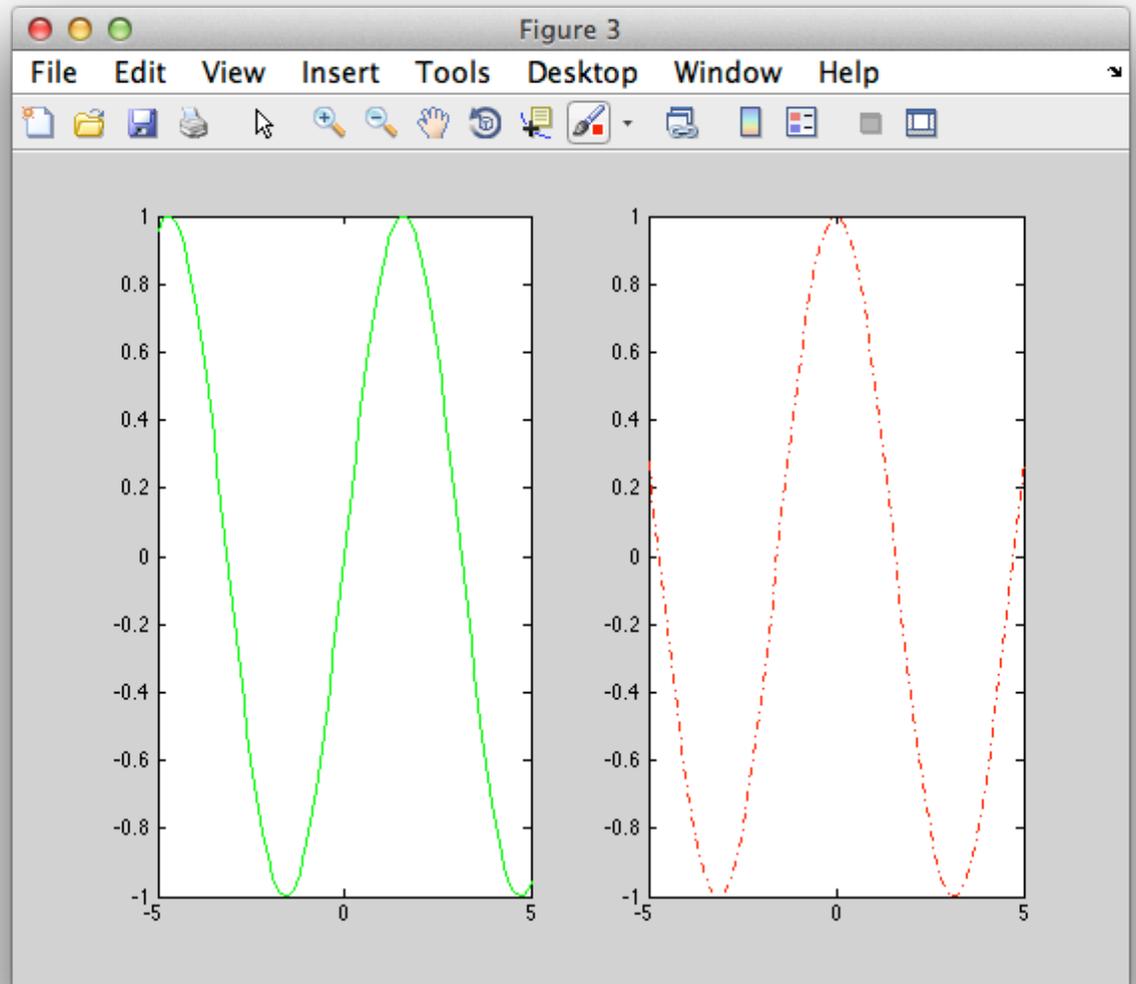
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Plotting curves in Matlab

```
figure(3)
subplot(1,2,1)
plot(x,sin(x),'g')
subplot(1,2,2)
plot(x,cos(x),'r-.')
```

See help plot for more examples



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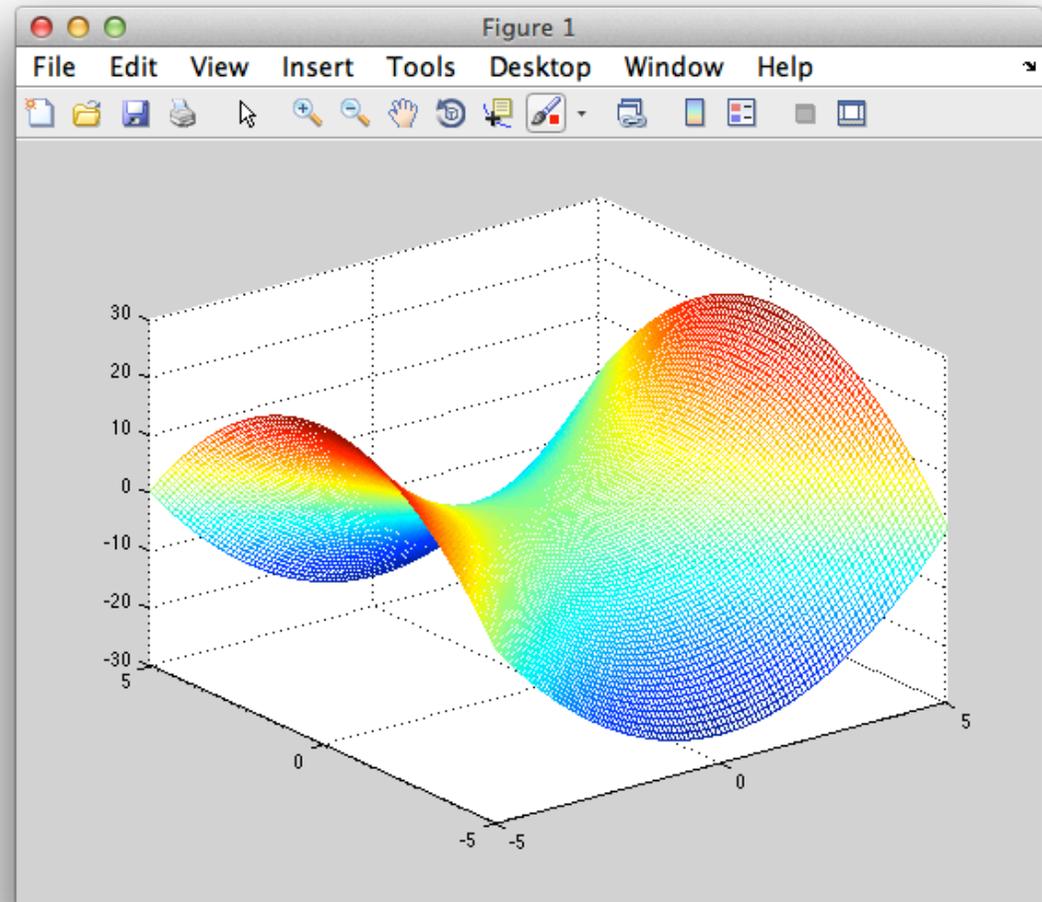


Plotting surfaces in Matlab

Plotting surfaces in Matlab is similar to plotting curves.

```
[x y] =  
meshgrid(-5:.1:5, -5:.1:5);  
z = x.^2 - y.^2;  
mesh(x, y, z)
```

Here x, y, and z are all matrices of size 101 x 101.



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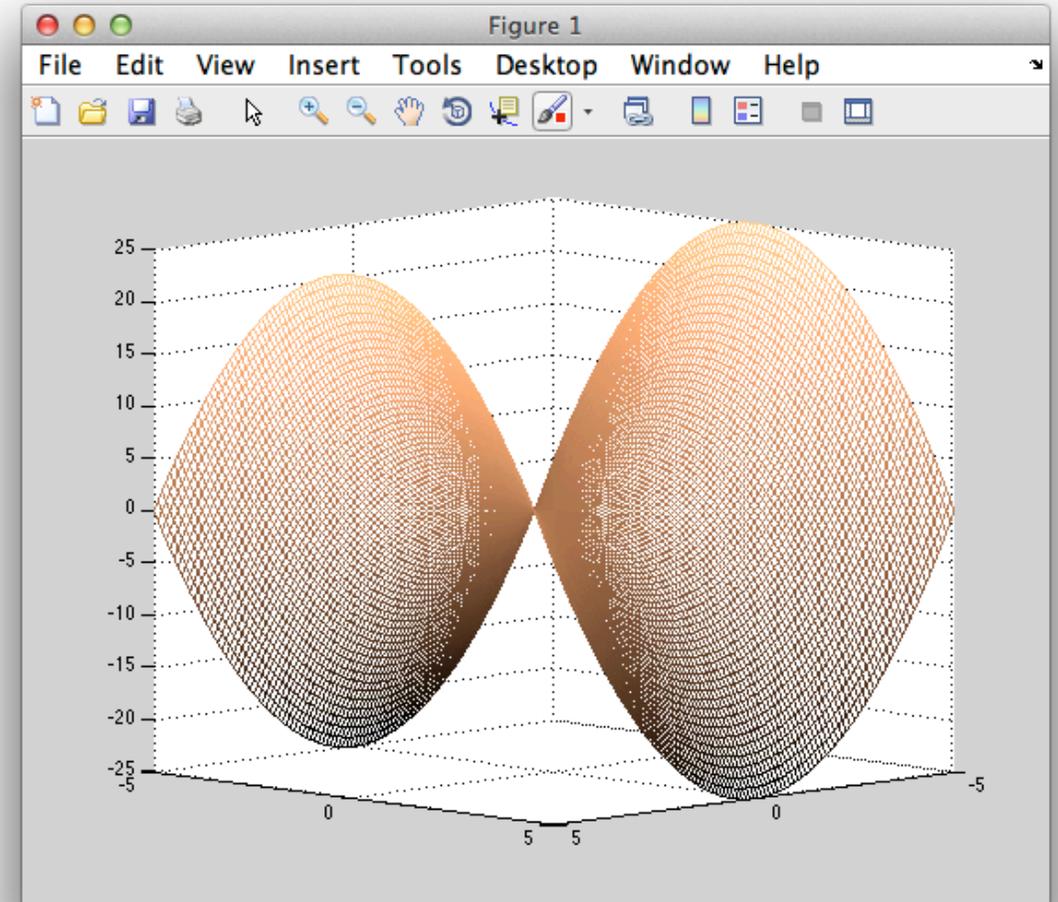
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Plotting surfaces in Matlab

```
colormap(copper)  
set(gca, ...  
'CameraPosition',[45 45 45])
```



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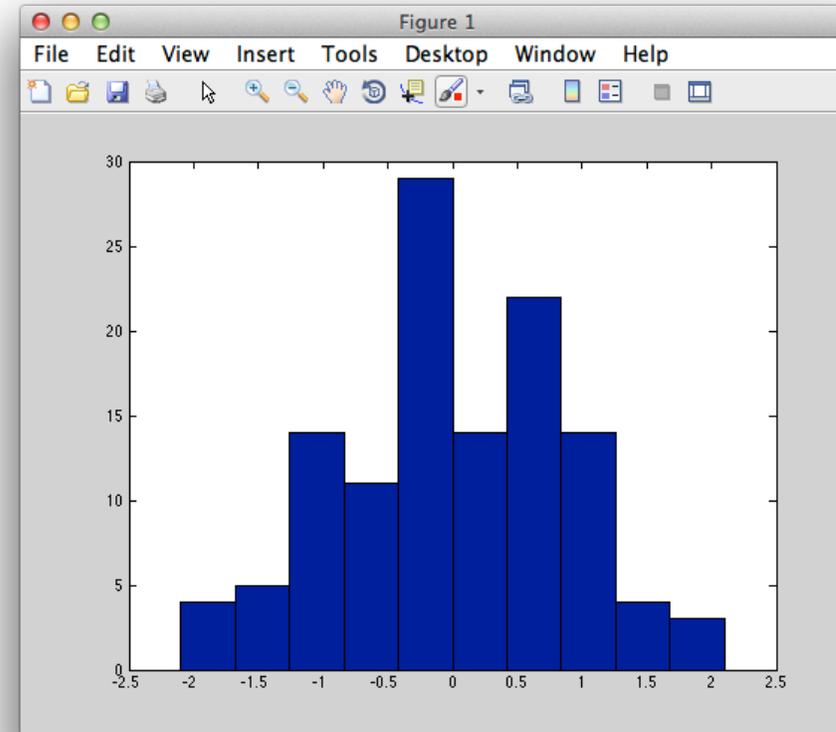


Statistical tests and statistical learning

The code below runs a Kolmogorov-Smirnov test on a column of data.

```
load examgrades;
hist(grades(:, 1))
test1 = grades(:,1);
x = (test1 - 75)/10;
[h p] = kstest(x)
h =
    0
p =
    0.561153346365393
hist(x)
```

The result $h=0$ shows kstest fails to reject the null hypothesis at the default 5% level.



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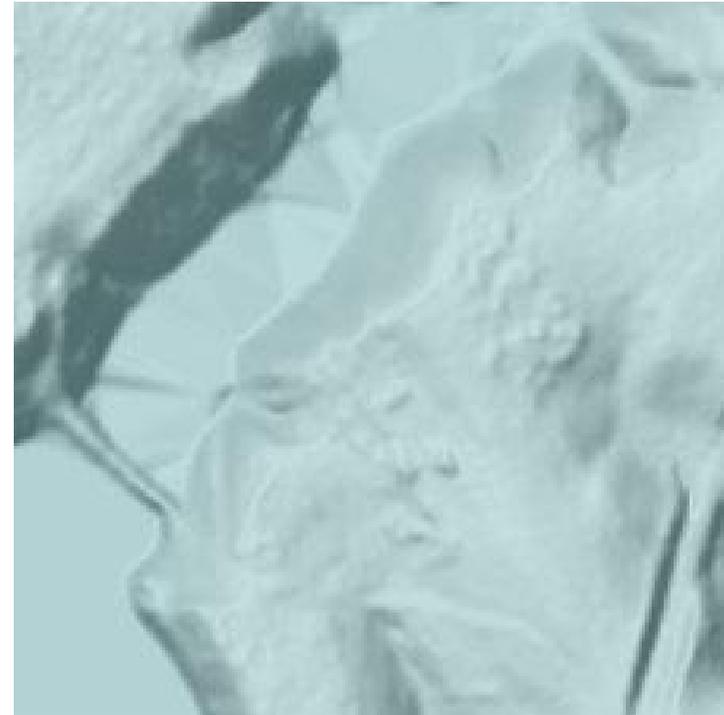


Statistical tests and statistical learning

For a final example we look at code to classify images. We can get a "decent" classifier with a little over a dozen lines of code.



There's a levee!



There's no levee.



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Statistical tests and statistical learning

For a final example we look at code to classify images. We can get a "decent" classifier with a little over a dozen lines of code.



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Statistical tests and statistical learning

```
% Set up the imagestore
rootFolder = '.';
types = {'menorah', 'sunflower'};

imds = imageDatastore(fullfile(rootFolder, types), 'LabelSource',
'foldernames');
imds.ReadFcn = @(filename)readAndPreprocessImage(filename);

%There are 85 sunflowers and 87 menorahs. Let's equalize the numbers.
tbl = countEachLabel(imds);
minSetCount = min(tbl{:,2}); %This number is 85 here.
imds = splitEachLabel(imds, minSetCount, 'randomize');
```



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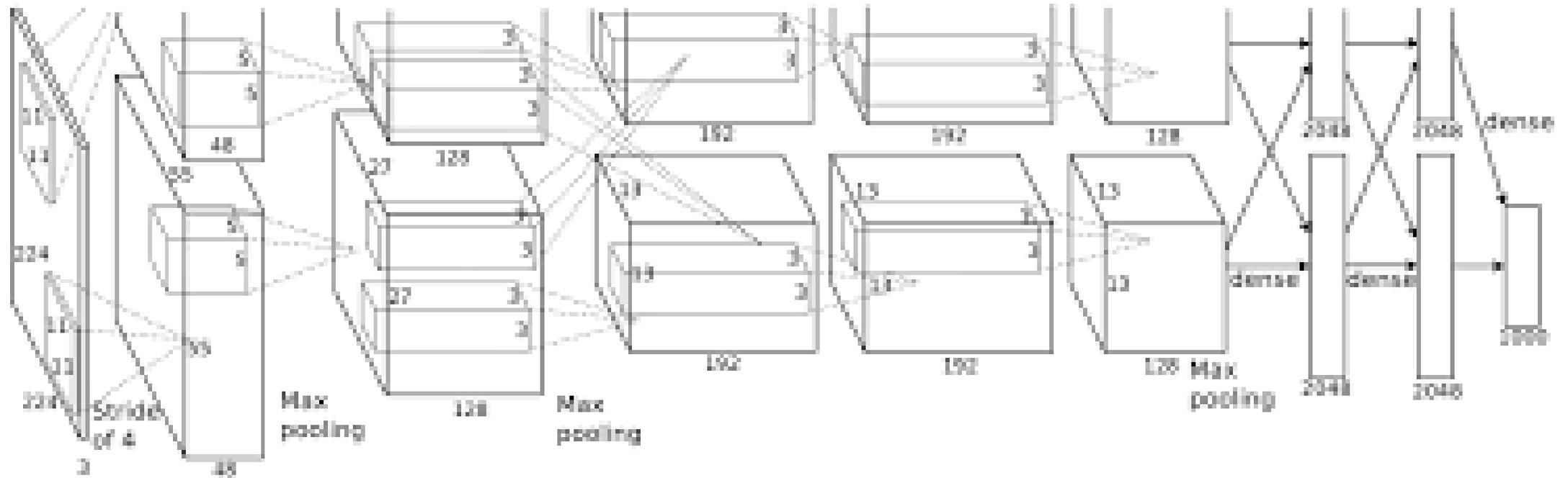
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Statistical tests and statistical learning

```
% Load pre-trained AlexNet  
net = alexnet();
```



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Statistical tests and statistical learning

```
%Spilt training and testing images in a 70/30 split
[trainingSet, testSet] = splitEachLabel(imds, 0.7, 'randomize');

featureLayer = 'fc7';
trainingFeatures = activations(net, trainingSet, featureLayer, ...
    'MiniBatchSize', 32, 'OutputAs', 'columns');

% Train multiclass SVM classifier using a fast linear solver.
classifier = fitcecoc(trainingFeatures, trainingSet.Labels, ...
    'Learners', 'Linear', 'Coding', 'onevsall', 'ObservationsIn', 'columns');
```



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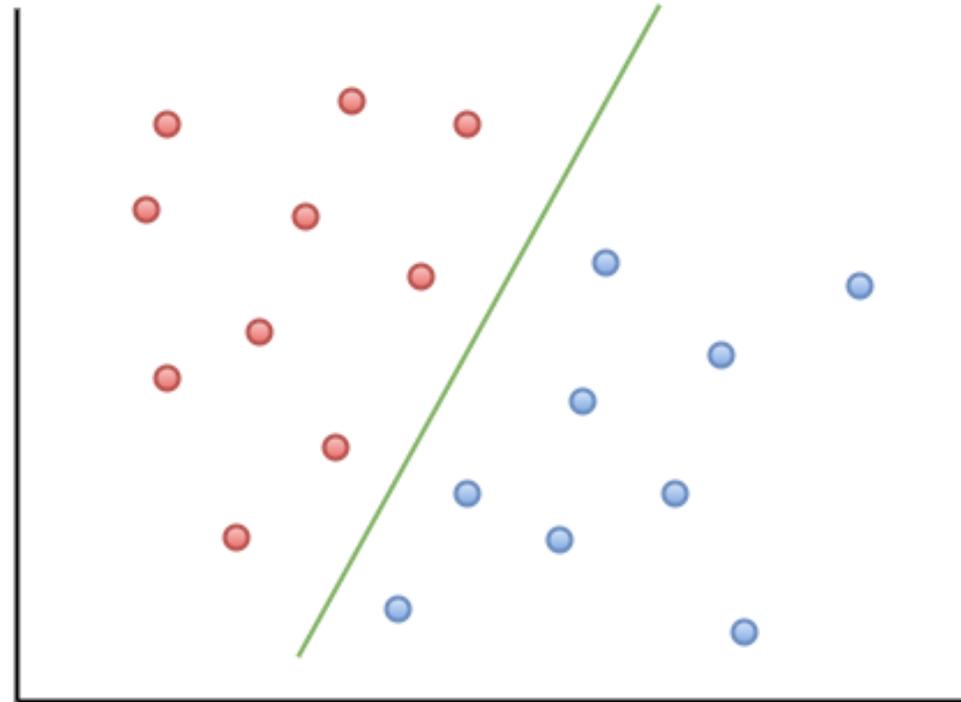
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Statistical tests and statistical learning

Recall the a support vector machine give a linear classifier. This is the sort of thing that should be doable.



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Statistical tests and statistical learning

```
testFeatures = activations(net, testSet, featureLayer);  
predictedLabels = predict(classifier, testFeatures);  
%The confusion matrix is diagonal. The classifier distinguishes sunflowerer  
% and menorahs just fine.
```

```
confusionmat(testSet.Labels, predictedLabels)
```

```
26  0  
 0 26
```



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Statistical tests and statistical learning

The classifier can't be improved. If we did need better we could swap out layers and retrain.

```
layersTransfer = net.Layers(1:end-3);  
layers = [  
    layersTransfer  
    fullyConnectedLayer(2)  
    softmaxLayer  
    classificationLayer];  
  
netTransfer = trainNetwork(trainingSet, layers);
```



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