# Data Analysis in Geophysics ESCI 7205

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Tu/Th - 13:00-14:30 CERIMAC (or STUDENT) LAB

Lab - 5, 09/10/13

## The load function

reads binary files containing matrices (generated by earlier MATLAB sessions), or text files containing numeric data.

The text file should be organized as a rectangular table of numbers, separated by blanks, with one row per line, and an equal number of elements in each row.

>> cat magik.dat
16.0 3.0 2.0 13.0
5.0 10.0 11.0 8.0
9.0 6.0 7.0 12.0
4.0 15.0 14.0 1.0
>> A=load('magik.dat') #places matrix in variable A
>> load magik.dat #places matrix in variable magik

## The save function

Writes files containing matrices (from memory). Default format – matlab binary.

```
default name "matlab.mat"
>> save
>> myfile='my file.mat'
>> save(myfile)
>> save('my_file.mat','a','b')
>> save(myfile,'a', '-ascii')
save(FILENAME, VARIABLES)
save(FILENAME, , ...,FORMAT)
save(FILENAME, ..., '-append')
'-mat'
                               Binary MAT-file format (default).
'-ascii'
                               8-digit ASCII format.
'-ascii', '-tabs'
                               Tab-delimited 8-digit ASCII format.
'-ascii', '-double'
                               16-digit ASCII format.
'-ascii', '-double', '-tabs'
                               Tab-delimited 16-digit ASCII format
```

Matlab is particularly difficult to use if data files do not fit this format (varying number columns for example).

Matlab is also particularly difficult to use for processing character data.

## m-Files

Text files with MATLAB code (instructions). Use MATLAB Editor (or any text editor) to create files containing the same statements you would type at the MATLAB command line.

Save the file with a name that ends in .m

```
% vim magik.m
i
A = [ 16.0 3.0 2.0 13.0
5.0 10.0 11.0 8.0
9.0 6.0 7.0 12.0
4.0 15.0 14.0 1.0 ];
(esc)wq
in matlab, execute the m file magik.m
```

>> magik #places matrix in A

Reading SAC files

>> [t,a,p]=readsac('ccm\_india\_.bhz');



### Functions

# Are also text files with MATLAB code (instructions).

Use MATLAB Edítor (or any text editor) to create files containing the same statements you would type at the MATLAB command line - but...

Encapsulates some calculation, etc., and called by the function name, with defined inputs and outputs (similar to "built-in" functions such as sin, cos, etc.)

```
Write in any editor, save as .m file. Function name has to be same as file name, one function per file.
```

function TensorOut = TensorRotate( TensorIn, RotAng )
%does tensor rotation through angle RotAng

RotMat=[cosd(RotAng) sind(RotAng); -sind(RotAng) cosd(RotAng)]; TensorOut = RotMat\*TensorIn\*RotMat';

End

### To use

# Output can be single variable as in last or multiple items (if only give one output, get first).

function [TensorOut RotMat] = TensorRotate( TensorIn, RotAng )
%does tensor rotation through angle RotAng

RotMat=[cosd(RotAng) sind(RotAng); -sind(RotAng) cosd(RotAng)]; TensorOut = RotMat\*TensorIn\*RotMat'; End

#### To use >> TensorRotate(a,30) ans = 0.50000000000000 - 0.866025403784439-0.866025403784439 -0.500000000000000 >> [arot rm]=TensorRotate(a,30) arot = 0.50000000000000 - 0.866025403784439-0.866025403784439-0.500000000000000 rm =0.866025403784439 0.5000000000000000 0.866025403784439



3-d thínk of as a stack of 2-d matrices
>3-d something hard to visualize – but fine mathematically (4-d is 2-d matrix with each element itself a 2-d matrix)

The Colon Operator The colon, "**:**", is one of the most important (and sometimes seemingly bizarre) MATLAB operators It can be used to - Create a list of numbers - Work with all entries in specified dimensions - Collapse trailing dimensions (right- or left-hand side) - Create a column vector (right-hand side behavior related to reshape) - Retain an array shape during assignment (left-hand side behavior)

## Creating a List of Numbers

You can use the ":" operator to create a 1-d vector of evenly-spaced numbers.

Here are the integers from -3 to 3.

>> list1=-3:3
list1 =
 -3 -2 -1 0 1 2 3
Don't need the braces (are optional)

Creating a List of Numbers Here are the first few odd positive integers. >>list2 = 1:2:10 list2 =1 3 5 7 9 Can use negative increments >>100:-7:51 ans = 100 93 86 79 72 65 58 51 syntax for this use of colon operator start:[increment if ≠1:]end (default increment = 1)

Things that don't work >> a=(1:3;4:6) =(1:3;4:6) Error: Unbalanced or unexpected parenthesis or bracket. >> a=1:3;4:6 ans = 4 5 6

>>

Second one (no error reported because no errors) creates array named a = 1 2 3, and then an array named ans = 4 5 6. It uses the ; as a line separator (and suppresses output, not a row separator (when outside []).

## Working with all the Entries in Specified Dimensions

To manipulate values in some specific dimensions, use the ":" operator to specify the dimensions. A " : " by itself indicates all elements of that index position (usually rows or columns)

>>a(:,1)

## Means "all rows, in column 1"

>>a(1,:)

Means "all columns, in row 1"

## Deleting rows and columns

You can also combine : with [] to remove rows, columns, or elements (again - variation on theme of assigning elements in a matrix - have a syntax rule and read it like a lawyer for all possible interpretations and implications.)

e.g. Remove the second column >>X=A; >>X(:,2) = [];

Create vector from X; removes every 2<sup>nd</sup> element from 2 to 10

>> X(2:2:10) = []

X =

16 9 2 7 13 12 1

Done with the colon operator for now. But will continue to show up in examples.

a = 1 2 3 4	3 4]	Array and Matrix divide	
>> b=[2 4;6 8]		LVEITHOLETUH	
b= 2 4 6 8	-	Element by element divide (the "	.").
>> a./b			
ans =		Ríght arrau divide	
0.5000	0.5000	i and and and and a	
0.5000	0.5000		
ans =		l eft matrix divide	
2 2			
2 2			
>> b./a			
ans =			
Z Z		Matrix on top is dividend.	
2 2			
2 2 >> b \a		Matrix on bottom is divisor	
2 2 >> b.\a ans =		Matríx on bottom is divisor.	
2 2 >> b.\a ans = 0.5000	0.5000	Matríx on bottom is divisor.	

```
Array and Matrix divide (Matlab inventions)
                  Left matrix division.
>> a=[1 2;3 4]
a =
         2
    3
         4
                  Check a is invertible
>> det(a)
ans =
                  This is equivalent to inv(a)*c=b.
   -2
>> b=[5 6]'
b =
                  Note this is the solution to a*b=c
    5
    6
                  when you know a and c and want
>> c=a*b
c =
   17
   39
>> d=a \ c
d =
                  d=b above.
   5.0000
   6.0000
                  Sizes have to be appropriate.
```

```
With a matrix for ъ, get solutions for each column
ъ'.
(we needed the ъ' when ъ was a vector to get
things to multiply correctly – to get the same
values we have to transpose b also)
```

```
>> b=[5 6;7 8]
b =
 5 6
 7 8
>> c=a*b
C =
 17
    23
 39 53
>> d=a\c
d =
 4.9999999999999999 5.999999999999999
 7.0000000000001 8.0000000000002
```

A and B must be matrices that have the same number of rows, unless A is a scalar, in which case A\B performs element-wise division — that is,  $A \setminus B = A \cdot \setminus B$ .

If A is a square matrix, A\B is roughly the same as inv(A)\*B, except it is computed in a different way.

If A is an n-by-n matrix and B is a column vector with n elements, or a matrix with several such columns, then  $X = A \setminus B$ is the solution to the equation AX = B. A warning message is displayed if A is badly scaled or nearly singular.

If A is an m-by-n matrix with m ~= n and B is a column vector with m components, or a matrix with several such columns, then

 $X = A \setminus B$ is the solution in the least squares sense to the under- or over-determined system of equations AX = B.

> In other words, X mínímízes norm(A\*X – B), the length of the vector AX – B.

The rank k of A is determined from the QR decomposition with column pivoting. The computed solution X has at most k nonzero elements per column. If k < n, this is usually <u>not</u> the same solution as x = pinv(A) \* B, which returns a least squares solution. mrdivide(B,A) and the equivalent B/A perform <u>matrix</u>right division (forward slash).

B and A must have the same number of columns.

mrdivide(B,A) and the equivalent B/A perform <u>matrix</u> right division (forward slash).

If A is a square matrix, B/A is roughly the same as B\*inv(A).

 mrdivide(B,A) and the equivalent B/A perform <u>matrix</u>right division (forward slash).

A warning message is displayed if A is badly scaled or nearly singular.

mrdivide(B,A) and the equivalent B/A perform <u>matrix</u> right division (forward slash).

If B is an m-by-n matrix with m ~= n and A is a column vector with m components, or a matrix with several such columns, then

X = B/A

is the solution in the least squares sense to the under- or over-determined system of equation XA = B.

Note: <u>matrix</u> right division and <u>matrix</u> left division are related by the equation

 $B/A = (A' \setminus B')'$ 

```
Example 1- Suppose A and B are -
>> A = magic(3)
A =
       1 6
5 7
9 2
     8
     3
     4
>> b = [1;2;3]
b =
     1
     2
     3
          To solve the matrix equation Ax = b, enter
>> x=A\b
x =
    0.0500
    0.3000
    0.0500
    You can verify \mathbf{x} is the solution to the equation as follows.
>> A*x
ans
    =
    1.0000
    2.0000
    3.0000
```

Magíc matríx – square matríx with property that column, row and díagonal sums add to same value.

```
>> tst=magic(3)
tst =
    8 1 6
3 5 7
    4 9 2
>> sum(tst)
ans =
   15 15 15
>> sum(tst')
ans =
   15 15 15
>> sum(sum(tst.*eye(3)))
ans =
   15
>> sum(sum(tst'.*eye(3)))
ans =
   15
```

Example 2 — A Singular

If A is singular, A\b returns the following warning. Warning: Matrix is singular to working precision.

In this case, Ax = b might not have a solution.

Example 2 — A Síngular

```
A = magic(5);
A(:,1) = zeros(1,5); % Set column 1 of A to zeros
b = [1;2;5;7;7];
x = A\b
Warning: Matrix is singular to working precision.
ans =
    NaN
    NaN
    NaN
    NaN
    NaN
    NaN
```

```
If you get this warning, you can still attempt to
solve Ax = b using the pseudoinverse function
pinv.
```

## Example 2 — A Síngular

If you get this warning, you can still attempt to solve Ax = b using the pseudoinverse function pinv.

x = pinv(A)\*b
x =
0 0.0209
0.2717
0.0808
-0.0321

The result x is least squares solution to Ax = b.

## Example 2 — A Singular

To determine whether x is a exact solution - i.e., a solution for which Ax - b = 0- simply compute A\*x-b ans =

-0.0603 0.6246 -0.4320 0.0141 0.0415

The answer is not the zero vector, so x is not an exact solution.

Example Suppose that

A = [1 0 0;1 0 0]; b = [1; 2];

Note Ax = b cannot have a solution, because A\*x has equal entries for any x. Entering x = A\b

returns the least squares solution x = 1.5000 o along with a warning that A is rank deficient.
Example

- $A = [1 \ 0 \ 0; 1 \ 0 \ 0];$
- b = [1; 2];
- x = A b
- x =
  1.5000
  0
  Note that x is not an exact solution:
- A\*x-b ans = 0.5000 -0.500

Operators	
Arithmetic operators.	
plus - Plus	+
uplus - Unary plus	+
mínus - Mínus	_
umínus - Unary mínus	_
mtímes - Matrix multiply	*
times - <u>Array</u> (element by element) multiply)	• *
mpower - <u>Matríx</u> power	^
power - <u>Array</u> (element by element) power	•
mldívíde - Backslash or left matrix dívíde	\
mrdívíde - Slash or ríght matrix dívíde	1
Idivide - Left array (element by element) divide	• \
rdivide - Right array (element by element) divide	./
kron - Kronecker tensor product	kron

	Operators	
	Relational opera	ators.
eq ~E	İqual	==
ne ~!	Not equal	~=
lt ~L	ess than	<
gt ~ (	Greater than	>
le ~ L	ess than or equal	<=
ge ~ (	Greater than or equal	>=
	Logical operat	ors.
and - Log	ical AND	&
or - Log	ical OR	
not - Los	gical NOT	~
xor - Los	gical EXCLUSIVE OR	
any - True	e if any element of vect	or is nonzero
all - Tru	ie if all elements of vect	or are nonzero

Logícal operations on matrix: (test is element by element) Returns a **logícal** matrix



==, >, >=, <, <=, ~, &,

#### Exclusive or

A few things to remember:

- Cannot use spaces in names of matrices (variables, everything in matlab is a matrix)

cool x = [1 2 3 4 5]

- Cannot use the dash sign (-) because it represents a subtraction.

 $cool - x = [1 \ 2 \ 3 \ 4 \ 5]$ 

- Don't use a períod (.) unless you want to create something call a *structure*.

cool.x = [1 2 3 4 5]

A few things to remember:

- Your best option, is to use the underscore ( \_ ) if you need to assign a long name to a matrix

 $my_cool_x = [1 \ 2 \ 3 \ 4 \ 5]$ 

Sízes of matrices:



Sízes of matrices:

Length of matrix gives the max dimension

## Matlab does all arithmetic in double precision.

Matlab "knows" about other types of entities (single precision, integers of varying lengths, unsigned integers, logicals) but converts them to floating point to use them.

(This is somewhat of a disaster when processing topographic data bases for which one square degree of data can be 13 Mega points (3600x3600 points) each 2 bytes long, that turn into 13 Mega points each 8 bytes long for a total of about 100 Mbytes for one square degree worth of data. Considering that there are about 0.3\*360\*180~20,000 (est 70% earth surface is water) square degrees of land. So if you want to process all the topo data that's 2 Terrabytes as double precision, versus about 500 Gibaybtes in raw format) This combined with fact that Matlab is in general interpreted means that it is not a speed deamon.

So it is important to do whatever you can to make it as fast as possible when using it for heavily used number crunching.

(hint - Vectorize)

#### Formatting screen output

format may be used to affect the spacing in the display of all variables as follows:

format compact Suppresses extra líne-feeds. format loose Puts the extra líne-feeds back ín (the default).

>> pi

ans =

3.1416

#### Formatting screen output

format short fixed point with 4 decimal places (the default)

format long fixed point with 14 decimal places

format short e scientific notation with 4 decimal places

format long e scientific notation with 15 decimal places

# ways to access array elements.



So a ís a scalar

# But everything in Matlab is really a matrix so -

>> a(:)	We can list all the elements of a
ans = 10	(there is only 1)
>> a(1)	We can address <b>a</b> as a 1-d vector.
10	We can address <b>a</b> as a 2-d (or
>> a(1,1) ans =	higherd) vector as (1, 1) in 2-d is
10 >> a(1,1,1,1)	same memory location as (1) in 1-d,
ans = 10	which is the memory location as the
>>	single element.

```
>> el=1
el =
   1
ans =
  10
>> a([1]
         Or an array (explicitly) or as a variable
ans =
  10
>> arry=[1]
arry =
>> a(arry)
ans =
  10
>>
```

#### But everything in Matlab is really a matrix so -

```
>> a(1,2)
Index exceeds matrix dimensions.
>> a(2)
Index exceeds matrix dimensions.
>>
```

If we try to address beyond one element we get an error message.

>> a a =	=1:27			T	nese	meth	ods	work	íng	enera
Co	lumns	1 thro	ough 21						$\mathcal{C}$	,
	1	2	3	4	5	6	7	8	9	10
11	12	13	14	15	16	17	18	19	20	21
Co	lumns	22 thr	cough 2	27						
	22	23	24	25	26	27				
>> a	>> a3d=reshape(a,3,3,3)									
a3d(:,:,1) =								a3d(•	1.2 1	
	1	4	7	asu(:,1:2,1)						
	2	5	8				ans	1	Д	
	3	6	9					2		
•••								3	6	
>> a3d(:,:,1)								a3d(•	[1 3]	1)
ans =							=		· - )	
	1	4	7					1	7	
	2	5	8					2	8	
	3	6	9		/		-	2	9	
							>> :	a3d	1 3.	1.21 1)
Constitution of the state of th							ans	=	[ 1 ]	··~], ·)
specity ranges with :							ans	1	7	4
operator, use arrays w/ and								2	8	5
								3	9	6
w/o colon operator.										

>> [1 3:-1:2] ans = 1 3 2 >> [1 5:-1:2] ans = 1 5 4 3 2 >> [1 5:-1:3] ans = 1 5 4 3 >>

#### More on vectorizing

Say we want to take the cross product of each of the columns of a matrix **a** with the column vector **b**.



More on vectorizing We could do a loop over the columns of **a**, crossing each with the vector **b**, putting the answer in a new matrix.

(but we don't want to do loops - SLOW.)



>> a=[1 2; 3 4 ; 5 6] Vectorizing 1 Find a way to do with out a loop. >> b=[1;2;3] Can make a matrix bb with a copy of b in each column, such that we can 2 now do all the cross products with just one call to the cross product. >> o=ones(1,2) >> bb=b\*o One way to make the matrix bb. Post multiply column vector by row vector of all ones (3x1\*1x2=3x2). 3 >> cross(a,bb) -1 Then do cross product of all pairs of columns with one call.

a =

b =

o =

bb =

ans

```
>> a=[1 2; 3 4 ; 5 6]
     1
>> b=[1;2;3]
     3
>> bb=[b b]
bb =
>> cross(a,bb)
ans
    -1
     2
   -1
>>
```

More on vectorizing

What we've done is correct/OK, but it is slow due to the multiplying.

Turns out it is much faster to simply copy the vector **b** multiple times, rather than doing the multiply.

In addition the multply solution does not always work (if can't make the result by multiplication of a vector/matrix and a matrix)

```
>> a=[1 2; 3 4 ; 5 6]
a =
    1 2
    3 4
    5
          6
>> b=[1;2;3]
b =
    2
>> bb=repmat(b,1,2)
bb =
    1
    2 2
    3
          3
>> cross(a,bb)
ans
   -1
    2
  -1 0
```

```
More on vectorizing
```

The problem now is that this is not a very convenient way (you have to hard code it) to make the matrix.

Enter the repmat command.

This lets you program up the construction of the new matrix.

New routine repmat

repmat(b,n,m) repeats the "input" matrix, b, n
times in row dimension and m times in column dímension.

```
bb=repmat(b,1,2)
bb =
    1 1
2 2
         3
    3
```

So this will take the 3x1 vector b and repeat it twice columnwise to produce a 3x2 matrix bb.



# That said – most people will not do it this way either!

# The astute reader will notice that we can simply use the array addressing tools introduced earlier to also produce the desired result.

(the astute reader will also get this technique named after them after sending it to Matlab's discussion groups – it is known as Tony's trick after Tony Booer of Schlumberger. Will see lots more of it later.)

This will return the 1st column twice as two column vectors.

#### Lets look at this in a little more detail.



What is a2d(2,3)? What is a2d(8)? >> a=1:9

a =

	1	2	3	4	5	6	7	8	9
>> a2	d=resh	ape(a,	3,3)						
a2d =	:								
	1	4	7						
	2	5	8						
	3	6	9						
>> a(	:)'								
ans =	:								
	1	2	3	4	5	6	7	8	9
>>									

What is a2d([8])? How about a2d([8 8])? And a2d([8 8]')? And a2d([8;8])?

>> a2d([8 8]) ans = 8 8

# And a2d([8 1])?

>> a2d([8 1]) ans = 8 1

# And a2d([1 8]')? And a2d([1;8])?

The thing to notice about using the array as an index is that the result takes the shape of the array used to index the values you are accessing. Here we are accessing the elements linearly and getting an array out based on the array used for the addressing.

# But a2d is a 2 d matrix. So what does this do?



Get the UNIX/computer thinking cap out. The : runs over all values of the first index (rows). The array [3 2 1] says use these as the values for the second index (columns) So it pulls out columns 3, 2 and 1 and makes a new array that is composed of all the rows (from the : for the first index) with the columns in this order.



So you should now be able to figure out what this does

>> a2d([3 2 1],:)

From Drea Thomas at the MathWorks (the company that produced Matlab)

Ask any crusty MATLAB programmer how to speed up your code and they'll tell you "Vectoríze!".



Vectorizing is not alogrithmic, there is no "recipe" that will result in (either well, or,) vectorized code.

You have to learn the already discovered tricks or invent your own.

# Matlab

Programming - relational operators

#### Relational Operators

### Returns 1 if true and 0 if false. (opposite of shell)

All relational operators are left to right associative.

Make element-by-element comparísons.
Some useful relational operators for whole matrices include the following commands: isequal : tests for equality isempty: tests if an array is empty all : tests if all elements are nonzero any: tests if any elements are nonzero; ignores NaNs These return 1 if true and 0 if false

## Relational Operators (review)

< : test for less than <= : test for less than or equal to >: test for greater than >= : test for greater than or equal to == : test for equal to ~= : test for not equal



## Logícal Operators

Logícal array operators return 1 for true and 0 for false

As you might expect, work element-by-element & : logícal AND; tests that both expressions are true

logícal OR ; tests that one or both of the expressions are true

~ : logícal NOT; inverts logícal value

Logical Operators w/ Short-circuiting

If the first tested expression will automatically cause the logical operator to fail, the remainder of the expression is not evaluated.

& & : short-circuit logical AND

|| : short-circuit logical OR

Logícal Operators w/ Short-circuiting

 $(b \sim = 0) \&\& (a/b > 18.5)$ 

if the first test (b ~= 0) evaluates to false then MATLAB already knows the entire expression will be false and terminates its evaluation of the expression early.

This avoids the warning that would be generated if MATLAB were to evaluate the operand on the right (due to a divide by zero).

## Matlab

Programming – control structures

## if/elseif/else/end

if expression is true, run this set of commands.
else if another expression is true, run this set
 of commands (can repeat).
else if nothing true so far, run this set of
 commands.
end the if block.

```
if rem(n,2) ~= 0 %calculates remainder of n/2
    M = odd_magic(n)
elseif rem(n,4) ~= 0 % ~= is 'not equal to' test
    M = single_even_magic(n)
else
    M = double_even_magic(n)
end
```

Often indented for readability.

switch, case, and otherwise/end switch executes the statements associated with the first case where

#### switch\_expr == case\_expr

If no case expression, you can have multiple cases, matches the switch expression, then control passes to the **otherwise** case (if it exists).

switch switch\_expr
case case\_expr
statement, ..., statement
otherwise
statement, ..., statement
end
Often indented for readability.

## for/end

one of the most common loop structures is the **for** loop, which iterates over an array of objects **for x** values in array, do this

```
for M = 1:m
   for N = 1:n
        h(M,N) = 1/(m+n);
   end
end
```

## Often indented for readability. Try to avoid using i and j as loop counters (matlab uses them for sqrt(-1))

#### while/end

while: contínues to loop as long as condition exited successfully

n= 1; while (1+n) > 1, n=n/2;, end n= n\*2

Note the use of the "," rather than a newline (carriage return) to separate the parts of this loop when written on one line

(the semicolon ";" is for "silence" – else it prints out n/2 each time through, you need the ", " to separate the statement n=n/2 from the end statement).

This can be done with any type of loop structure.

#### break

# break: allows you to break out of a for or while loop

## exits only from the loop in which it occurs

while condition1 # Outer loop
while condition2 # Inner loop
 break # Break out
end
... # Execution

end

# Outer loop
# Inner loop
# Break out of inner loop only

# Execution continues here after break

Often indented for readability.

#### continue

continue: pass control to next íteration of for or while loop (skips remaining body of loop)

passes to the next íteratíon of the loop in which it occurs

```
fid = fopen('magic.m','r');
count = 0;
while ~feof(fid)
    line = fgetl(fid);
    if isempty(line) | strncmp(line,'%',1)
        continue
    end
    count = count + 1;
end
disp(sprintf('%d lines',count));
```

Often indented for readability.