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# **ABE 591S Principles of Systems and Synthetic Biology**

## **MATLAB Crash Course**

# Objective

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Get comfortable playing with MATLAB & demonstrate how we can apply it to biological problems ....

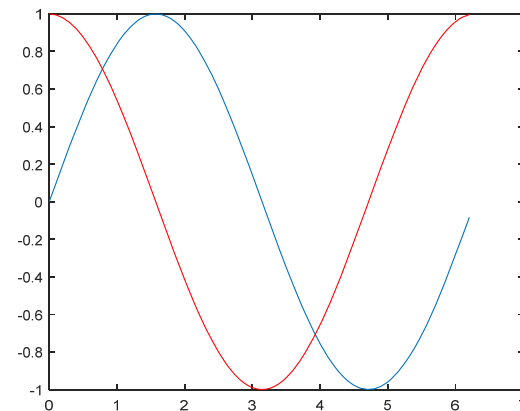
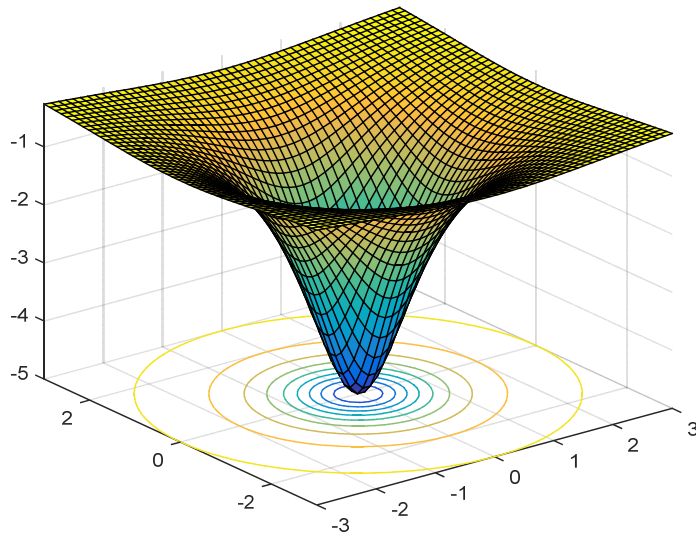
- The MATLAB environment
- Entering & Manipulating Data
- Plotting Data
- m-files and functions
- MATLAB Programming
- Solving ODEs
- Biological oscillators (Elowitz & Leibler, *Nature*, 2000).

# What is MATLAB or matrix laboratory?

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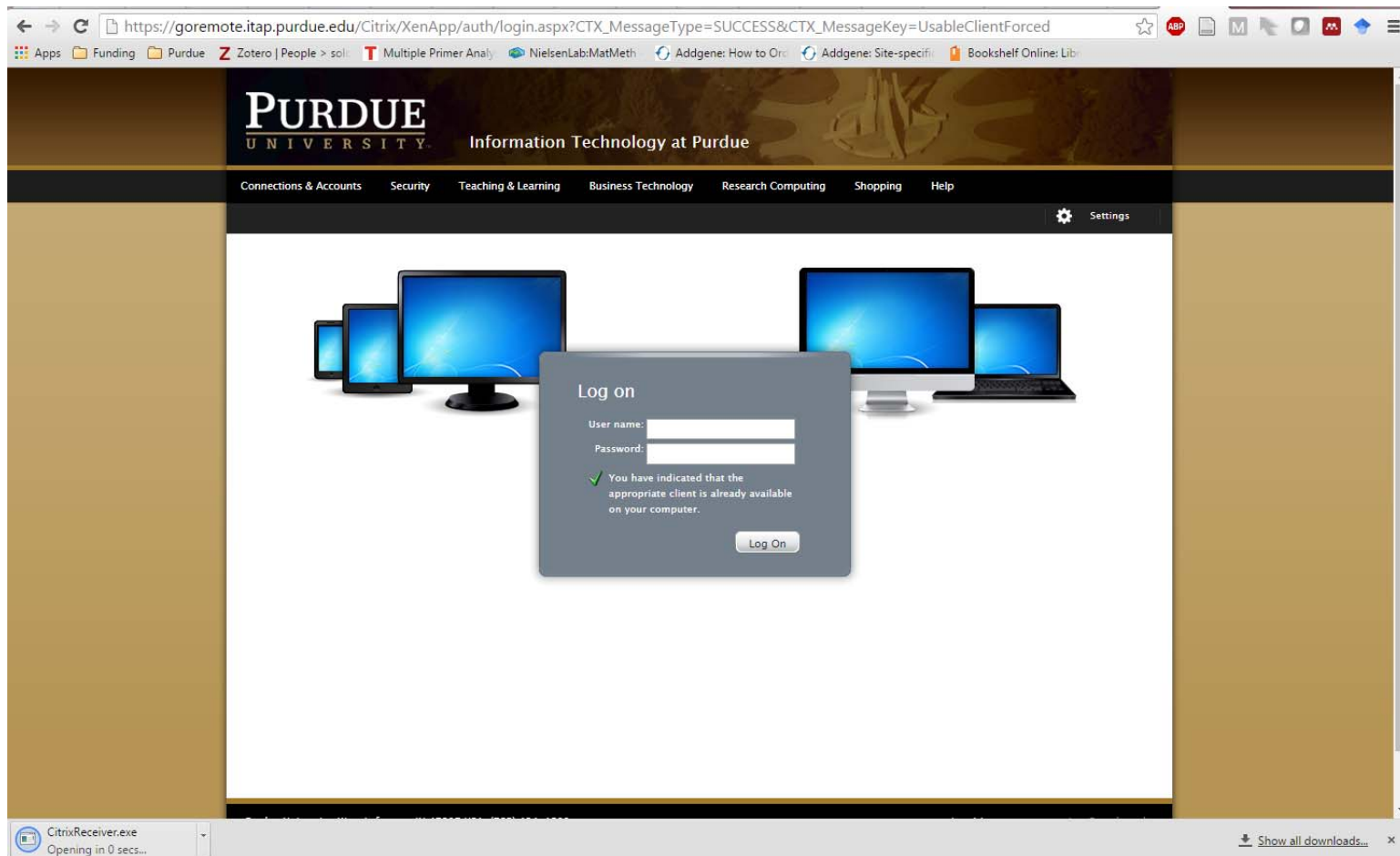
Powerful platform for mathematical and scientific computation

- Easy syntax
- Many modules/functions for most applications
- Solves problems *numerically*
- Standard in education and industry



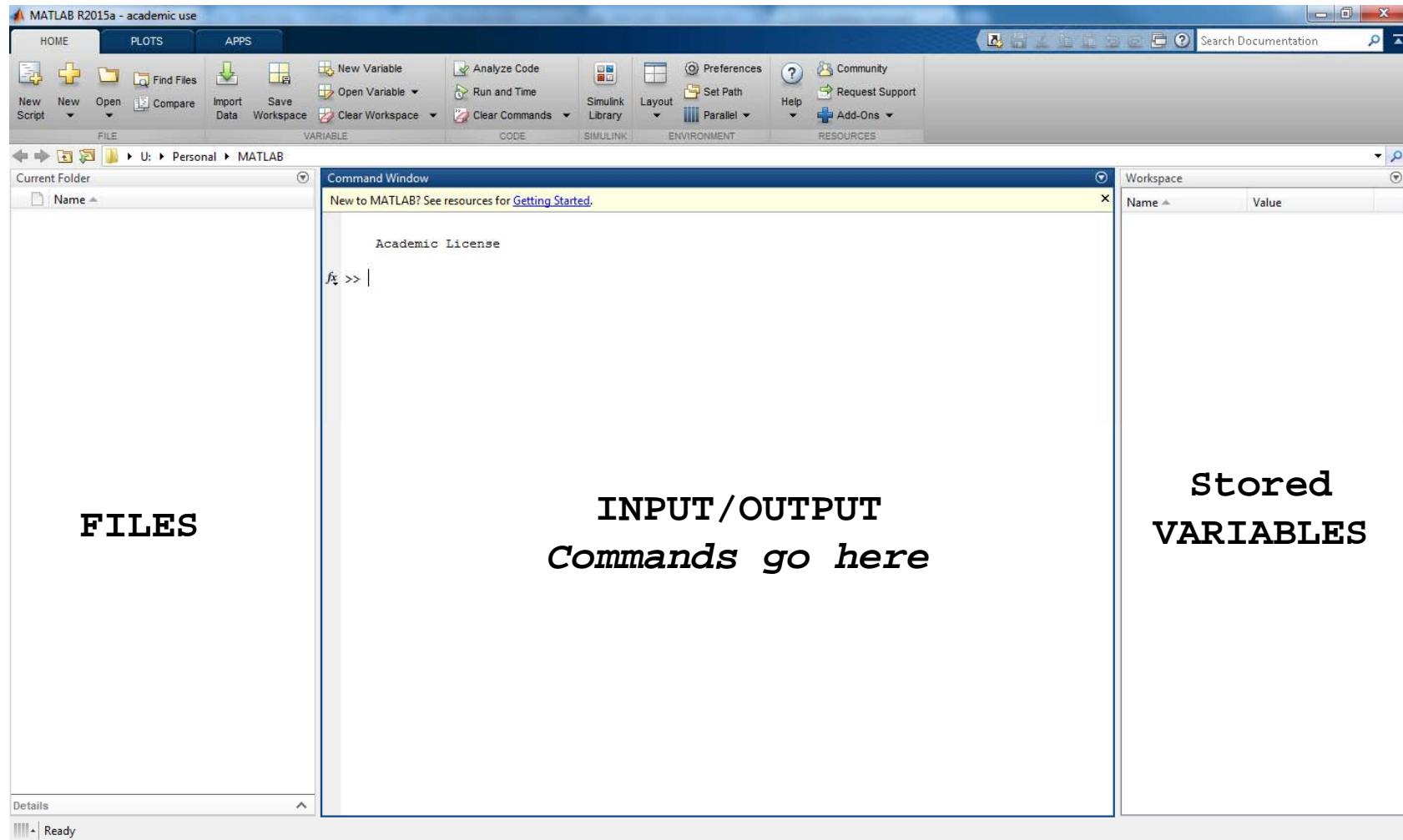
# How to get MATLAB?

Any iTAP/ECN computer or at home via iTAP goRemote  
- <https://goreremote.itap.purdue.edu/>

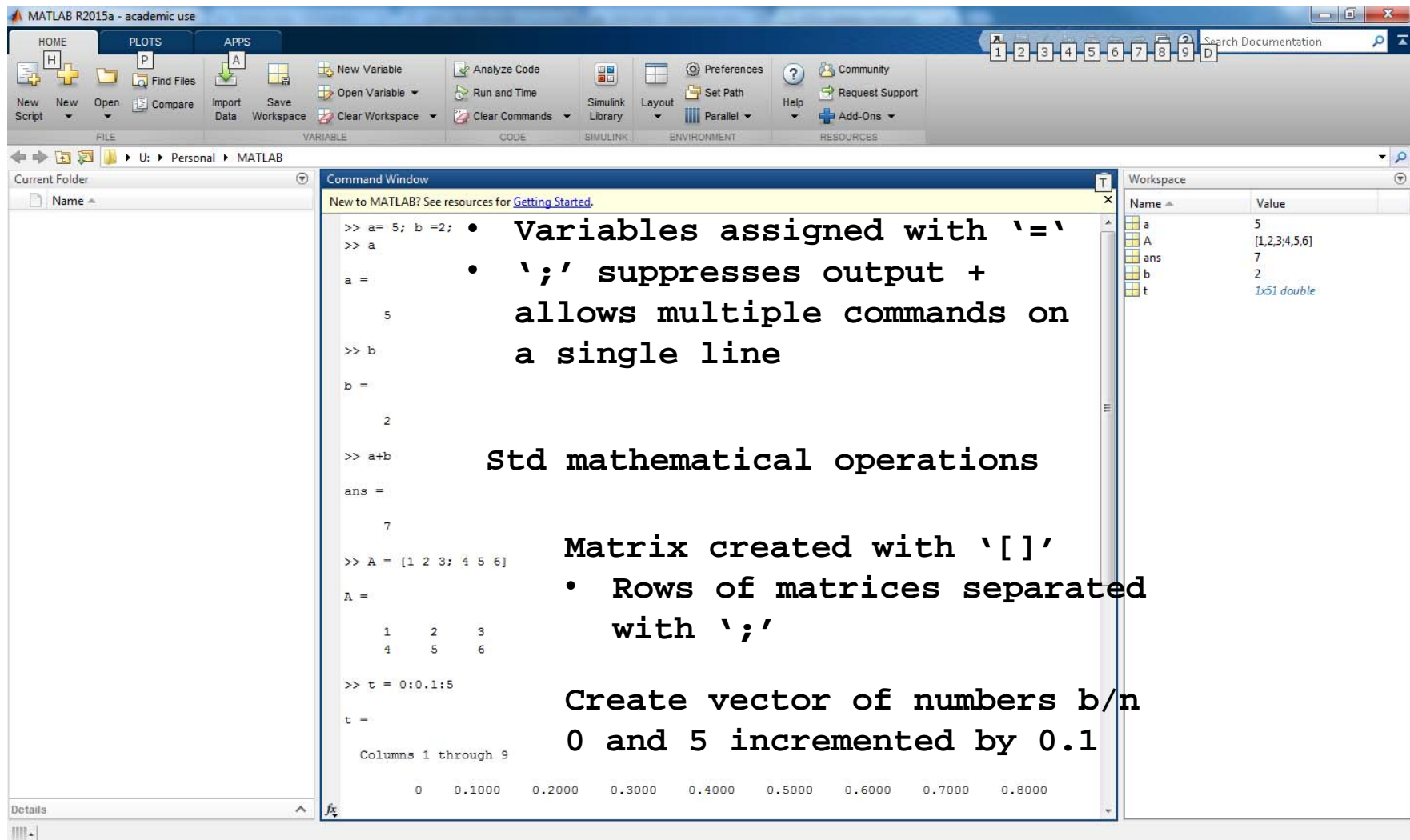


# The MATLAB environment

Default IDE below



# Entering & Manipulating Data



The image shows the MATLAB R2015a interface. The Command Window displays the following code and output:

```
>> a= 5; b =2;
>> a
a =
    5
>> b
b =
    2
>> a+b
ans =
    7
>> A = [1 2 3; 4 5 6]
A =
     1     2     3
     4     5     6
>> t = 0:0.1:5
t =
Columns 1 through 9
    0    0.1000    0.2000    0.3000    0.4000    0.5000    0.6000    0.7000    0.8000
```

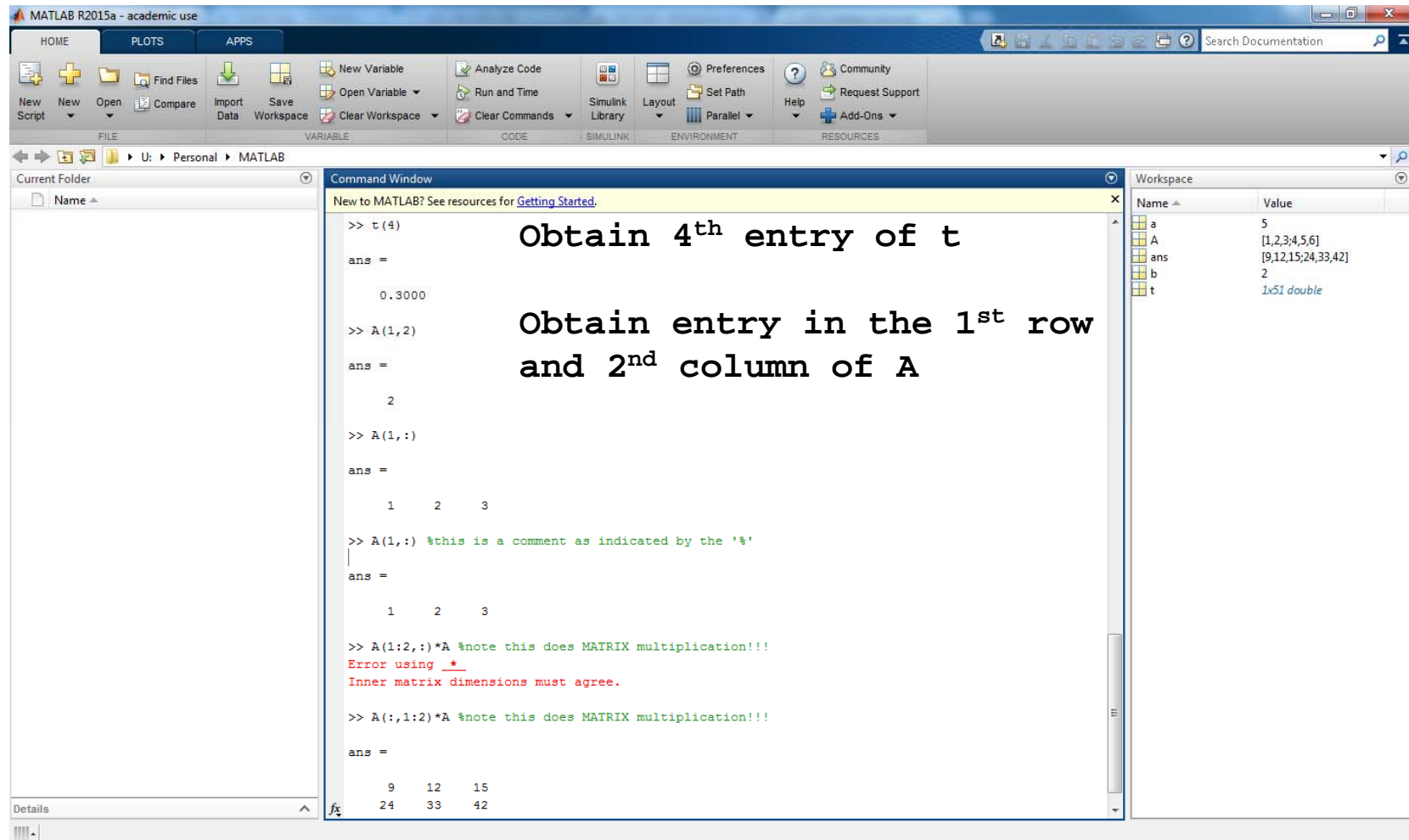
Annotations in the Command Window:

- Variables assigned with '='
- ';' suppresses output + allows multiple commands on a single line
- Std mathematical operations
- Matrix created with '['']'
- Rows of matrices separated with ';' (referring to the matrix A)
- Create vector of numbers b/n 0 and 5 incremented by 0.1 (referring to the vector t)

The Workspace window shows the following variables:

Name	Value
a	5
A	[1,2,3;4,5,6]
ans	7
b	2
t	1x51 double

# Entering & Manipulating Data



The image shows the MATLAB R2015a interface. The Command Window displays the following code and output:

```
>> t(4)
ans =
    0.3000
```

Obtain 4<sup>th</sup> entry of t

```
>> A(1,2)
ans =
    2
```

Obtain entry in the 1<sup>st</sup> row and 2<sup>nd</sup> column of A

```
>> A(1,:)
ans =
    1     2     3
```

```
>> A(1,:) %this is a comment as indicated by the '%'
ans =
    1     2     3
```

```
>> A(1:2,:)*A %note this does MATRIX multiplication!!!
Error using *
Inner matrix dimensions must agree.
```

```
>> A(:,1:2)*A %note this does MATRIX multiplication!!!
ans =
     9    12    15
    24    33    42
```

The Workspace window shows the following variables:

Name	Value
a	5
A	[1,2,3;4,5,6]
ans	[9,12,15;24,33,42]
b	2
t	1x51 double

# Manipulating data

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- The `log` command is natural log.  $\log_{10} = \log10$
- $e^5$  is `exp(5)`
- MATLAB recognizes `i` and `j` in complex numbers
- Arithmetic operations are by default matrix operations!
  - Can calculate determinants and eigenvalues

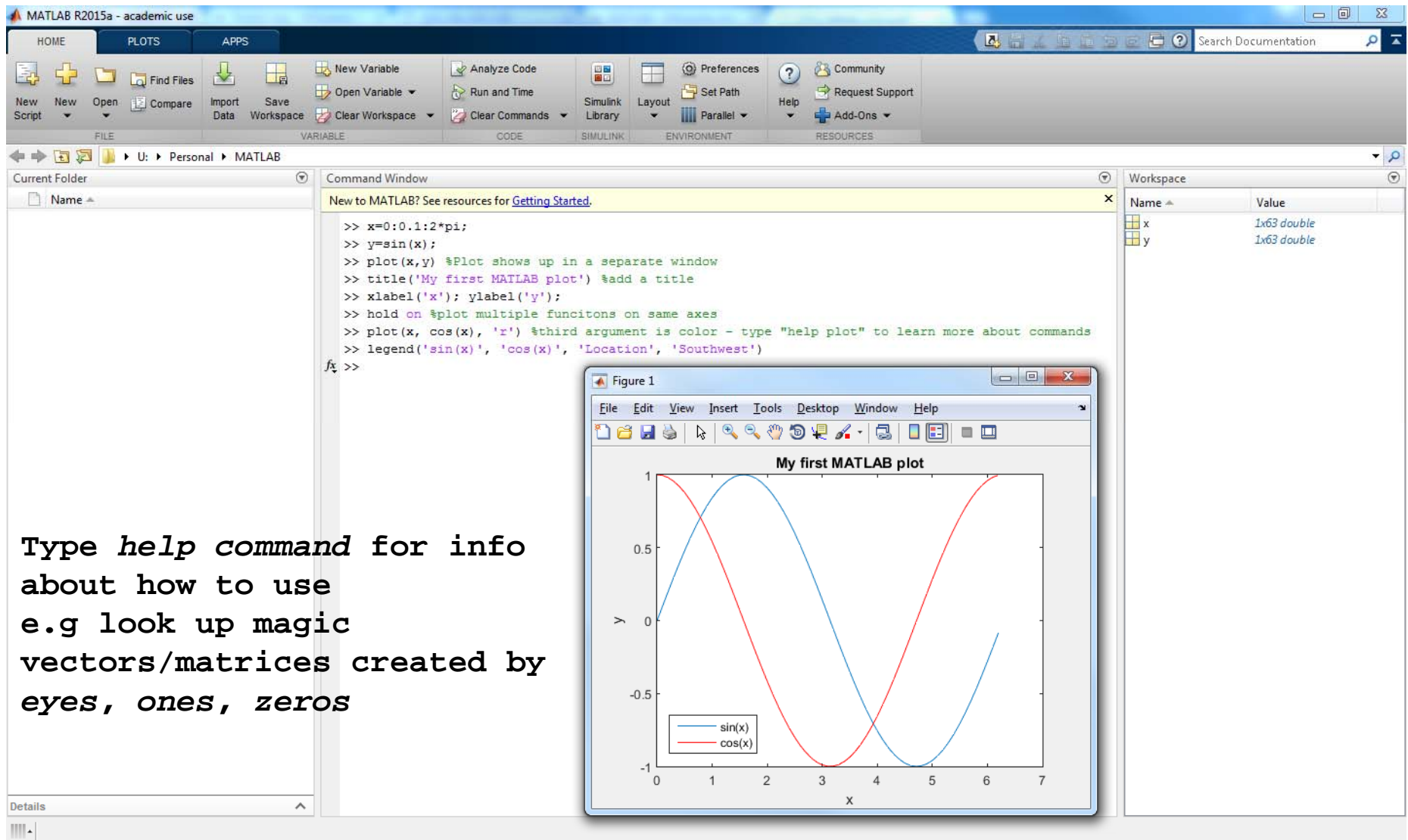
$$\begin{bmatrix} a & b \\ c & d \end{bmatrix} \times \begin{bmatrix} e & f \\ g & h \end{bmatrix} = \begin{bmatrix} ae + bg & af + bh \\ ce + dg & cf + dh \end{bmatrix}$$

A                      B                      C

A, B and C are square matrices of size  $N \times N$   
a, b, c and d are submatrices of A, of size  $N/2 \times N/2$   
e, f, g and h are submatrices of B, of size  $N/2 \times N/2$

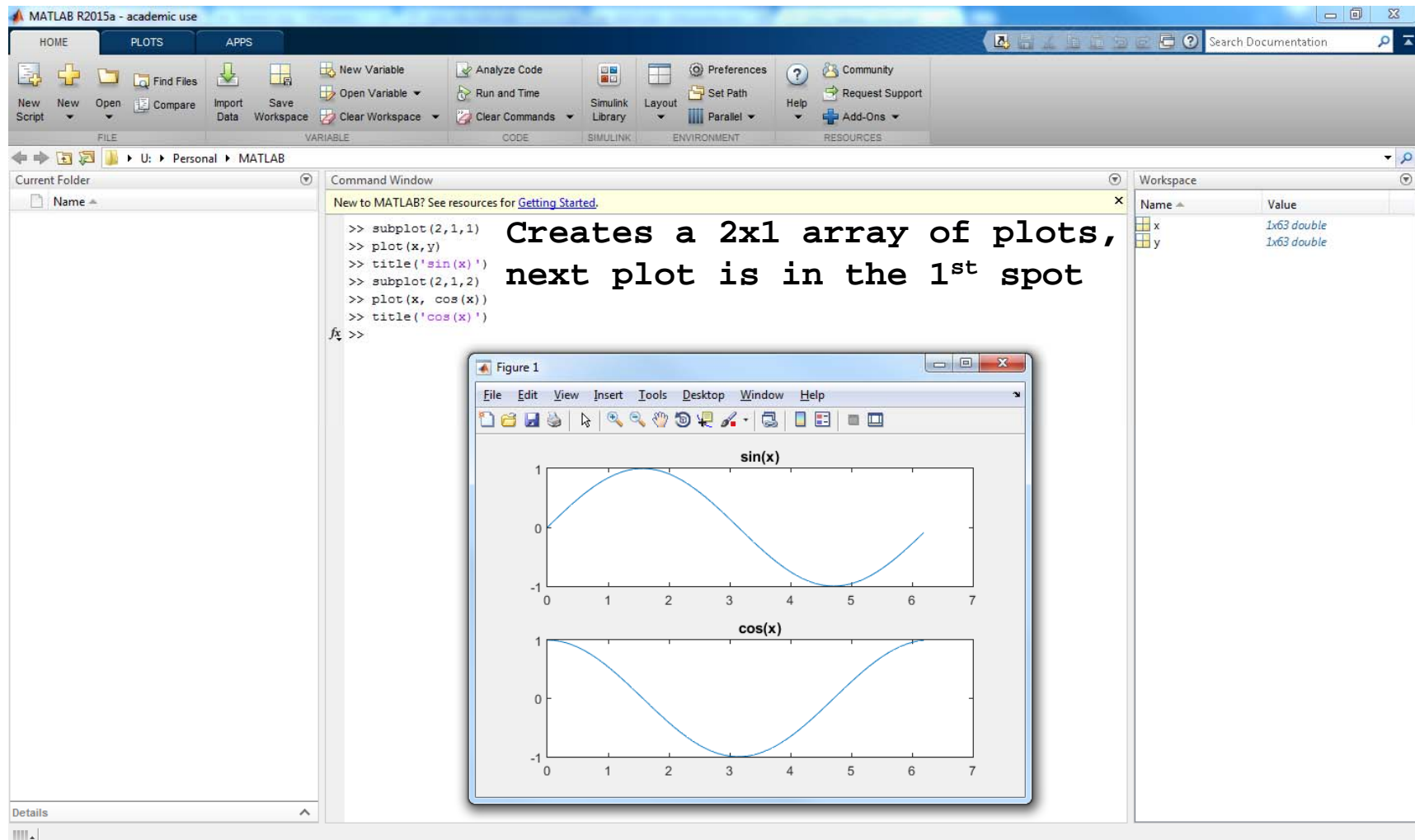


# Visualizing Data



Type *help* command for info  
about how to use  
e.g look up magic  
vectors/matrices created by  
*eyes, ones, zeros*

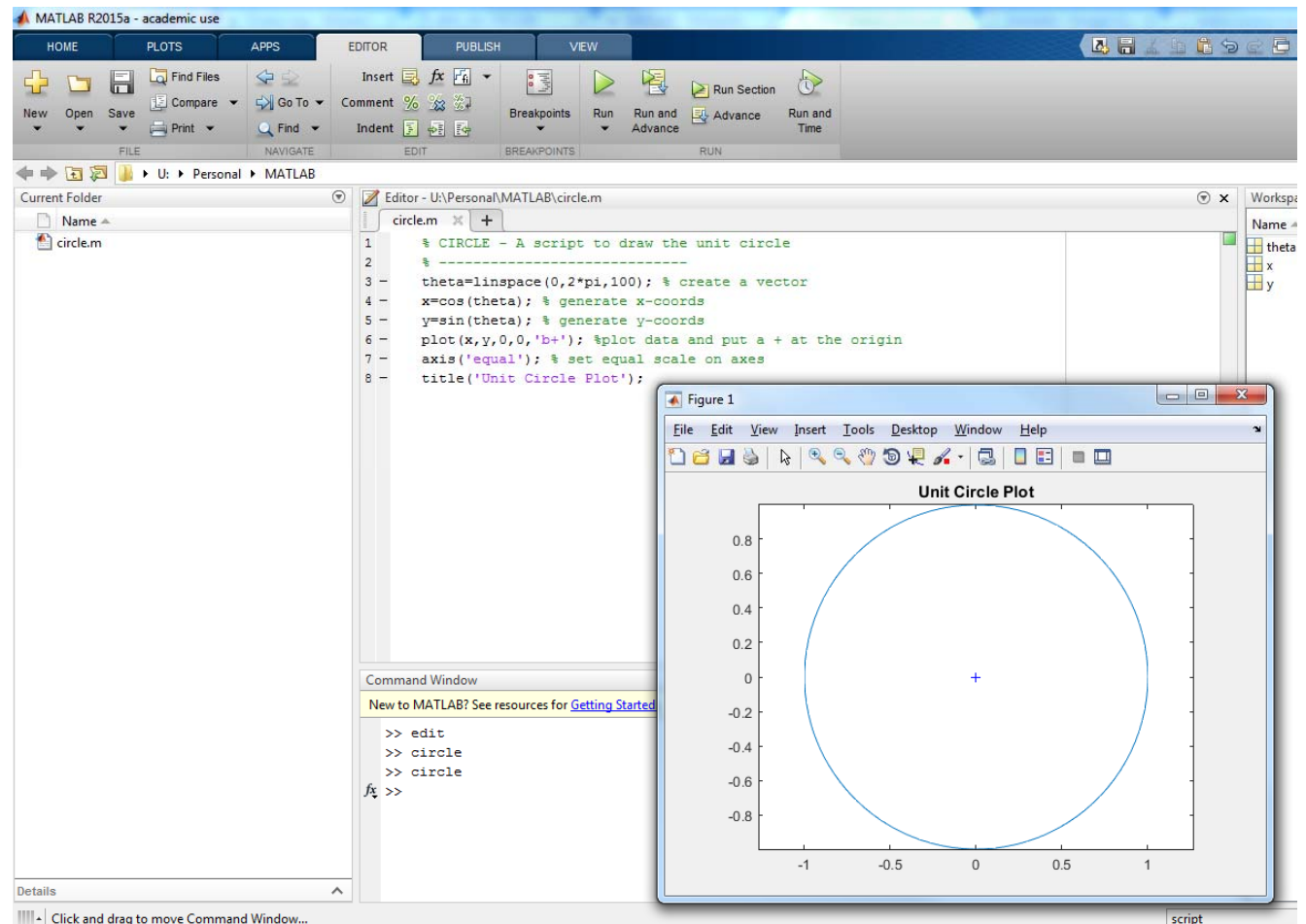
# Visualizing Data



# m-files and Functions

m-files allow you to write custom functions or scripts of commands

- Call editor with `edit` or write m-file in fave text editor
- Call saved m-file in current directory from command window with `$script_name`
- Mathematical functions have unique requirements – see e.g.



# MATLAB Programming

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## MATLAB recognizes std. programming techniques

### For Loops

```
% print out all values of 5m for integer  
values of 1<= m <=100
```

```
for m = 1:100  
    num = m*5  
end
```

### While Loops:

```
%find all powers of 2 below 100. will  
iterate as long as this is true
```

```
k=1; num = 1; v = 1;  
while num < 100  
    num = 2^k;  
    v = [v; num];  
    k= k+1;  
end
```

### If statements

```
k = 6; m = 21  
if k>5  
    n = k;  
elseif (k>1) &(m==20)  
    n = 5*k+m;  
else  
    n=1;  
end
```

### Comparators

AND	$a \& b$
OR	$a   b$
Not Equal	$a \neq b$
Equal	$a == b$
Greater than	$a > b$
Greater than or equal	$a \geq b$

# Solving ODEs

e.g.  $\frac{dy}{dt} = y; 0 \leq t \leq 2; y(0) = 1$



Initial/boundary value – need one for every variable if first order

Define system of equations as a function (in an m-file, as follows)

```
function dy = myodes(t, y);
dy = y;
```

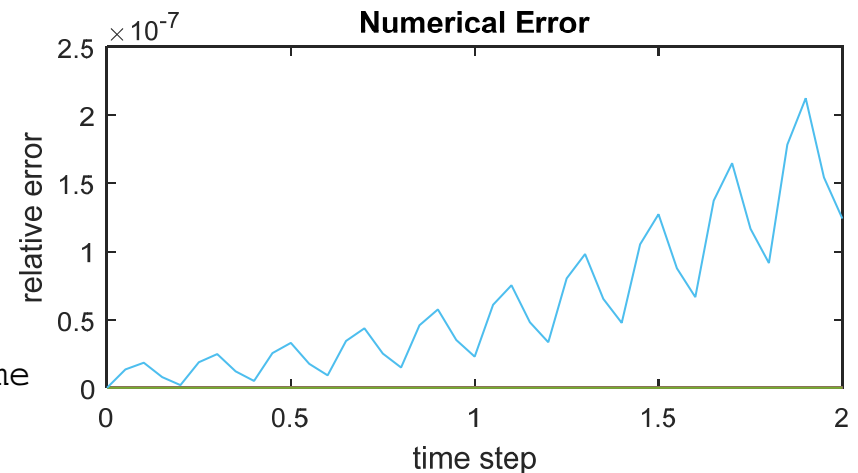
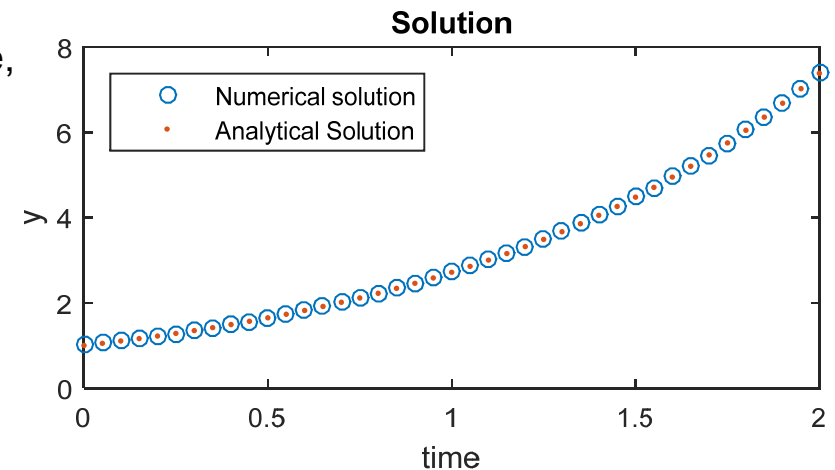
**Function name**  
**List arguments**

%must save as function name e.g.  
myodes.m

**when calling**

Solve system in script or command line with

```
[t y] = ode45(@(t,y) myodes(t,y), [0 2], [1]);
subplot(2,1,1);
plot(t, y, 'o', t, exp(t), '.');
title('Solution'); xlabel('time');
ylabel('y');
legend('Numerical solution',
'Analytical Solution',
'Location','Northwest');
subplot(2,1,2);
plot(t, (y-exp(t))/exp(t));
title('Numerical Error'); xlabel('time
step'); ylabel('relative error')
```

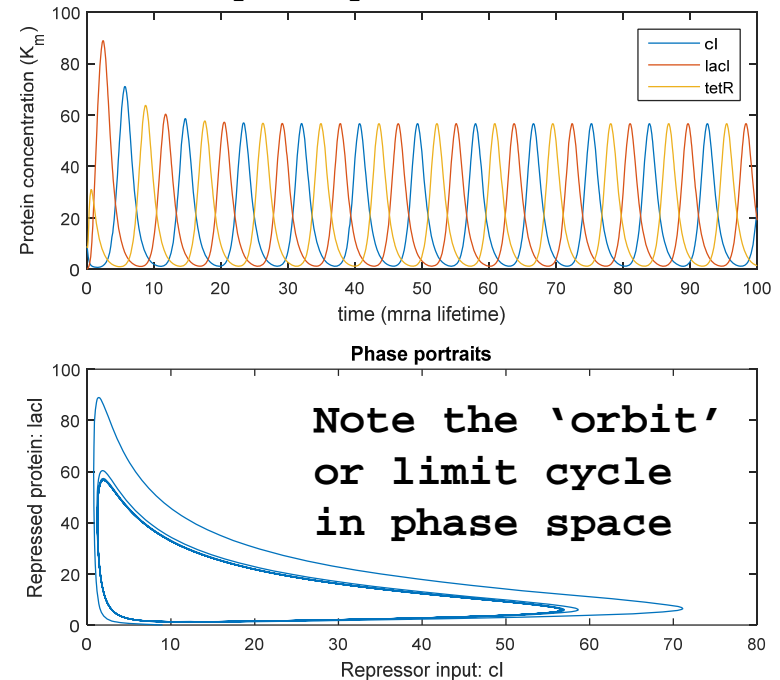


# Repressilator

```
function dx = repressilator(t,x, n, b , a, a0)
%x(1) to x(3) = m1 to m3 (lacI, tetR, cI), x(4) to x(6) = p1 to p3 (cI,
%lacI, tetR)

dx(1) = -x(1)+a/(1+x(4)^n)+a0;
dx(2) = -x(2)+a/(1+x(5)^n)+a0;
dx(3) = -x(3)+a/(1+x(6)^n)+a0;
dx(4) = -b*(x(4)-x(3));
dx(5) = -b*(x(5) - x(1));
dx(6) = -b*(x(6)-x(2));

dx=dx' ;
```



Solve the system with  $n = 2$ ,  $\beta = 5$ ,  $\alpha = 200$ ,  $\alpha_0 = \alpha \cdot 10^{-3}$  and initial values of  $[1 \ 1 \ 1 \ 9 \ 0 \ 9]$  to generate the plots above

# Linear Stability Analysis

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From our analysis of the non-dimensionalized system

$$\frac{dm_i}{dt} = \alpha_0 + \frac{\alpha}{1 + p_j^n} - m_i$$
$$\frac{dp_i}{dt} = -b(p_i - m_i)$$

What conditions were **necessary but not sufficient** for stable oscillations? What must be true of  $\alpha$ ,  $\alpha_0$ ,  $b$ ,  $n$ ?

# Explore the repressilator on your own

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Use your code to explore the parameter space of the Hill equation and see its impact on the dynamic behavior. Fig 1B may guide your parameter selections

1. Is the oscillator sensitive to the initial values of the problem? i.e. are the oscillations stable? *Stable systems will ALWAYS return to their stationary values regardless of initial trajectory*
2. If the system is made less cooperative ( $n \sim 1$ ), does the system oscillate?
3. If you increase  $b$  to 1000, will the system oscillate?
4. What is the impact of the background and full expression strength ( $\alpha_0$ ,  $\alpha$ )?
5. How does the behavior of this system compare to the simplified one described in class? [Assume mRNA has rapid equilibrium, no leaky expression]

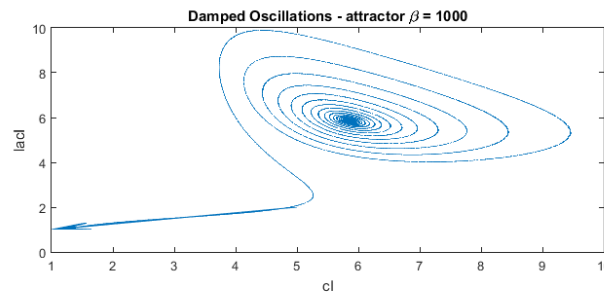
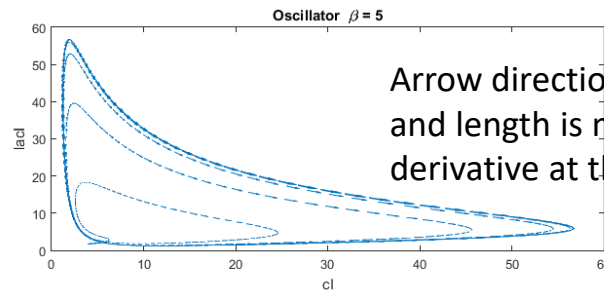


# Visualizing trajectories

How does the system evolve as a function of time as parameters or initial conditions vary?

```
n = 2; %hill coefficient
b = [5 1000];
a = 200;
a0 = a*1e-3; %region C of Fig 1B
titles = {'Oscillator \beta = 5', 'Damped Oscillations - attractor \beta = 1000'};
clf
for k = 1:size(b,2)
    subplot(2,1,k)
    clearvars x u t
    %determines the value of all repressors over time
    [t x] = ode45(@(t, x) repressilator(t, x, n, b(k), a, a0), [0 100], [1 0 1 5 2 2]);
    %then calculates their rate of change at those points
    u = ddt(x, n, b(k), a, a0);
    %and plots them
    scale_factor = 0.001; %change relative scale to make vectors easier to see
    if k == 1
        quiver(x(:,4), x(:,5), u(:,4), u(:,5))
    else
        quiver(x(:,4), x(:,5), u(:,4)*scale_factor, u(:,5)*scale_factor, 0);
    end
    xlabel('cI'); ylabel('lacI');
    title(titles(k))
end
suptitle('Evolution of phase portrait as a function of \beta')
```

Evolution of phase portrait as a function of  $\beta$



```
function dx=ddt(x, n, b, a, a0)
%x(1) to x(3) = m1 to m3 (lacI, tetR, cI), x(4) to x(6)
= p1 to p3 (cI,
%lacI, tetR)
```

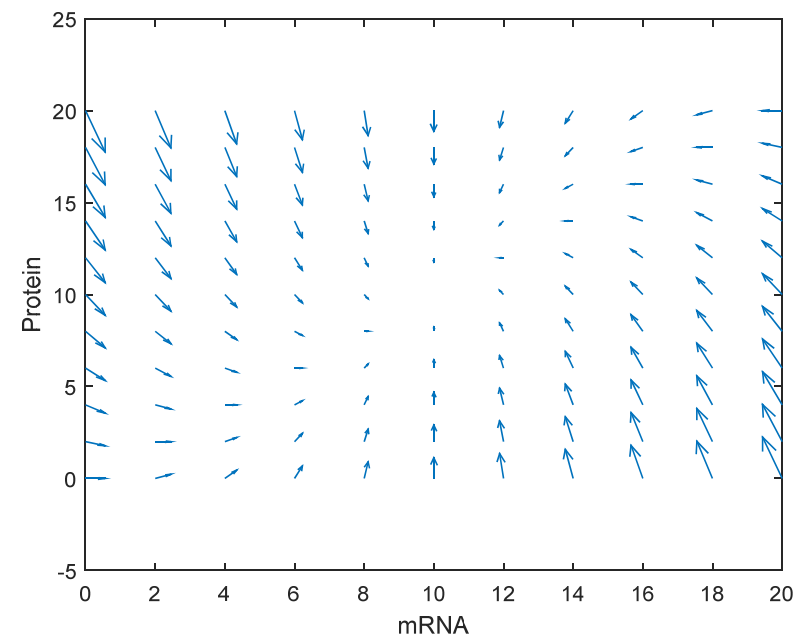
```
dx(:,1) = -x(:,1)+a./(1+x(:,4).^n)+a0;
dx(:,2) = -x(:,2)+a./(1+x(:,5).^n)+a0;
dx(:,3) = -x(:,3)+a./(1+x(:,6).^n)+a0;
dx(:,4) = -b*(x(:,4)-x(:,3));
dx(:,5) = -b*(x(:,5) - x(:,1));
dx(:,6) = -b*(x(:,6)-x(:,2));
```

# Vector fields

For simpler (low dimensional/non-interacting) systems, may be helpful to look at how these **derivatives** vary in phase space

Assume simple constitutive expression of a gene with  $x =$  mRNA and  $y =$  protein

```
[x y] = meshgrid(0:2:20,  
0:2:20);  
  
%constitutive gene expression  
dy = 2.*x-2.*y;  
dx = 10-x;  
  
quiver(x,y,dx, dy);
```



**What are the arrows pointing to?**  
**Why do they disappear in the center?**