Rutgers University School of Engineering

Fall 2011

14:440:127 - Introduction to Computers for Engineers

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week 3

Weekly Topics

```
Week 1 - Basics – variables, arrays, matrices, plotting (ch. 2 & 3)
Week 2 - Basics – operators, functions, program flow (ch. 2 & 3)
Week 3 - Matrices (ch. 4)
Week 4 - Plotting – 2D and 3D plots (ch. 5)
Week 5 - User-defined functions (ch. 6)
Week 6 - Input-output formatting – fprintf, sprintf (ch. 7)
Week 7 - Program flow control & relational operators (ch. 8)
Week 8 - Matrix algebra – solving linear equations (ch. 9)
Week 9 - Structures & cell arrays (ch. 10)
Week 10 - Symbolic math (ch. 11)
Week 11 - Numerical methods – data fitting (ch. 12)
Week 12 – Selected topics
```

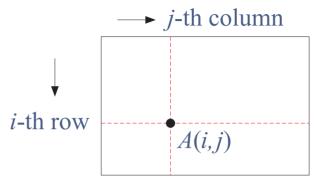
Textbook: H. Moore, MATLAB for Engineers, 2nd ed., Prentice Hall, 2009

Matrix Manipulation

defining matrices accessing matrix elements colon operator, submatrices transposing a matrix changing/adding/deleting entries concatenating matrices special matrices diagonals, block-diagonal matrices replicating and reshaping matrices element-wise operations functions of matrices (element & column operations) meshgrid, ndgrid examples: DTMF keypad, Taylor series, polynomials

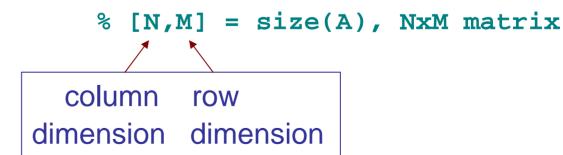
defining matrices

$$A = \begin{bmatrix} A_{11} & A_{12} & A_{13} \\ A_{21} & A_{22} & A_{23} \\ A_{31} & A_{32} & A_{33} \end{bmatrix}$$
 i-th row



matrix indexing convention

M NxM matrix



accessing matrix elements

$$m{A} = egin{bmatrix} m{1} & 2 & 3 \ 2 & 0 & 4 \ 0 & 8 & 5 \end{bmatrix}$$

$$A = egin{bmatrix} 1 & 2 & 3 \ 2 & 0 & 4 \ 0 & 8 & 5 \end{bmatrix}$$

$$m{A} = egin{bmatrix} m{1} & m{2} & m{3} \ m{2} & m{4} \ m{0} & m{8} & m{5} \end{bmatrix}$$

$$A = egin{bmatrix} 1 & 2 & 3 \ 2 & 0 & 4 \ 0 & 8 & 5 \end{bmatrix}$$

concatenating columns

$$>> A = [1 2 3; 2 0 4; 0 8 5]$$

$$A =$$

$$m{A} = egin{bmatrix} m{1} & m{2} & m{3} \ m{4} & m{5} \end{bmatrix}$$

% concatenate columns

column-wise indexing

concatenating rows

building a matrix column-wise

sub-matrices

$$A = \begin{bmatrix} 2 & 4 & 1 & 3 & 5 \\ 8 & 6 & 7 & 4 & 9 \\ 3 & 2 & 5 & 2 & 1 \\ 5 & 6 & 1 & 8 & 4 \end{bmatrix}$$

$$A = egin{bmatrix} 2 & 4 & 1 & 3 & 5 \ 8 & 6 & 7 & 4 & 9 \ 3 & 2 & 5 & 2 & 1 \ 5 & 6 & 1 & 8 & 4 \end{bmatrix}$$

transposing a matrix

```
>> A = [1 2 3 4; 2 0 5 6; 0 8 7 9] % size 3x4
A =
                  5
                         6
     0
                                        % size 4x3
>> A'
ans
     3
            5
     4
            6
```

transposition operation

$$>> A = [1 2 3; 2 0 4; 0 8 5]$$

$$>> A(:,2) = []$$

% delete second column

A =

1 3

2 4

0 5

0 0

7

[] denotes an empty 0x0 matrix

alternatively, redefine A by omitting its second column:

$$>> A = A(:,[1,3]);$$

$$>> A = [1 2 3; 2 0 4; 0 8 5]$$

replacing rows or columns

$$A =$$

$$A =$$

concatenating matrices

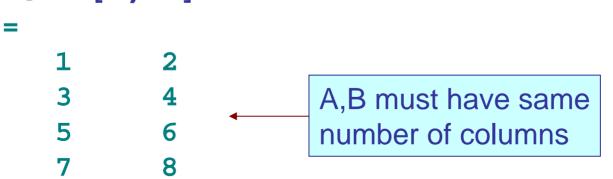
>> A = [1 2; 3 4];
>> B = [5 6; 7 8];

$$B = \begin{bmatrix} 5 & 6 \\ 7 & 8 \end{bmatrix}$$

>> C = [A, B]
C =

1 2 5 6
3 4 7
A,B must have same number of rows

>> C = [A; B]



appending columns or rows

```
>> A = [1 2; 3 4; 5 6];
>> b = [7; 7; 7];
>> c = [8 8 8]';
\gg B = [A,b,c]
B =
>> C = [b,A,c]
              6
```

$$A = \begin{bmatrix} 1 & 2 \\ 3 & 4 \\ 5 & 6 \end{bmatrix}, \mathbf{b} = \begin{bmatrix} 7 \\ 7 \\ 7 \end{bmatrix}, \mathbf{c} = \begin{bmatrix} 8 \\ 8 \\ 8 \end{bmatrix}$$

```
>> D = [A; [7 7];]
>> E = [[8 8]; A]
E =
     8
```

```
special matrices
```

```
>> help eye
>> help zeros
>> help ones
```

```
zeros(3) % 3x3 matrix of zeros
ans =
          % 3x3 matrix of ones
ones(3)
ans =
```

general usage:

eye(N,M)
zeros(N,M)
ones(N,M)

for more information on elementary matrices see:

```
>> help elmat
 Elementary matrices and matrix manipulation.
 Elementary matrices.
   zeros
               - Zeros array.
              - Ones array.
   ones
   eye - Identity matrix.
   repmat - Replicate and tile array.
   linspace - Linearly spaced vector.
   logspace
              - Logarithmically spaced vector.
   etc.
>> help gallery % various test matrices
```

```
>> A = [1 2 3; 4 5 6; 7 8 9]
A =
                              >> help diag
             6
              9
>> d = diag(A) % main diagonal
d =
    5
    9
>> d = diag(A,-1) % first sub-diagonal
```

4

d =

how to make a diagonal matrix

```
>> d = [4 5 6]; % or, column d = [4 5 6]';
A = diag(d)
                     % d is main diagonal
A =
>> d = [4 5];
A = diag(d,1)
                     % d is first upper-diagonal
A =
              5
```

```
>> A = [1 2; 3 4]; B = [5 6; 7 8];
>> C = [9 8 7; 6 5 4; 3 2 1];
>> blkdiag(A,B)
                                     how to make
ans
                                     block-diagonal
                                     matrices
     0
                  5
                              matrix dimensions expand
>> blkdiag(A,B,C)
                              as necessary
ans
                               6
                                      5
```

replicating matrices

```
>> A=[1 2; 3 4]
A =
>> repmat(A, 3, 4)
ans =
             2
                          2
                    1
                                 1
             2
                          2
                    1
                                       2
       3
                    3
                                 3
       1
             2
                    1
                                 1
                                             1
       3
              4
                    3
                          4
                                 3
                                              3
                                       4
```

reshaping a matrix or a vector

```
>> a = [1 2 3 4 5 6];
>> reshape(a,2,3)
ans
                  5
>> reshape(a,3,2)
ans
           5
```

```
B = reshape(A,P,Q)
```

reshapes an NxM matrix into a PxQ matrix (must have PxQ=NxM)

B is formed column-wise from the elements of A

reshaping a matrix or a vector

```
A = [1]
         6
             5
     4
         8
             4];
>> reshape(A,3,4)
ans
     2 5 8 0
     3
         6
>> reshape(A,2,6)
ans
```

4

```
>> reshape(A,6,2)
ans =

1          7
2          8
3          9
4          5
5          0
6          4
```

0

4

5

```
>> A = [1 2; 3 4]
```

$$A =$$

1 2

>> [A, A.^2; 2.^A, A^2]

% form sub-blocks

ans =

% note A.^2 ~= A^2

$$>> B = 10.^A;$$

ans =

element-wise operations

A =

1 4

8 2

B =

1 2

2 1

>> A./B

ans =

1 2

4 2

>> A.\B

ans =

1.0000 0.5000

0.2500 0.5000

But note the matrix operations:

>> sym(A/B) % A*inv(B)

ans =

[7/3, -2/3]

[-4/3, 14/3]

>> A\B % inv(A)*B

ans =

0.2 0.0

0.2 0.5

element-wise operations

$$A =$$

1 4

B =

1 2

2 1

ans =

1 8

16 2

ans =

1 16

64 2

>> B.^A

1 16

functions of matrices

```
>> X = [pi/2, pi/3; pi/4, pi/8]
X =
    1.5708 1.0472
                              many functions operate
    0.7854 0.3927
                              element-wise on matrices
                              e.g., trig, exp, log functions
>> sin(X)
ans =
                              others, operate column-wise
    1.0000 0.8660
                              e.g., min, max, sort, diff,
    0.7071
                0.3827
                              mean, std, median,
                              sum, cumsum, prod, cumprod
>> sin(sym(X))
ans
                             3^(1/2)/2]
[2^{(1/2)/2}, (2 - 2^{(1/2)})^{(1/2)/2}]
```

functions of matrices

functions that operate column-wise can also operate row-wise by using a second argument

```
\gg sum(A,2)
ans
     21
     13
     11
     10
>> cumsum(A,2)
ans
            13
                    21
      8
                    13
            10
                    11
      6
             8
                    10
```

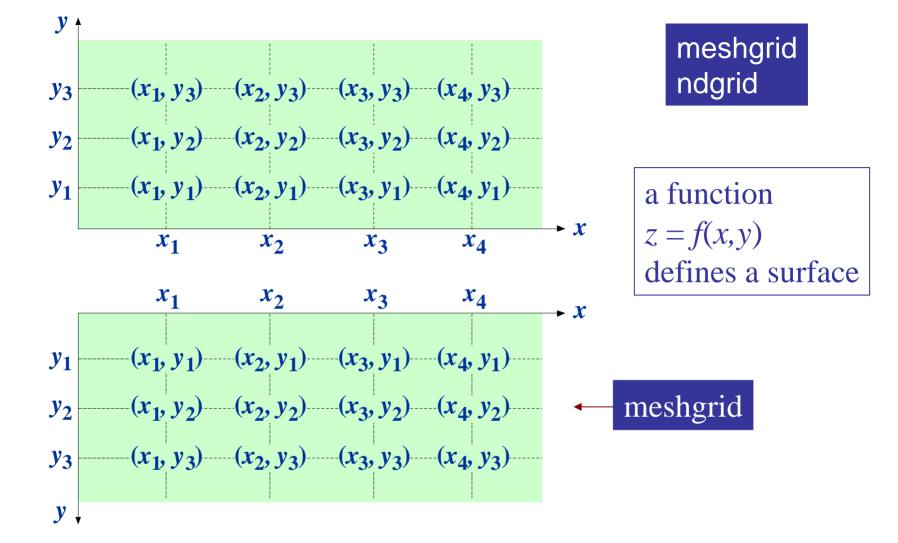
functions of matrices

means computed across rows

```
>> [m,i]=min(A)
m =
              2
i =
     3
>> [m,i]=min(A,[],2);
>> [m,i]
ans
     5
```

min, max require a sightly different syntax for row-wise operation, similarly for diff, std

```
functions of matrices
                     8
A = [8]
              5
                     3
      2
                     5
                                >> rot90(A)
      6
                     2];
                                ans
                                    8
>> fliplr(A)
                                    5
ans
      8
              5
                     8
      5
                              rotate by 90 degrees
      2
                               reverse each row
>> flipud(A)
                               reverse each column
ans
      6
                               flipud(rot90(A)) and
                     5
      2
                              rot90(fliplr(A))
      9
                              are the same as A'
      8
```



$$X = \begin{bmatrix} x_1 & x_2 & x_3 & x_4 \\ x_1 & x_2 & x_3 & x_4 \\ x_1 & x_2 & x_3 & x_4 \end{bmatrix}, Y = \begin{bmatrix} y_1 & y_1 & y_1 & y_1 \\ y_2 & y_2 & y_2 & y_2 \\ y_3 & y_3 & y_3 & y_3 \end{bmatrix}$$

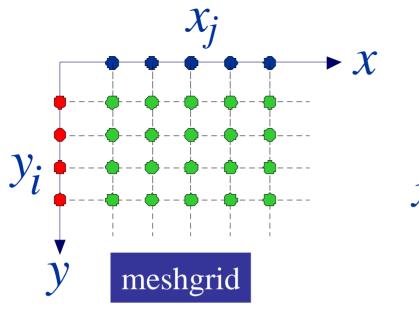
```
>> x = [1 2 3 4]; % N-dim
>> y = [5 6 7]; % M-dim
```

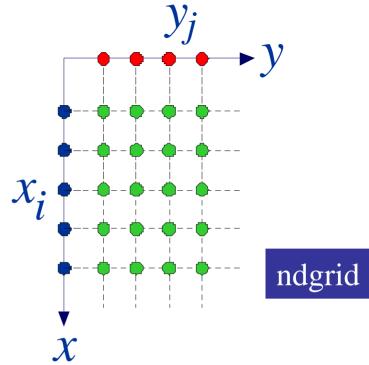


```
>> [X,Y] = meshgrid(x,y)
X =
  1
                 rows are
         3
             4
                 copies of x
Y
  5
      5
          5
              5
  6
              6
          6
          7
              7
                   columns are
                   copies of y
 X,Y have size MxN
```

```
[Y,X] = meshgrid(y,x)
                 equivalent
>> [X,Y] = ndgrid(x,y)
X =
       3
    3
       4
           4
Y =
    5
       6
    5
       6
    5
       6
    5
       6
```

X,Y have size NxM





J

$$[X,Y] = meshgrid(x,y)$$

x = rows

y = columns

$$[X,Y] = ndgrid(x,y)$$

x = columns

y = rows

$$[Y,X] = meshgrid(y,x)$$

$$[Y,X] = ndgrid(y,x)$$

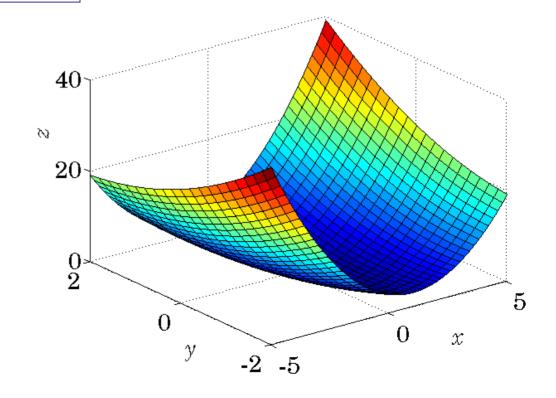
x = linspace(-5,5,51); y = linspace(-2,2,21); [X,Y] = meshgrid(x,y); Z = X.*Y + Y.^2 + X.^2; figure; surf(X,Y,Z);

Example 1: Surface plot

element-wise operations make sense because X,Y have the same dimensions.

meshgrid is typically used for surface plots, which are graphs of functions of two variables, z = f(x,y), e.g.,

$$z = f(x,y) = x^*y + x^2 + y^2$$

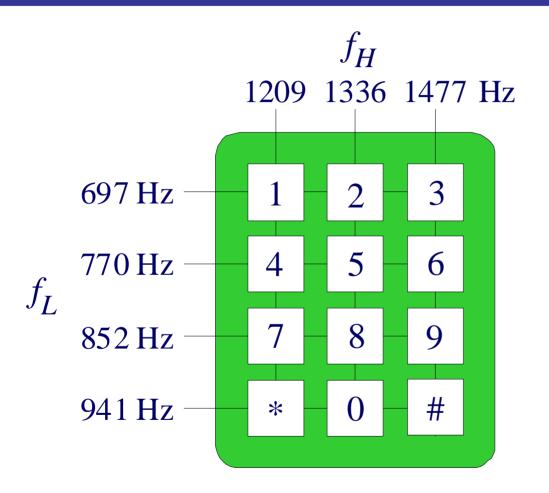


Example 2: calculate x = vtat a vector of times tfor different values of v

```
t = [0 \ 1 \ 2 \ 3 \ 4];
v = [1 -2 3];
[T,V] = meshgrid(t,v);
X1 = V.*T
[V,T] = meshgrid(v,t);
X2 = V.*T
[T,V] = ndgrid(t,v);
X3 = V.*T
[V,T] = ndgrid(v,t);
X4 = V.*T
```

```
X1 =
          -2
                      -6
                             -8
          3
                       9
                            12
X2 =
                 3
          -2
                 6
          -4
          -6
                12
          -8
X3 =
          -2
          -4
          -6
                      \nu \downarrow
          -8
                12
X4 =
          -2
                -4
                      -6
                             -8
                            12
                 6
```

Example 3: Dual-Tone-Multi-Frequency (DTMF) keypad (aka, touch-tone phone)



each key is mapped to a pair of low & high frequencies (fL,fH)

we may use ndgrid to replicate fL across columns, and fH along rows

$$y(t) = \sin(2\pi f_L t) + \sin(2\pi f_H t)$$

```
K = ['1']
       121
                  131
                          keypad
   141 151 161
                          matrix
     171 181 191
     '*' '0' '#'];
% equivalently,
% K = ['123'; '456'; '789'; '*0#'];
fL = [697, 770, 852, 941];
fH = [1209, 1336, 1477];
[FL,FH] = ndgrid(fL,fH);
```

complete code in keypad.m

$$F_L = \begin{bmatrix} 697 & 697 & 697 \\ 770 & 770 & 770 \\ 852 & 852 & 852 \\ 941 & 941 & 941 \end{bmatrix}, \quad F_H = \begin{bmatrix} 1209 & 1336 & 1477 \\ 1209 & 1336 & 1477 \\ 1209 & 1336 & 1477 \\ 1209 & 1336 & 1477 \end{bmatrix}$$

```
s = input('enter number to dial: ', 's');
fs = 8192;
                    % soundcard sampling rate
T = 1/fs;
                    % sampling time interval
Td = 1/4;
                    % duration of each key, sec
Tb = 1/10;
                    % blanking time, sec
Nb = round(Tb*fs); % blanking time samples
yb = zeros(1,Nb); % blanking signal samples
                    % time vector for each key
t = 0:T:Td;
                     % initialize overall signal
y = [];
```

enter a phone number to dial, e.g., s = 2125551212, set up sampling rate for sound card, set playing time of each key, and blanking time between keys

```
for k=1:length(s)
                                             find the location
   [i,j] = find(K==s(k));
                                             of key within the
                                             keypad matrix
   x = \sin(2*pi* FL(i,j) * t) + ...
        sin(2*pi * FH(i,j) * t);
                                             append to
   y = [y, x, yb];
                                             overall signal
end
                                             play overall
sound(y,fs);
                                             signal
```

Note: the phone number **s** encoded into the signal **y** can be retrieved at the receiver by appropriate post-processing of **y**.

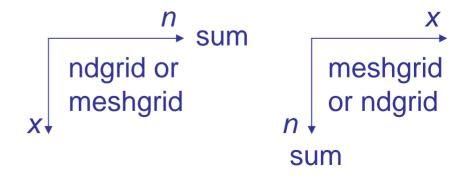
One method for doing this is via the *discrete-time Fourier transform* and is included in the program keypad.m. However, we will not cover it in this course (you'll learn about it in your DSP courses).

```
% v = [];
% for k=1:length(s)
                                        equivalent method
%
     q = find(K==s(k));
                                        using column-wise
     x = \sin(2*pi* FL(q) * t) + ...
%
                                        matrix indexing
%
          sin(2*pi * FH(q) * t);
%
     y = [y, x, yb];
                                        included in keypad.m
% end
% sound(y,fs)
% y = [];
% for k=1:length(s)
%
     [i,j] = find(K==s(k));
                                          equivalent method
      x = \sin(2*pi* fL(i) * t) + ...
%
                                         w/o using ndgrid
%
           sin(2*pi * fH(j) * t);
    y = [y, x, yb];
% end
% sound(y,fs)
```

Example 4: Vectorized Taylor series calculations

$$e^{x} = 1 + x + \frac{x^{2}}{2!} + \frac{x^{3}}{3!} + \dots = \sum_{n=0}^{\infty} \frac{x^{n}}{n!} = \lim_{N \to \infty} \sum_{n=0}^{N} \frac{x^{n}}{n!}$$

$$S(x,N) = \sum_{n=0}^{N} \frac{x^n}{n!}$$
 may be viewed as a matrix in the variables (x,n), and summed along the n dimension



```
x can be a column, row, or matrix, but it is used as x(:) inside ndgrid
```

```
[X,n] = ndgrid(x, 0:N);
S = sum(X.^n ./ factorial(n), 2);
```

ndgrid method:

x = columns

n = rows

sum row-wise

```
[X,n] = meshgrid(x, 0:N);
S = sum(X.^n ./ factorial(n));
```

meshgrid method:

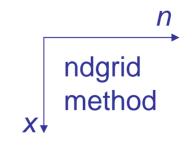
n = columns

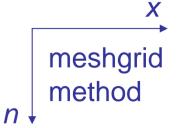
x = rows

sum column-wise

```
S = reshape(S,size(x));
```

reshape S into column, row, or matrix to match the given shape of x





alternative methods with partial or no vectorization

```
S = zeros(size(x));
n = 0:N;
```

n is vectorized, but not x

```
for i=1:length(x),
   S(i) = sum(x(i).^n ./ factorial(n));
end
```

```
for n=0:N,
   S = S + x.^n / factorial(n);
end
```

no vectorization

```
for i=1:length(x),
    for n=0:N,
    S(i) = S(i) + x(i)^n / factorial(n);
    end
end
```

```
x = [1 \ 3 \ 0 \ -4 \ 10]'; N = 30;
                         % x is column
[X,n] = meshgrid(x, 0:N);
S = sum(X.^n ./ factorial(n));
S = reshape(S, size(x));
fprintf('\n x exp(x) S(x,N)\n');
fprintf(' -----\n');
fprintf('% 7.2f %12.6f %12.6f\n', [x,exp(x),S]');
    x = exp(x) S(x,N)
  1.00 2.718282 2.718282
  3.00 20.085537 20.085537
  0.00 1.000000 1.000000
 -4.00 0.018316 0.018316
 10.00 22026.465795 22026.464036 \leftarrow needs larger N
```

later on we'll discuss how to pick N to achieve any desired degree of convergence

Example 5: Polynomial evaluation

$$P(x) = c_0 x^M + c_1 x^{M-1} + \cdots + c_{M-1} x + c_M$$

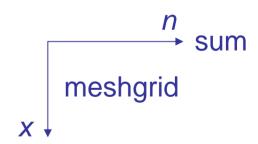
$$= \sum_{n=0}^{M} c_n x^{M-n}$$

$$\mathbf{c} = [c_0, c_1, \dots, c_M]$$
may be viewed as a matrix in the variables (x,n), and summed along the n dimension

```
M = length(c)-1;
[n,X] = meshgrid(0:M, x);
C = meshgrid(c,x);

P = sum(C .* X.^(M-n), 2);

P = reshape(P,size(x));
```



why did we use [n,x] instead of [x,n]?

$$P(x) = x^3 - 3x^2 + 4x + 2$$

```
x = [1, 2, 3]; c = [1, -3, 4, 2];
M = length(c)-1;
[n,X] = meshgrid(0:M, x);
C = meshgrid(c,x);
P = sum(C .* X.^{(M-n)}, 2);
P = reshape(P, size(x))
P =
                  14
            6
                            polyval is the standard
polyval(c,x)
                             built-in function for
ans =
                             polynomial evaluation
                  14
```

Example 6: Peaks

the polynomial method easily generalizes to other parametric curves

$$S(x) = \sum_{n=1}^{M} \frac{c_n}{(x - a_n)^2 + b_n^2} = \frac{c_1}{(x - a_1)^2 + b_1^2} + \dots + \frac{c_M}{(x - a_M)^2 + b_M^2}$$

```
x = linspace(0,10,201);
a = [1 \ 3 \ 6 \ 8];
b = [0.1, 0.2, 0.2, 0.1];
c = [1 \ 2 \ 3 \ 1];
[A,X] = meshgrid(a,x);
B = meshgrid(b,x);
C = meshgrid(c,x);
S = sum(C./((X-A).^2 + B.^2), 2);
S = reshape(S, size(x));
```

known as Lorentzian curves, used for modeling chemical spectral peaks

$$n,a,b,c$$
 sum meshgrid

```
figure; plot(x,S,'b-');

xaxis(0,10, 0:10);
yaxis(0,120, 0:20:120);
xlabel('\itx'); grid;
```

