

MATLAB bootcamp

Table of Contents

Introduction.....	2
Interface and basic commands.....	2
Editor.....	3
Comments.....	3
Breaking down long codes into several lines.....	3
Getting help.....	4
Discovering MATLAB via demos.....	4
Basic input.....	4
Variable assignment.....	4
Vectors and Matrices.....	5
Colon operator.....	5
Vectors.....	6
Matrices.....	7
Some matrix operations.....	7
Concatenation.....	8
Accessing elements of matrices.....	9
Basic maths.....	10
Operators.....	10
Matrix addition and subtraction.....	10
Matrix multiplication.....	11
Dot operations.....	11
Transpose.....	12
Basic functions.....	12
length	12
size.....	12
sum	13
max, min.....	13
prod.....	14
cumsum, cumprod, cummax, cummin.....	14
exp.....	14
log.....	14
sqrt.....	15
mean.....	15
var, std.....	15
cov.....	15
skewness, kurtosis.....	16
Logical Operators.....	16
Main logical operators.....	16
Combining logical statements.....	16
Logical functions.....	17
isnan, isinf, isfinite	17
all, any.....	17
Control flow.....	18
if, elseif, end.....	18
Loops.....	18

for ... end.....	19
while ... end	20
break.....	20
Functions.....	21
Graphics.....	22
Graph properties.....	22
2D plotting.....	22
plot.....	22
scatter.....	25
hist.....	26
Combining graphs.....	28
3D plotting (not covered).....	34
Exporting plots.....	35
Importing and exporting data.....	35
Importing (loading) MATLAB's built-in data.....	35
Importing external data.....	36
Exporting data.....	36
Simulation and generation of random numbers.....	36
Four main ways to generate pseudorandom numbers in MATLAB.....	36
Simulation of random numbers with specified parameters.....	37
Replication of simulated numbers.....	37
Exercises.....	37
Exercise 1. Accessing elements of a matrix.....	37
Exercise 2. Working with graphs.....	38
Exercise 3. Nonlinear optimization with linear constraints.....	39

Introduction

Interface and basic commands

Three main windows:

- Command window
- Workspace
- Current working directory:

Find current working directory

```
pwd
```

Semicolon (;) used at the end of a command line to **suppress output** display:

```
pwd;
```

Set current working directory, mine is:

```
cd C:\Users\mydam\Desktop\Teaching\matlab\Matlab
% cd C:\Users\mydam\Desktop\test
```

Clear command window

```
clc
```

Clear all variables in the workspace

```
clear
```

Clear specific variables only

```
clear var1 var2
```

View files in the directory

```
dir
```

Delete files in the directory

```
delete fileName
```

Editor

- Home -> New Script : Normal text editor for MATLAB, no interaction
- Home -> New Live Script : Script + Formatted text + Results in a single environment

Comments

Percentage symbol (%) tells the processing to skip the current (commented) line and continues on the next (similar to LaTeX).

```
% this is a block of text within a command area  
% often used to comment  
% or to skip a command  
t = 3; % set t equal to 3
```

Shortcuts:

- Comment out: CLTR + R
- Uncomment: CLTR + T

Breaking down long codes into several lines

```
x = 10;
```

```
y = x + exp(x) + sqrt(x) - ... % three dots tell Matlab to continue on the next line
    x^2 + 2*x
```

```
y = 2.1960e+04
```

```
y
```

```
y = 2.1960e+04
```

Getting help

Help with function

```
% help mean
help floor
```

```
floor Round towards minus infinity.
floor(X) rounds the elements of X to the nearest integers
towards minus infinity.
```

```
See also round, ceil, fix.
```

```
Documentation for floor
Other functions named floor
```

```
floor(1/3)
```

```
ans = 0
```

Help with toolbox

```
% help stats          % returns functions available in the stats toolbox
```

Pull out documentation on a function/toolbox

```
doc stats
```

To view the whole documentation

```
doc
```

Discovering MATLAB via demos

```
demo
```

Basic input

Variable assignment

Name of variable has to be different from predefined functions/variables in MATLAB. To check if a name is already taken:

```
% which i  
which z
```

'z' not found.

Assignment of values to variable via the equal sign:

```
m = 5 + 7
```

```
m = 12
```

```
z = 2
```

```
z = 2
```

```
q = z + x
```

```
q = 12
```

Later assignment overwrites previous ones.

```
i = 2;  
i
```

```
i = 2
```

```
clear i % clear assignment  
i
```

```
ans = 0.0000 + 1.0000i
```

Variable names are **case sensitive**

```
z1 = 23;  
Z1 = 12;  
z1 + Z1
```

Variable names must **begin with a letter**, and contain **no math operators** (:,-,+,*,etc.)

- Valid names: myVar, my_var1, MyVar1, global_1
- Invalid names: _myvar, 1Var, X+1, global

Variable names contain **none of the following keywords**:

```
break case catch classdef continue else elseif end for function  
global if otherwise parfor persistent return spmd switch try while
```

Vectors and Matrices

Colon operator

Generates a row vector of numbers in ascending (default) or descending orders.

```
x = 1:5 % first operand: starting value; second: ending value; step = 1 by default
```

```
x = 1x5
     1     2     3     4     5
```

Suppose we want to specify the steps also

```
y = 1:0.5:5 % the operand in the middle specifies the steps of the sequence
```

```
y = 1x9
     1.0000     1.5000     2.0000     2.5000     3.0000     3.5000     4.0000     4.5000 ...
```

We can also generate a descending sequence (steps specification required)

```
z = 5:-1:-5
```

```
z = 1x11
     5     4     3     2     1     0    -1    -2    -3    -4    -5
```

If we don't specify steps

```
t = 5:-5
```

```
t =
1x0 empty double row vector
```

Vectors

Three ways to generate a row vector:

```
x = 1:5
```

```
x = 1x5
     1     2     3     4     5
```

```
y = [1,2,3,4,5]
```

```
y = 1x5
     1     2     3     4     5
```

```
z = [1 2 3 4 5]
```

```
z = 1x5
     1     2     3     4     5
```

The function `length()` gives the length of the vector, `size()` gives the dimension of the matrix (both row and column indices)

```
size(x)
```

```
ans = 1x2  
      1      5
```

```
length(x)
```

```
ans = 5
```

Column vectors

```
v = [1; 2; 3; 4; 5]
```

```
v = 5x1  
      1  
      2  
      3  
      4  
      5
```

```
size(v)
```

```
ans = 1x2  
      5      1
```

Inside the square brackets, a semicolon signifies a new row.

Matrices

A 3x3 matrix

```
L = [1 2 3; 4 5 6; 8 9 1]
```

```
L = 3x3  
      1      2      3  
      4      5      6  
      8      9      1
```

Some matrix operations

The **determinant** of L is

```
det(L)
```

```
ans = 27
```

We can compute its **inverse** since it is not singular

```
L_inv = inv(L)
```

```
L_inv = 3x3  
 -1.8148    0.9259   -0.1111  
  1.6296   -0.8519    0.2222  
 -0.1481    0.2593   -0.1111
```

Some special matrices

Matrices of zeros

```
x = zeros
```

```
x = 0
```

```
y = zeros(4)
```

```
y = 4×4
    0    0    0    0
    0    0    0    0
    0    0    0    0
    0    0    0    0
```

```
C = zeros(2,3)
```

```
C = 2×3
    0    0    0
    0    0    0
```

Matrices of ones

```
A = ones(3)
B = ones(2,3)
```

Identity matrices

```
eye(4)
% eye(4,1)
```

```
ans = 4×1
    1
    0
    0
    0
```

Empty matrices

```
A = []
```

Concatenation

```
L = [1 2 3; 4 5 6; 8 9 1]
```

```
L = 3×3
    1    2    3
    4    5    6
    8    9    1
```

```
v = [0.5 1 1]
```



```
v = 1×3
    0.5000    1.0000    1.0000
```

Vertical concatenation

```
M = [L;v]
```

```
M = 4×3
    1.0000    2.0000    3.0000
    4.0000    5.0000    6.0000
    8.0000    9.0000    1.0000
    0.5000    1.0000    1.0000
```

Horizontal concatenation

```
% N = [L v]
% P = [L transpose(v)]
P = [L, v']
```

```
P = 3×4
    1.0000    2.0000    3.0000    0.5000
    4.0000    5.0000    6.0000    1.0000
    8.0000    9.0000    1.0000    1.0000
```

Accessing elements of matrices

Extract a row

```
L = [1 2 3; 4 5 6; 7 8 9]
```

```
L = 3×3
     1     2     3
     4     5     6
     7     8     9
```

Extract an entire row

```
row3 = L(3,:)
```

The colon operator (:) means *all elements in that dimension*

Extract a column

```
L = [1 2 3; 4 5 6; 7 8 9]
```

```
L = 3×3
     1     2     3
     4     5     6
     7     8     9
```

```
col2 = L(:,2)
```

```
col2 = 3×1
      2
      5
      8
```

Extract a single element from a matrix

```
L = [1 2 3; 4 5 6; 7 8 9]
row3_col2 = L(3,2)
```

Extract a single element from a vector

```
col2(3)
```

Extract a submatrix from a matrix

```
M = randn(4)
```

```
M = 4×4
    -1.2075    1.0347   -0.7873   -0.8095
     0.7172    0.7269    0.8884   -2.9443
     1.6302   -0.3034   -1.1471    1.4384
     0.4889    0.2939   -1.0689    0.3252
```

```
N = M(2:4,[2 3]) % extract from M rows 2-4, columns 2,3
```

```
N = 3×2
     0.7269    0.8884
    -0.3034   -1.1471
     0.2939   -1.0689
```

Basic maths

Operators

- Addition: $x + y = x + y$
- Subtraction: $x - y = x - y$
- Multiplication: $x * y = xy$
- Division (left): $x / y = \frac{x}{y}$
- Division (right): $x \setminus y = \frac{y}{x}$
- Exponential : $x ^ y = x^y$

Care must be taken when x and/or y are not scalars.

Matrix addition and subtraction

In linear algebra, these operations require that the two matrices have the same dimension.

```
x = [1 2; 3 4]
```

```
x = 2x2
     1     2
     3     4
```

```
y = [5 6; 7 8]
```

```
y = 2x2
     5     6
     7     8
```

```
x + y
```

```
ans = 2x2
     6     8
    10    12
```

Nevertheless, the following operations are also allowed in MATLAB. Can you guess what they result in?

```
x + 3;
x + y(:,1);
x + y(1,:);
```

Matrix multiplication

Matrices must be conformable in order to multiplication to work

```
x * y;
% x * y(1,:) % produces an error
x * y(:,1);
```

Dot operations

The dot operator (.) signifies element-wise operations.

Compare

```
x
```

```
x = 2x2
     1     2
     3     4
```

```
y
```

```
y = 2x2
     5     6
     7     8
```

```
x .* y
```

```
ans = 2x2
     5    12
    21    32
```

```
% x * y
```

Transpose

The transpose of a matrix is either obtained by the function `transpose` or by the `'` operator.

```
transpose(x)  
x'
```

Basic functions

length

This function returns the *maximum dimension* of a matrix. That is, if A is N-by-K matrix, then `length(A)` returns $\max\{N,K\}$.

```
A = [2 3; 4 5; 6 7]
```

```
A = 3x2  
    2    3  
    4    5  
    6    7
```

```
length(A)
```

```
ans = 3
```

```
length(A(1,:))
```

```
ans = 2
```

size

This function returns the dimension of a matrix.

```
A = [2 3; 4 5; 6 7]
```

```
A = 3x2  
    2    3  
    4    5  
    6    7
```

```
size(A)
```

```
ans = 1x2  
     3     2
```

To extract the number of rows and columns separately:

```
[rowA, colA] = size(A)
```

```
rowA = 3  
colA = 2
```

sum

This function computes the sum of each column of a matrix, returning a row vector

```
A = [2 3; 4 5; 6 7]
```

```
A = 3x2
     2     3
     4     5
     6     7
```

```
sum(A)
```

```
ans = 1x2
     12     15
```

```
sum(A,1)
```

```
ans = 1x2
     12     15
```

Can we sum by row?

```
sum(A,2) % the second argument specifies the dimension along which the sum is performed
```

Can we sum all elements of a matrix?

```
sum(sum(A))
```

max, min

Likewise, these operators search for the max/min value of each column of a matrix. The result is a row vector of length equal to the number of columns of the matrix

```
A = [1 2; 4 3; 5 9]
```

```
A = 3x2
     1     2
     4     3
     5     9
```

```
maxA = max(A)
```

```
maxA = 1x2
     5     9
```

```
size(A)
```

```
ans = 1x2
     3     2
```

```
size(max(A))
```

```
ans = 1x2
     1     2
```

To compute extremal values along the row

```
max(A,[],2)
max(A')
```

It is also possible to report the position/index of the minimal/maximal value

```
[minA, indmin] = min(A)
```

```
minA = 1x2
      1    2
indmin = 1x2
      1    1
```

Note that when the extremal values are not unique, MATLAB will report the index of the first one.

prod

Returns product of elements of each column of a matrix. It is possible to multiply elements of each row by specifying the dimension to multiply across. Compare

```
A = [1 2; 4 3; 5 9];
prod(A);      % by column
prod(A,1);    % by column
prod(A,2);    % by row
```

cumsum, cumprod, cummax, cummin

The first two functions compute the cumulative sum and product of a matrix (column-by-column by default)

The last two compute the cumulative max and min.

Examples:

```
x = [1 3 2 0 9 6]
cumsum(x)
cummin(x)
cummax(x)
```

When the argument is a matrix instead of a vector, each of the above operations is performed along each column of the matrix.

```
A = [1 2; 4 3; 5 9]
cumsum(A)
cummin(A)
cummax(A)
```

exp

Computes the exponential of a matrix (element-by-element)

log

Computes the natural logarithm of a matrix (element-by-element)

sqrt

Computes the square root of a matrix (element-by-element)

mean

Computes the mean of each column of a matrix

```
C = randn(4,3) % generate a 4x3 matrix of standard normal random numbers
```

```
C = 4x3
    -0.7549    -0.2414    -0.0301
     1.3703     0.3192    -0.1649
    -1.7115     0.3129     0.6277
    -0.1022    -0.8649     1.0933
```

```
mean(C)
```

```
ans = 1x3
    -0.2996    -0.1186     0.3815
```

Of course we can also compute the row averages

```
mean(C,2)
```

var, std

Compute the sample variances (var) and standard deviations (std) of each column

```
n = 10000;
x = randn(n,4); % generate a nx4 matrix of standard normal numbers
xbar = mean(x)
var(x)
std(x)
```

NB: option to exclude missing values in the computation

cov

cov computes the sample covariance matrix.

Clearly if x is a vector then $\text{var}(x) = \text{cov}(x)$. It is a symmetric matrix that gives the variance of each column vector along the principal diagonal, and the covariances off the diagonal.

```
D = rand(3)
col1 = D(:,1); col2 = D(:,2); col3 = D(:,3);
cov(D)
cov12 = cov(col1,col2)
% cov13 = cov(col1,col3)
% cov23 = cov(col2,col3)
```

skewness, kurtosis

skewness and kurtosis compute the sample skewness and kurtosis of a matrix (column by column)

```
n = 10; m = 10000;  
X = randn(n,3);  
Y = randn(m,3);  
skewness(X)  
skewness(Y)  
kurtosis(X) % recall that the skewness for a standard normal distribution is 3  
kurtosis(Y)
```

Logical Operators

Main logical operators

- Greater than : >
- Greater than or equal to: >=
- Less than : <
- Less than or equal to : <=
- Equal to : ==
- Not equal to: ~=

The result of a logical statement is true (1) or false (0) (Boolean values) in MATLAB.

```
x = eye(2)
```

```
x = 2x2  
    1    0  
    0    1
```

```
y = [1 1; 0 1]
```

```
y = 2x2  
    1    1  
    0    1
```

```
x(1,1) == y(1,1)
```

```
ans = logical  
     1
```

```
x == y
```

```
ans = 2x2 logical array  
    1    0  
    1    1
```

Combining logical statements

Logical expressions can be combined using the logical devices

- and : & or && when both inputs are scalar
- or : ||
- not : ~

Logical indexing:

```
x = linspace(1,9,9) % generate an array of 9 evenly spaced values from 1 to 9
```

```
x = 1x9
     1     2     3     4     5     6     7     8     9
```

```
% x(x/2==floor(x/2)) % print out all even elements of x
x(x/2 == floor(x/2) & x>=4) % print out all even elements greater or equal to 4
```

```
ans = 1x3
      4     6     8
```

Logical functions

isnan, isinf, isfinite

Any element is either nan (not-a-number), finite, or infinite. Note that these three operate element by element.

```
x = linspace(1,5,9)
```

```
x = 1x9
     1.0000     1.5000     2.0000     2.5000     3.0000     3.5000     4.0000     4.5000 ...
```

```
x([1 3 6]) = nan
```

```
x = 1x9
     NaN     1.5000     NaN     2.5000     3.0000     NaN     4.0000     4.5000 ...
```

```
isnan(x)
```

```
ans = 1x9 logical array
      1     0     1     0     0     1     0     0     0
```

```
isfinite(x)
```

```
ans = 1x9 logical array
      0     1     0     1     1     0     1     1     1
```

```
isinf(x)
```

```
ans = 1x9 logical array
      0     0     0     0     0     0     0     0     0
```

Other useful logical operators: isreal, ischar, isempty, isequal, islogical, isscalar, isvector

all, any

- all : operates column by column, returns a logical value of 1 (true) if *all* the elements of the column is 1

- **any** : operates column by column, returns a logical value of 1 (true) if *any* of the elements of the column is 1

Useful to detect variable satisfying a certain condition (such as being missing)

```
M = randn(4)
M([1 4], [1 4]) = nan
isnan(M)
all(isnan(M))
any(isnan(M))
any(M>=0) % returns true if any elements of each column is positive (and nonmissing)
```

Control flow

Allows different code to be executed depending on whether conditions are met.

if, elseif, end

The **if ... elseif ... end** blocks begin with an **if** statement followed by a *scalar* logical expression and terminates with **end**. More complex logical conditions can be added using **elseif** or **else**.

```
x = 1;
if x <= 10
    x = x + 1
end
```

```
x = 2
```

Or a more complex structure

```
x = 4;
if x/2 == floor(x/2)
    "even"
elseif x > 5
    x = x - 1
else
    x = 2*x
end
```

```
ans =
"even"
```

Loops

Two types of loop blocks

- **for ... end** : iterates over a predetermined set of values
- **while ... end** : continues the loop as long as some logical expression is satisfied

All **for** loops can be expressed as **while** loops.

for ... end

```
count = 0;  
for i = 1:5  
    count = count + i  
end
```

```
count = 1  
count = 3  
count = 6  
count = 10  
count = 15
```

What does this loop do?

```
count = 0;  
for i = 1:5 % the number of times the j loop is run  
    for j = 1:5  
        count = count + j  
    end  
end
```

```
count = 1  
count = 3  
count = 6  
count = 10  
count = 15  
count = 16  
count = 18  
count = 21  
count = 25  
count = 30  
count = 31  
count = 33  
count = 36  
count = 40  
count = 45  
count = 46  
count = 48  
count = 51  
count = 55  
count = 60  
count = 61  
count = 63  
count = 66  
count = 70  
count = 75
```

```
count
```

```
count = 75
```

Find the sum of a vector

```
% generate a vector of 100 nonnegative integers less than or equal to 50
```

```
x = linspace(1,5,5)
```

```
x = 1×5  
    1    2    3    4    5
```

```
count = 0;  
for jj = 1:length(x)  
    count = count + x(jj)  
end
```

```
count = 1  
count = 3  
count = 6  
count = 10  
count = 15
```

```
count
```

```
count = 15
```

while ... end

Should be avoided if equivalent **for** loops exist (that is in situations where the number of iterations are known beforehand). When this is not the case, **while** loops can be used.

```
mu = 1;  
index = 1;  
tic  
while abs(mu) > .0001  
    mu = (mu + randn)/index;  
    index = index + 1;  
end  
elapsedtime = toc;  
fprintf('Iteration time with no break = %.4f',elapsedtime)
```

```
Iteration time with no break = 0.0093
```

```
index
```

```
index = 341
```

Since `randn` gives a random standard normal number, we do not know how many iterations it might take for the loop to end (i.e. when $\text{abs}(\text{mu}) \leq .0001$). For this reason no **for** loop can be a substitute in this case.

while loops are extremely useful in numerical dynamic programming.

break

`break` statements can be useful in a loop to tell MATLAB when to stop. This can be quite handy to break out of a `while` loop that might need too many iterations.

```
mu = 1;  
index = 1;
```

```
tic
while abs(mu) > .0001
    mu = (mu + randn)/index;
    index = index + 1;
    if index >= 50
        break
    end
end
elapsedtime = toc;
sprintf('Iteration time with break = %.4f', elapsedtime)
```

```
ans =
'Iteration time with break = 0.0147'
```

```
% sprintf('Iteration time with break =%.7.4f', elapsedtime)
```

```
index
```

```
index = 50
```

Functions

Just as LaTeX allows us to customize commands, we can do similar things in MATLAB via functions. Functions can be written into an editor (Home -> New Script -> <function content> -> Save (as an M-file).

Three main characteristics of a function

1. Take inputs
2. Return outputs
3. Is self-contained: each function can access only those variables that are passed to it as an input, and can store variables only through returning them as outputs.

The syntax of a function:

```
function [output] = functionName(input)
<script>
```

To illustrate, let us write a simple function that we name sumVect which takes a vector as input and returns the sum of elements of this vector as output.

```
function y = sumVect(x)
% This function sums elements of a vector
y = 0;
for i = 1:length(x)
    y = y + x(i);
end
```

Recall that the function sum in MATLAB sums elements of each column in a vector and returns an array/row vector of length equivalent to the number of columns of the matrix.

```
function count = sumMat(X)
% This function sums along each column of a matrix
```

```
% It returns an array of length equal to the number of columns of a matrix
[nrow, ncol] = size(X);
count = zeros(1,ncol);
for j = 1:ncol
    count(1,j) = 0;
    for i = 1:nrow
        count(1,j) = count(j) + X(i,j);
    end
end
```

help `sumMat`

Graphics

Graph properties

The following functions can be used to add graph properties

- legend adds legends to graphs
- title controls graph titles
- xlabel, ylabel, zlabel add axis labels
- axis can be used to get and set the axis limits

More information on each function can be found by typing `doc <function>`

2D plotting

plot

The simplest plot

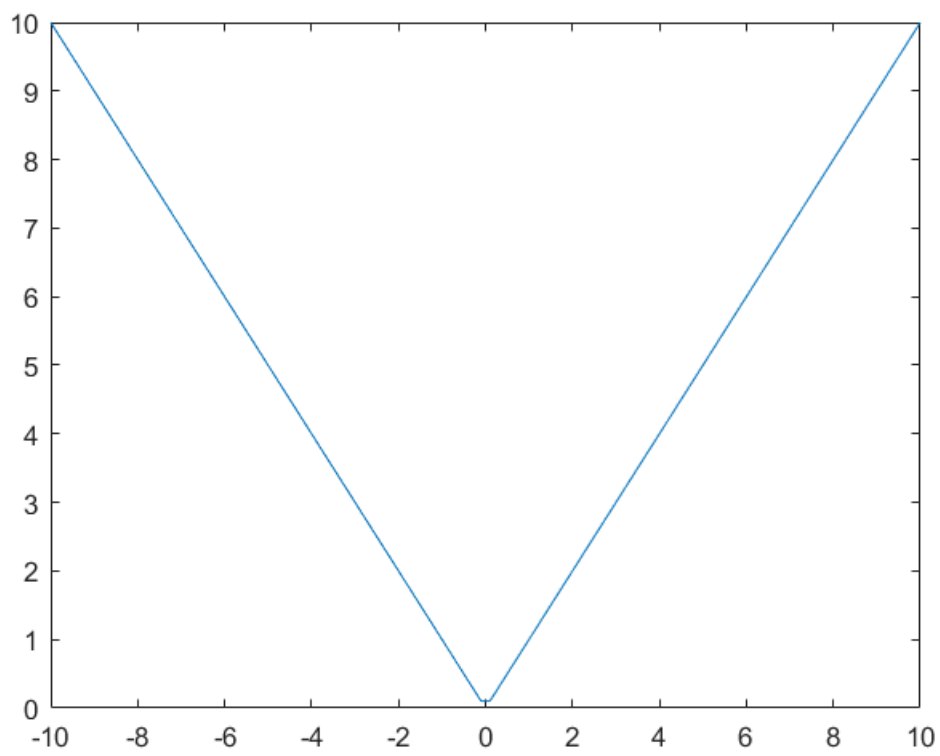
```
close all
x = linspace(-10,10,100)
```

```
x = 1×100
-10.0000   -9.7980   -9.5960   -9.3939   -9.1919   -8.9899   -8.7879   -8.5859 ...
```

```
y = abs(x)
```

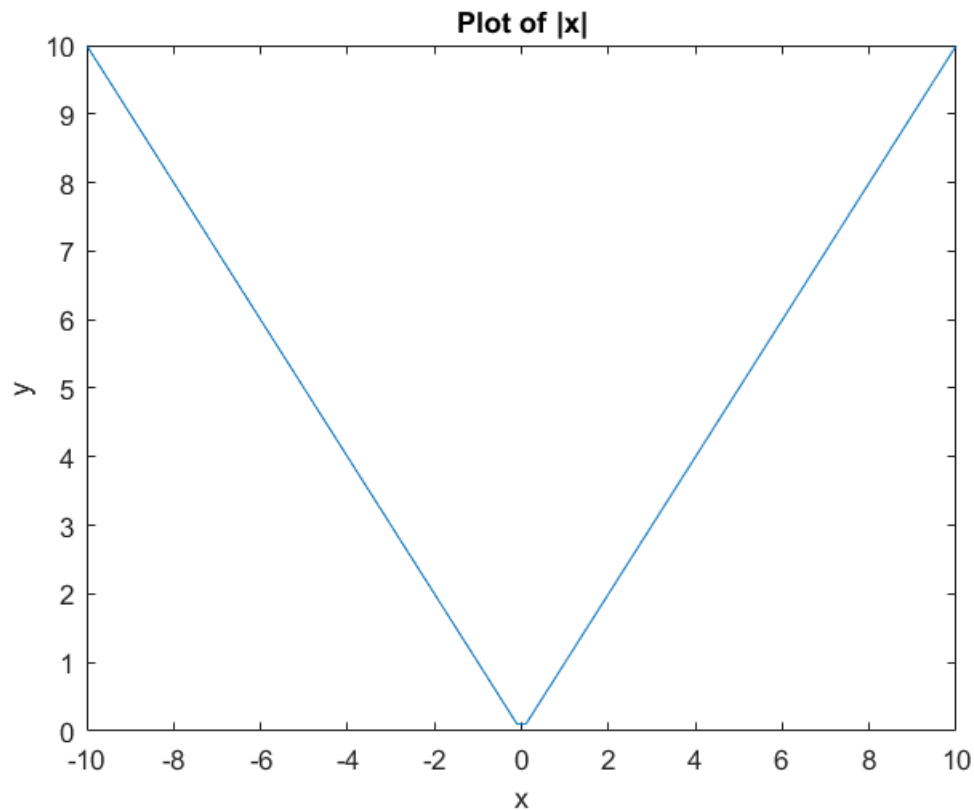
```
y = 1×100
10.0000    9.7980    9.5960    9.3939    9.1919    8.9899    8.7879    8.5859 ...
```

```
plot(x,y)
```



Adding labels and titles:

```
title('Plot of |x|')  
xlabel('x')  
ylabel('y')
```



Multiple plots in the same figure

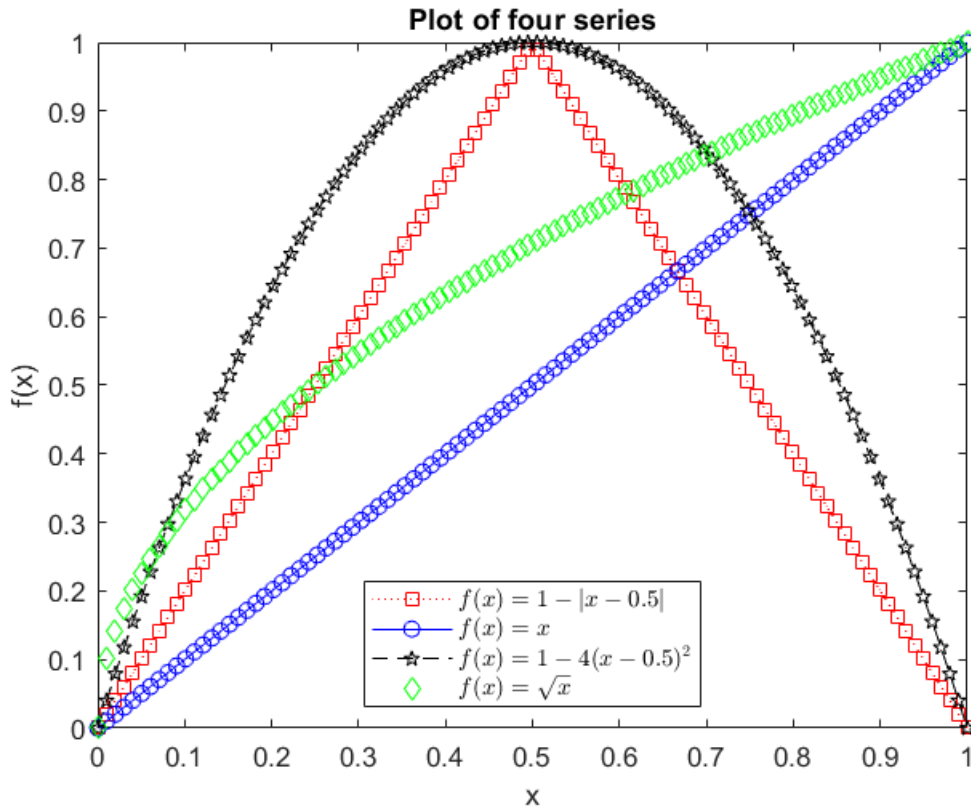
```
% Four different series to plot
x = linspace(0,1,100);
y1 = 1 - 2*abs(x-0.5);
y2 = x;
y3 = 1 - 4*abs(x-0.5).^2;
y4 = x.^0.5;
```

```
% Plot
close all
figure
plot(x,y1,'rs:',x,y2,'bo-',...
      x,y3,'kp--',x,y4,'gd')
% rs: "red solid dotted"
% bo- "blue circle solid"
% kp-- "black pentagram dashed"
% gd  "green diamond"

% Adding title and legend
xlabel('x');
ylabel('f(x)');
title('Plot of four series')
legend('$f(x)=1-|x-0.5|$', '$f(x)=x$',...
       '$f(x)=1-4(x-0.5)^2$', '$f(x)=\sqrt{x}$',...)
```

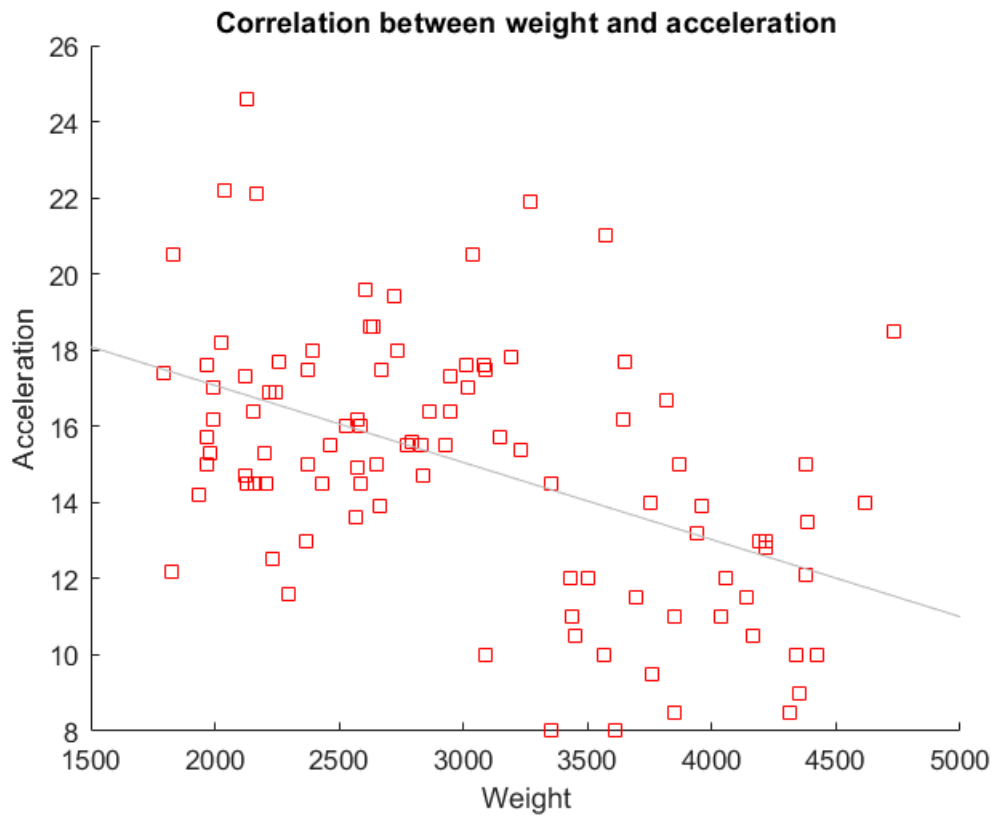


```
'interpreter','latex',...
'location','south')
```



scatter

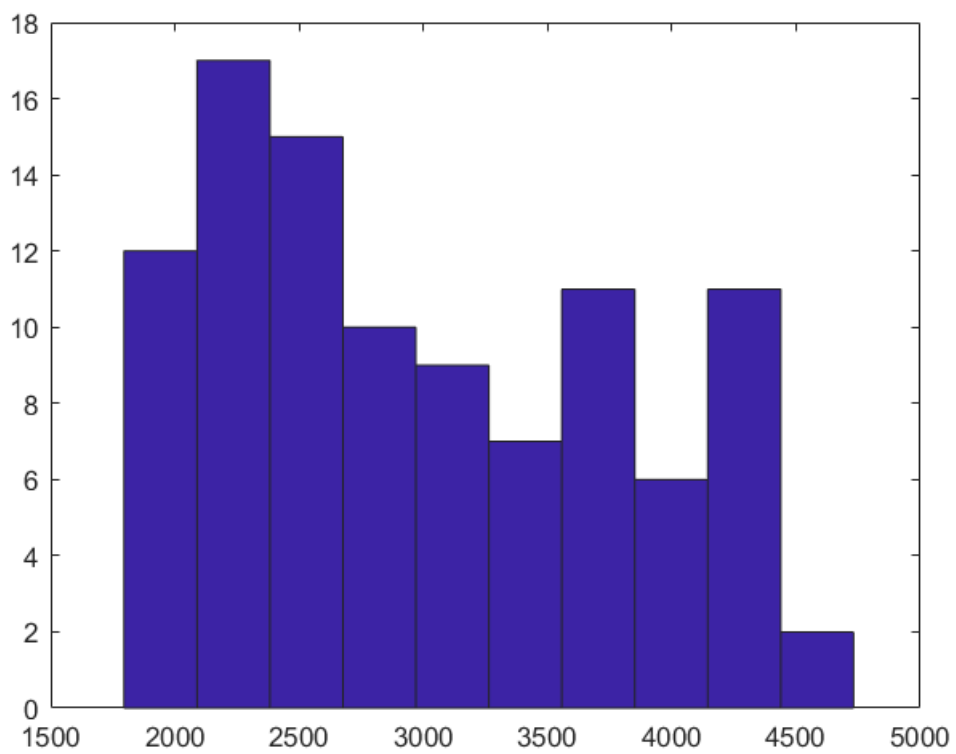
```
close % to close current figure
load carsmall;
scatter(Weight,Acceleration,'rs')
xlabel('Weight')
ylabel('Acceleration')
title('Correlation between weight and acceleration')
% add a least-squared fitted line
lsline
```



hist

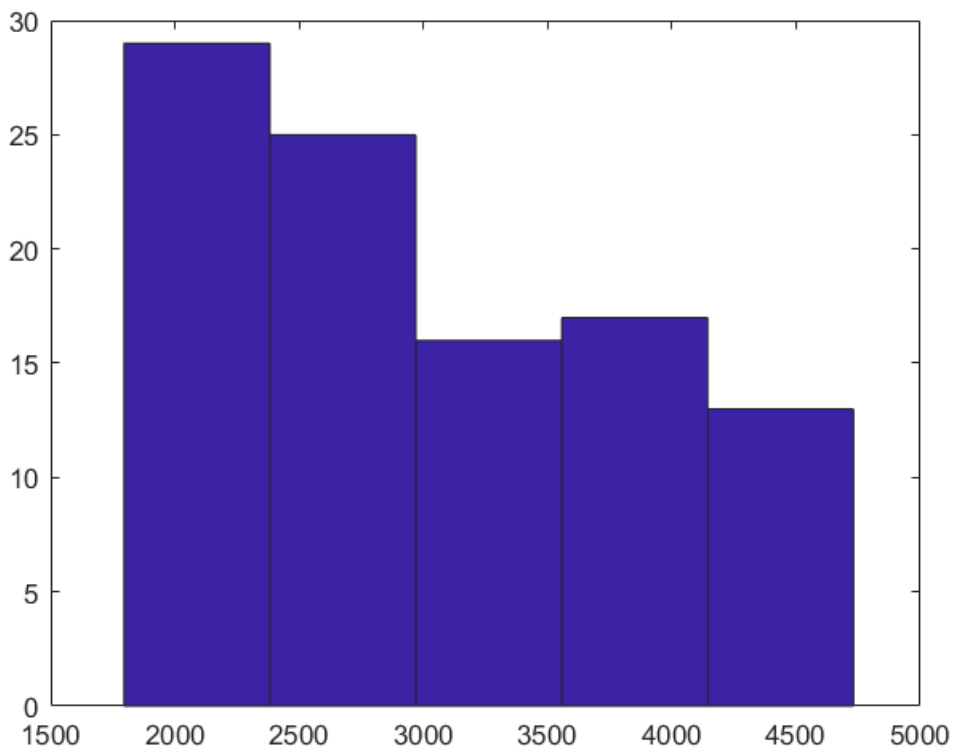
Produces a histogram (a rough empirical pdf) of a vector of data

```
close  
load carsmall;  
hist(Weight)
```



It's possible to specify the number of bins

```
bins = 5;  
hist(Weight,bins)
```



Combining graphs

Can be done by calling **subplot(M,N,#)** where **M** is the number of rows, **N** the number of columns and **#** the position of the graph. MATLAB numbers subplot *positions by row*. For example subplot(3,2,#) divides the current figure into an 3-by-2 grid. The first subplot is the first column of the first row, the second the second column of the first row, the third the *first column of the second row*, etc., as follows:

$$\begin{bmatrix} 1 & 2 \\ 3 & 4 \\ 5 & 6 \end{bmatrix}$$

```
close
load carsmall;

figure()
subplot(2,2,1);
plot(Weight,Acceleration,'ko')
xlabel('Weight');
ylabel('Acceleration');
lsline
title('Subplot(2,2,1)')
axis tight % Use minimum whitespace around the figure

subplot(2,2,2);
```

```

scatter(Weight,Horsepower,'r')
xlabel('Weight');
ylabel('Horsepower');
lsline
title('Subplot(2,2,2)')
axis tight

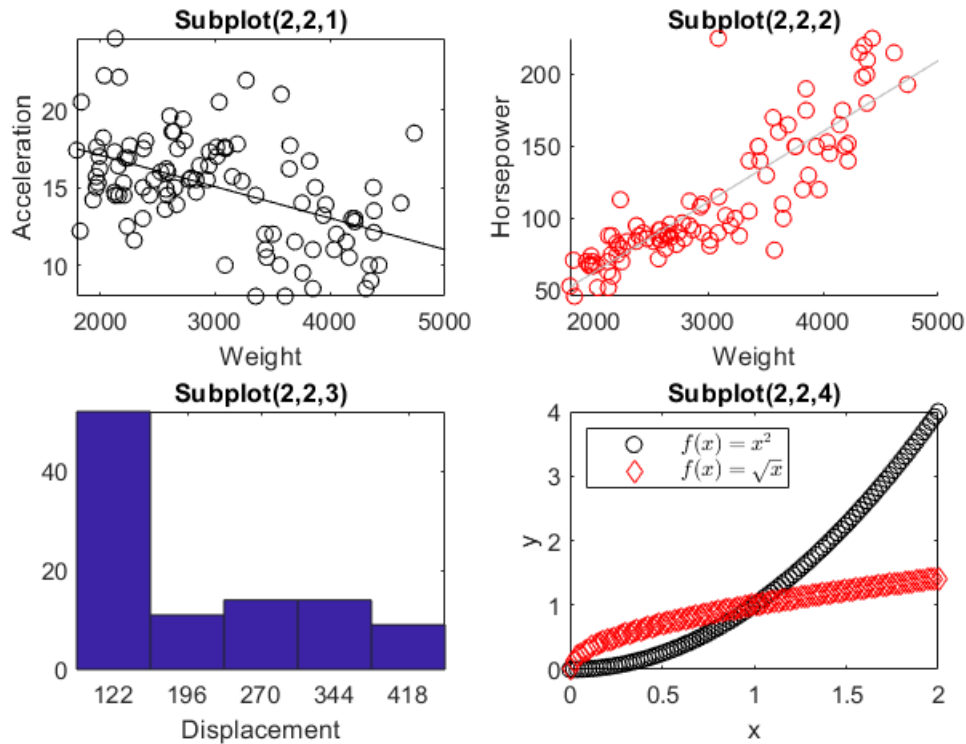
subplot(2,2,3);
hist(Displacement,5)
xlabel('Displacement')
title('Subplot(2,2,3)')
axis tight

subplot(2,2,4);
x = linspace(0,2,100);
y = x.^2;
z = x.^0.5;
plot(x,y,'ko',x,z,'rd')
xlabel('x')
ylabel('y')
l = legend('$f(x)=x^2$', '$f(x)=\sqrt{x}$',...
    'interpreter','latex','location','northwest');
title('Subplot(2,2,4)');
axis tight
% Common title for all subplots
sgtitle('Multiple plots in the same figure')

cf = gcf;
exportgraphics(cf,'mutiple_plots.pdf')

```

Multiple plots in the same figure



get, set and figure handles

```
plot(randn(10,3))
% get : display properties
get(gca); % get all axes' properties
```

```
ALim: [0 1]
ALimMode: 'auto'
AlphaScale: 'linear'
Alphamap: [1x64 double]
AmbientLightColor: [1 1 1]
BeingDeleted: off
Box: on
BoxStyle: 'back'
BusyAction: 'queue'
ButtonDownFcn: ''
CLim: [0 1]
CLimMode: 'auto'
CameraPosition: [5 0.3763 17.3205]
CameraPositionMode: 'auto'
CameraTarget: [5 0.3763 0]
CameraTargetMode: 'auto'
CameraUpVector: [0 1 0]
CameraUpVectorMode: 'auto'
CameraViewAngle: 6.6086
CameraViewAngleMode: 'auto'
Children: [3x1 Line]
Clipping: on
ClippingStyle: '3dbox'
Color: [1 1 1]
```

```

        ColorOrder: [7×3 double]
ColorOrderIndex: 4
        ColorScale: 'linear'
        Colormap: [256×3 double]
        ContextMenu: [0×0 GraphicsPlaceholder]
        CreateFcn: ''
        CurrentPoint: [2×3 double]
        DataAspectRatio: [5 2.3763 1]
DataAspectRatioMode: 'auto'
        DeleteFcn: ''
        FontAngle: 'normal'
        FontName: 'Helvetica'
        FontSize: 8.5000
        FontSizeMode: 'auto'
        FontSmoothing: on
        FontUnits: 'points'
        FontWeight: 'normal'
        GridAlpha: 0.1500
        GridAlphaMode: 'auto'
        GridColor: [0.1500 0.1500 0.1500]
        GridColorMode: 'auto'
        GridLineStyle: '-'
        HandleVisibility: 'on'
        HitTest: on
        InnerPosition: [0.5703 0.1117 0.3280 0.3073]
        Interactions: [1×1 matlab.graphics.interaction.interface.DefaultAxesInteractionSet]
        Interruptible: on
LabelFontSizeMultiplier: 1.1000
        Layer: 'bottom'
        Layout: [0×0 matlab.ui.layout.LayoutOptions]
        Legend: [0×0 GraphicsPlaceholder]
        LineStyleOrder: '-'
LineStyleOrderIndex: 1
        LineWidth: 0.5000
        MinorGridAlpha: 0.2500
        MinorGridAlphaMode: 'auto'
        MinorGridColor: [0.1000 0.1000 0.1000]
        MinorGridColorMode: 'auto'
        MinorGridLineStyle: ':'
        NextPlot: 'replace'
        NextSeriesIndex: 4
        OuterPosition: [0.5350 0.0685 0.4015 0.3678]
        Parent: [1×1 Figure]
        PickableParts: 'visible'
        PlotBoxAspectRatio: [1 0.7000 0.7000]
PlotBoxAspectRatioMode: 'auto'
        Position: [0.5703 0.1117 0.3280 0.3073]
        PositionConstraint: 'innerposition'
        Projection: 'orthographic'
        Selected: off
        SelectionHighlight: on
        SortMethod: 'childorder'
        Tag: ''
        TickDir: 'in'
        TickDirMode: 'auto'
        TickLabelInterpreter: 'tex'
        TickLength: [0.0100 0.0250]
        TightInset: [0.0238 0.0432 0.0114 0]
        Title: [1×1 Text]
TitleFontSizeMultiplier: 1.1000
        TitleFontWeight: 'bold'
        Toolbar: [1×1 AxesToolbar]
        Type: 'axes'
        Units: 'normalized'
        UserData: []

```

```

        View: [0 90]
        Visible: on
        XAxis: [1x1 NumericRuler]
        XAxisLocation: 'bottom'
        XColor: [0.1500 0.1500 0.1500]
        XColorMode: 'auto'
        XDir: 'normal'
        XGrid: off
        XLabel: [1x1 Text]
        XLim: [0 10]
        XLimMode: 'auto'
        XMinorGrid: off
        XMinorTick: off
        XScale: 'linear'
        XTick: [0 5 10]
        XTickLabel: {3x1 cell}
        XTickLabelMode: 'auto'
        XTickLabelRotation: 0
        XTickMode: 'auto'
        YAxis: [1x1 NumericRuler]
        YAxisLocation: 'left'
        YColor: [0.1500 0.1500 0.1500]
        YColorMode: 'auto'
        YDir: 'normal'
        YGrid: off
        YLabel: [1x1 Text]
        YLim: [-2 2.7526]
        YLimMode: 'auto'
        YMinorGrid: off
        YMinorTick: off
        YScale: 'linear'
        YTick: [-2 -1 0 1 2]
        YTickLabel: {5x1 cell}
        YTickLabelMode: 'auto'
        YTickLabelRotation: 0
        YTickMode: 'auto'
        ZAxis: [1x1 NumericRuler]
        ZColor: [0.1500 0.1500 0.1500]
        ZColorMode: 'auto'
        ZDir: 'normal'
        ZGrid: off
        ZLabel: [1x1 Text]
        ZLim: [-1 1]
        ZLimMode: 'auto'
        ZMinorGrid: off
        ZMinorTick: off
        ZScale: 'linear'
        ZTick: [-1 0 1]
        ZTickLabel: ''
        ZTickLabelMode: 'auto'
        ZTickLabelRotation: 0
        ZTickMode: 'auto'

```

```
get(gca,'YTick') % get a specific property
```

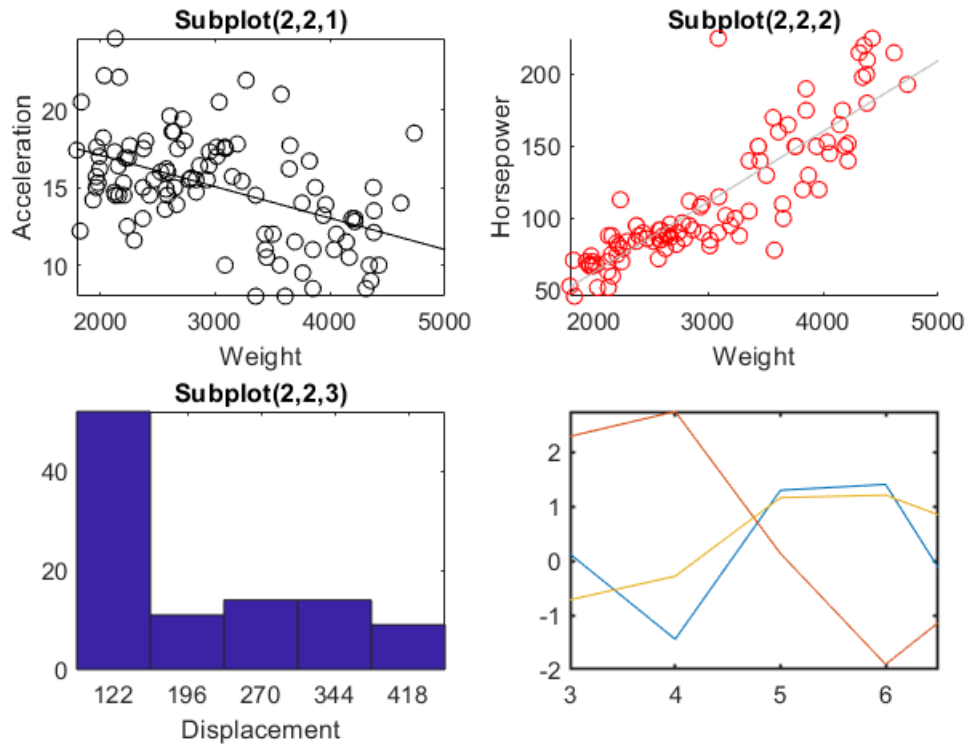
```
ans = 1x5
    -2    -1     0     1     2
```

```

% set : change current properties
set(gca,'YTick',-3:1:3)
set(gca,'xlim',[3 6.5])
set(gca,'linewidth',1)

```


Multiple plots in the same figure



% handle : properties of the appearance of the plot itself

clf

ploth = plot(randn(10,1))

ploth =

Line with properties:

```

    Color: [0 0.4470 0.7410]
    LineStyle: '-'
    LineWidth: 0.5000
    Marker: 'none'
    MarkerSize: 6
    MarkerFaceColor: 'none'
    XData: [1 2 3 4 5 6 7 8 9 10]
    YData: [0.4289 -0.2991 -0.8999 0.6347 0.0675 -0.1871 0.2917 0.9877 0.3929 0.1946]
    ZData: [1x0 double]

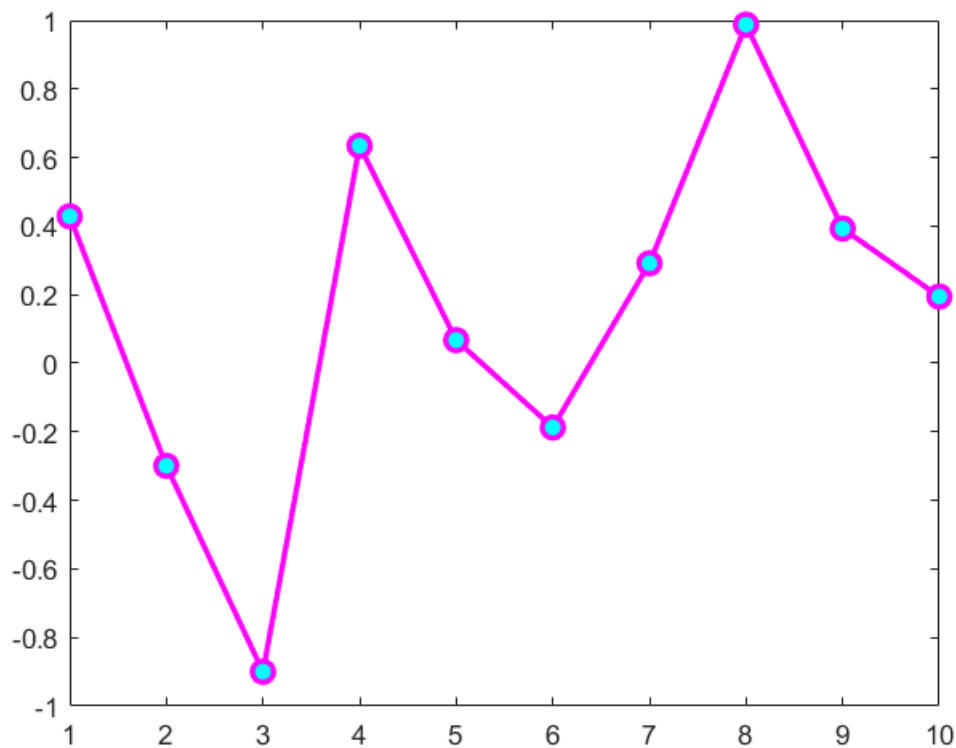
```

Show all properties

```

set(ploth,'LineWidth',2)
set(ploth,'Marker','o')
set(ploth,'MarkerFaceColor','cyan')
set(ploth,'MarkerSize',8)
set(ploth,'Color',[1 0 1]) % magenta

```



```
% Type doc ColorSpec
```

3D plotting (not covered)

Let us write the following utility function

```
function z = utility(x,y)
% z = x.*y + (x.^2).*(y.^2) + (x.^3).*(y.^3)
% z = log(x) + log(y) + (x.^2).*(y.^2);
z = exp(x) + x.^0.5 + (x.^3).*(y.^2);
return
```

Two ways to plot this function

- Use fsurf directly

```
% doc fsurf
% fsurf(@(x,y) utility(x,y), [0 2],'ShowContours','on')
% To see what properties are available, type
mysurf = fsurf(@(x,y) utility(x,y), [0 2],'ShowContours','on')
```

Of course, instead of writing a utility function in an M-file, we could have typed directly

```
fsurf(@(x,y) exp(x) + x.^0.5 + (x.^3).*(y.^2), [0 2], 'ShowContours', 'on')
```

If I'm only interested in the contour plot

```
% fcontour(@(x,y) utility(x,y), [ 0 2], 'LineWidth', 2);
```

- Use surf and/or surfc (surface plot with contours)

```
x = linspace(0,2,10);
y = linspace(0,2,10);
[X,Y] = meshgrid(x,y);    % create a net with all combinations (x,y) possible
Z = utility(X,Y);
% contour(X,Y,Z)
surfh = surf(X,Y,Z)
xlabel('good 1')
ylabel('good 2')
zlabel('utility')
title('Utility surface')
shading interp
% surfc(X,Y,Z)
% mesh(X,Y,Z)
% meshc(X,Y,Z)
```

Exporting plots

Simplest way to export a plot: click File, Save As desired format (TIFF more MS Office, EPS or PDF for LaTeX).
Figures saved in this way are of format WYSIWYG (what you see is what you get).

Figures can also be programmatically exported using exportgraphics

```
% doc exportgraphics
close
x = linspace(0,1,100);
y = 1 - abs(x - 0.5);
plot(x,y,'r')
title('Rooftop plot');
legend('f(x)=1-|x-0.5|');
xlabel('x');
ylabel('y=1-|x-0.5|');
ax = gca; % assign current axes to an object called 'ax'
% exportgraphics(ax, 'Rooftop.pdf')
exportgraphics(ax,'Rooftop.jpeg')
fg = gcf;
exportgraphics(fg,'Rooftop.pdf')
```

Importing and exporting data

Importing (loading) MATLAB's built-in data

```
load DatasetName
```

Importing external data

The best way to import data is Home -> Import Data -> auto.csv (excel file) -> Output Type (choose Table) -> Import Selection (choose Import Data)

The code for these point-and-click operations can be generated by choosing Import Selection (choose Generate Script)

The key to import is to ensure that data in the Excel file has been formatted according to the following rules

- One variable per column
- A valid, distinct variable name for the column in the first row
- All data in the column must be either numeric or contain dates

Alternatively, it is possible to read and view data with `readtable()`. Missing variable names will be assigned Var1, Var2, etc.

```
% test = readtable('auto.csv')  
% save test.mat
```

See the documentation on `table()` for more.

Exporting data

Once the data has been loaded, it can be saved in the `.mat` format (MATLAB native format) using `save`

```
save auto
```

Alternatively, we can select variables to be saved

```
% save auto-select weight mpg  
% save('auto-select','weight','mpg')
```

We can also save data in the format of other software. For more information:

```
% doc save
```

Simulation and generation of random numbers

Four main ways to generate pseudorandom numbers in MATLAB

`rand` generates numbers from the uniform distribution on (0,1)

`randn` generates numbers from the standard normal distribution

`randg` generates numbers from the standard Gamma distribution

randi generates uniformly distributed pseudo random integers

```
M = randi(3,5);  
N = randi([0 10],5);
```

Simulation of random numbers with specified parameters

normrnd allows to specify the mean and standard deviation of the distribution. In the same vein, we can use gamrnd, lognrnd, exprnd, unifrnd to generate pseudo-random numbers from specific gamma, lognormal, exponential, or uniform distributions, respectively. See the Statistics and Machine Learning toolbox for more details.

```
mu = 5, sigma = 2;  
x = normrnd(mu,sigma,100,1);  
y = randn(100,1);  
figure  
ksdensity(x)  
hold on  
ksdensity(y)  
hold off  
grid on  
legend(sprintf('Normal(%.f,%.f)',mu,sigma),'Normal(0,1)')  
title('Kernel smoothing density plot')
```

Replication of simulated numbers

To replicate the simulated data rng can be used to remember and retrieve the seed of the simulation. This is because each simulation is assigned a 'seed' or a 'state' in MATLAB.

```
seedA = rng()  
A = rand(3)  
B = rand(3)
```

Note that B is generated from the seed following seedA, the seed that generates A.

```
rng(seedA)  
C = rand(3)  
D = rand(3)  
% A == C  
% B == D
```

Exercises

Exercise 1. Accessing elements of a matrix

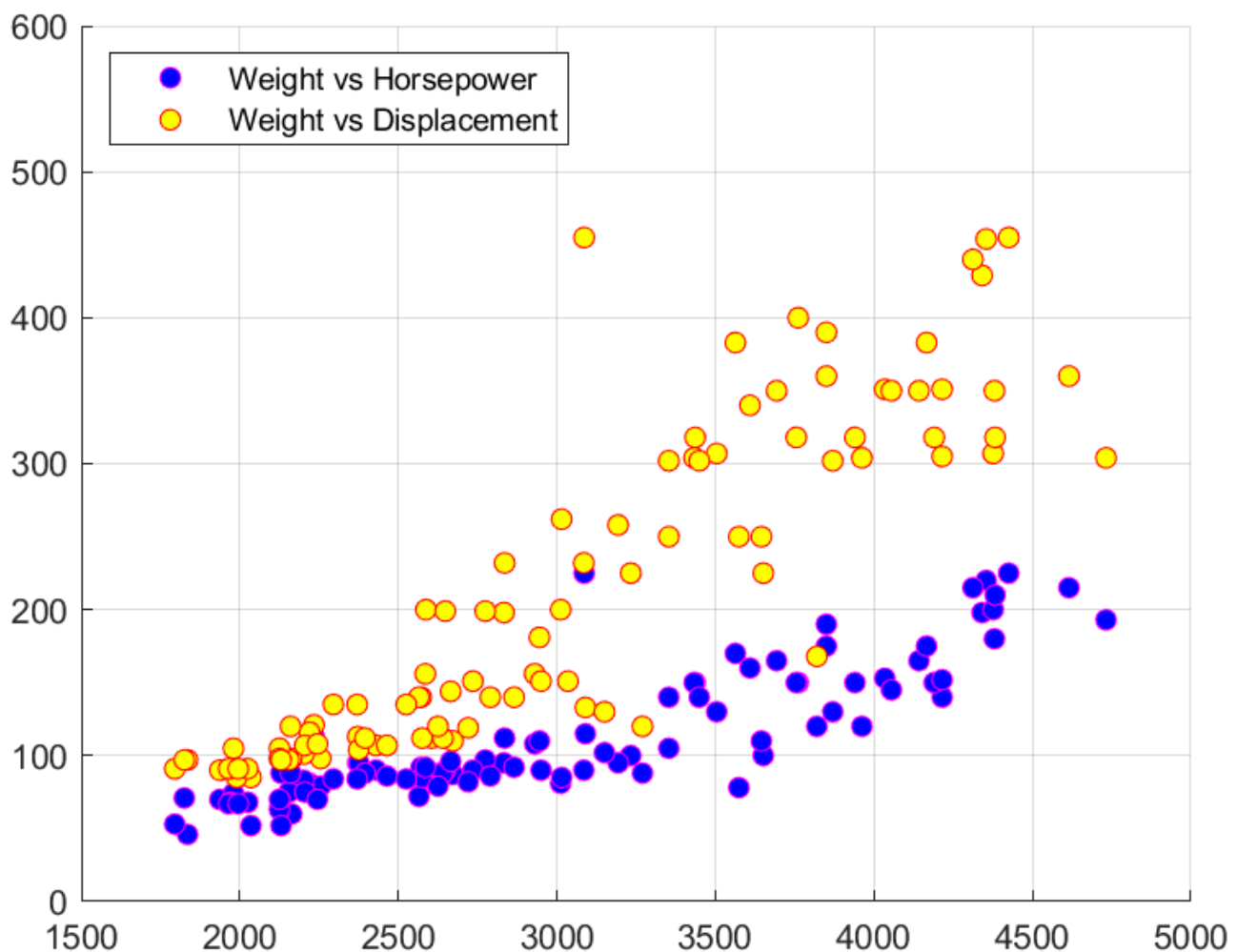
1. Generate a 10-by-10 matrix of standard normal (pseudo)random numbers. Call it M

2. Create the following submatrices of M

- A matrix composed of the first two rows and the last five columns of M
- A matrix composed of rows 2 and 4 and all the columns of M
- A matrix composed of rows 2 and 4 and columns 3 and 9 of M

Exercise 2. Working with graphs

1. Load a built-in dataset called `carsmall`.
2. Type `whos('-file','carsmall.mat')` to have a look at the data.
3. Are there missing values in `Weight`, `MPG`, `Horsepower`, and `Displacement`? If yes, how many? Find the exact positions (indices) of the missing values.
4. Find the mean of `MPG`, name it `meanMPG`. Create a new variable called `newMPG` which is equal to `MPG` but with missing values replaced by `meanMPG`
5. Create a scatter plot between `Weight` and `Horsepower` with `Weight` on the horizontal axis. Label the axis and add a title to the plot. Export this plot as `weight_vs_hp.pdf`
6. Replicate the following figure



Exercise 3. Nonlinear optimization with linear constraints

This exercise walks you through another interesting application of MATLAB that: optimization. Let us consider a simple utility maximization problem:

$$\begin{aligned} \max_{x_1, x_2} U(x_1, x_2) &= x_1^\alpha x_2^\beta \\ \text{s.t. } p_1 x_1 + p_2 x_2 &\leq I \end{aligned}$$

1. Create a function called `utility(x, alpha, beta)` which takes three arguments (`x` is a two-dimensional vector, $\alpha \in (0, 1)$ and $\beta \in (0, 1)$) and return a single utility index. Save this function in your current working directory. Test the function with different inputs to make sure that it works as expected.
2. If you search for nonlinear optimization with constraints in MATLAB, you will find that a solution is provided by `fmincon`. Type `doc fmincon` to see how to set up the problem. Notice that the piece of

information that is relevant to our problem regarding the constraints is:

$$\begin{aligned} Ax &\leq b \\ lb &\leq x \leq ub \end{aligned}$$

3. What is the matrix `A` and the scalar `b` in this case? What are the values of the upper bounds and lower bounds for each good?
4. Type

```
x_guess = [0 0]; % initial guess for the optimization problem
lb = [0 0];
ub = [];
[x, fval, exitflag] = fmincon('utility', x_guess, A, b, [], [], lb, ub)
```

```
global alph bet % so that these parameters can be used globally, i.e. within the utility function
alph = 0.5; bet = 0.4; income = 1000;
p1 = 1; p2 = 2*p1;
A = [p1 p2];
lb = [0 0]; ub = [];
x_guess = [0 0]; %
[x, fval, exitflag] = fmincon('utility', x_guess, A, income, [], [], lb, ub)
```

Is the numerical solution consistent with our wellknown results for Marshallian demands for Cobb-Douglas utility functions:

$$x_1 = \frac{\alpha I}{(\alpha + \beta)p_1}; \quad x_2 = \frac{\beta I}{(\alpha + \beta)p_2}$$

