

# SECTION 3: TWO-DIMENSIONAL PLOTTING

# Data Visualization

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- Like it or not, the ability to ***communicate effectively*** is an important aspect of being a successful engineer
  - ▣ Coworkers, managers, marketing, customers, etc.
- As engineers, effective communication often means ***effective communication of data***
  - ▣ Technical writing
  - ▣ ***Graphical presentation of data***: plots, graphs, charts, etc.
- Python has a variety of data-visualization tools available
  - ▣ We will use the ***Pyplot*** module from within the ***Matplotlib*** package
- Plots fall into two main categories:
  - ▣ **2-D plotting** – we'll introduce these plots here
  - ▣ **3-D plotting** – covered later in the course

# Matplotlib and Pyplot

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## □ **Matplotlib**

- Python package or library for creating a wide variety of plots

## □ **Pyplot**

- Matplotlib module including all of the plot functions we will use (and many, many more)
- As usual, we must **import** Matplotlib and Pyplot before we can use them
  - Import only the Pyplot module in any script where plots will be created:

```
from matplotlib import pyplot as plt
```

# Plotting In Spyder

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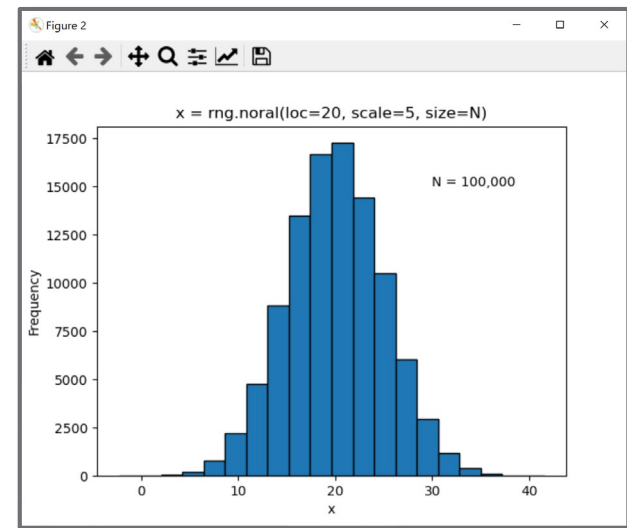
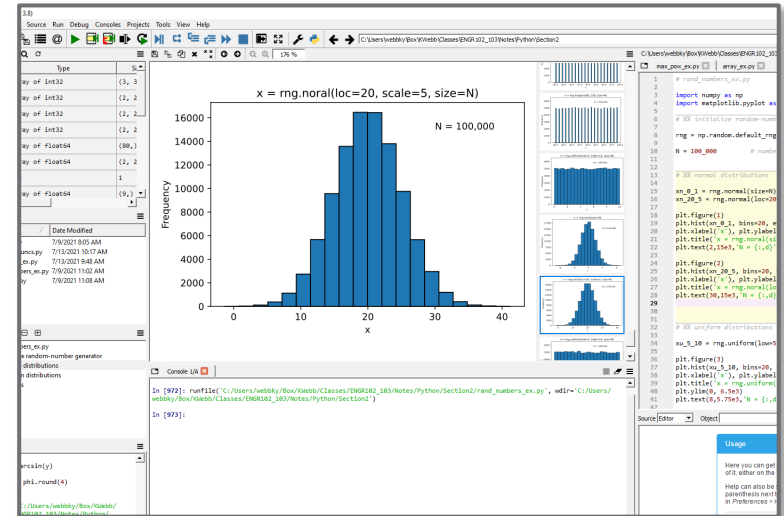
□ Two primary modes of displaying plots within Spyder:

□ **Inline**

- Plot pane docked in the Spyder interface
- Not interactive (cannot pan, zoom, measure, etc.)

□ **Automatic**

- Plots created in a separate window
- Interactive (can pan, zoom, measure, etc.)

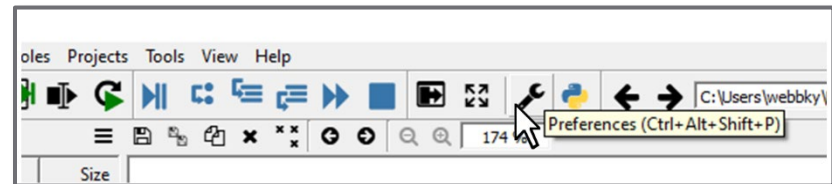


# Plotting In Spyder

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□ To switch between Inline and Automatic plotting:

▣ Preferences



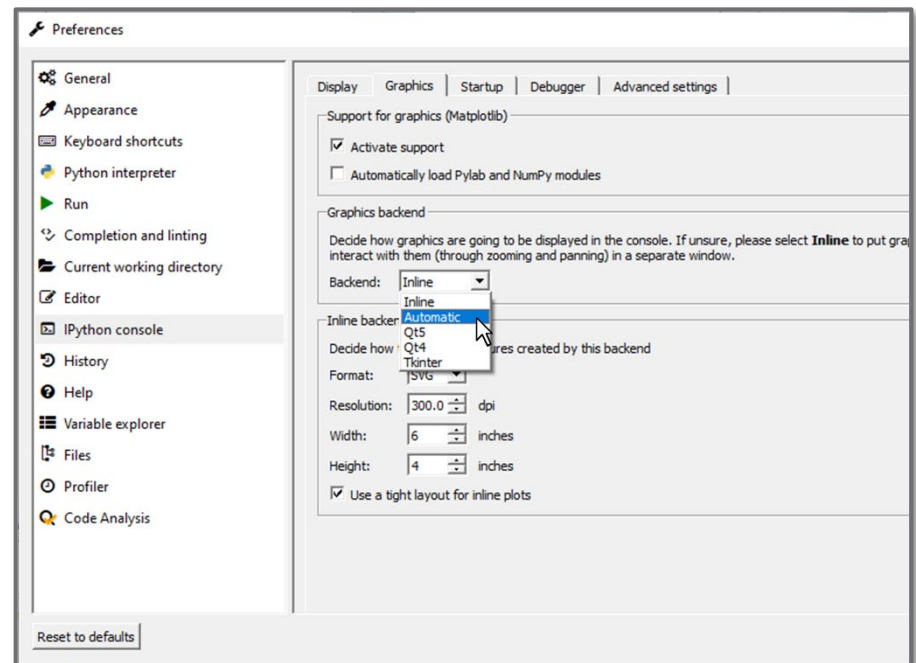
▣ IPython Console:

■ Graphics

■ Backend

■ Inline

■ Automatic

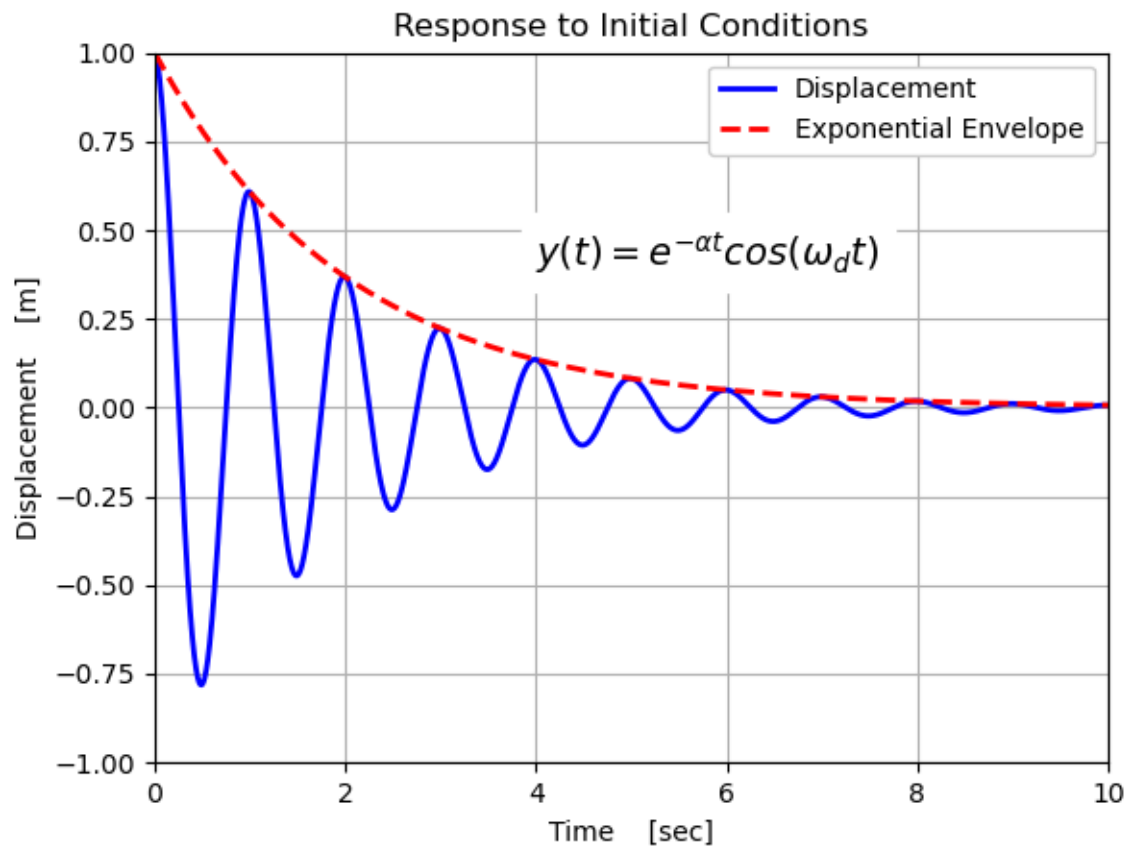


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# 2-D Line Plots

# Basic 2-D Plotting – `plt.plot()`

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# Basic 2-D Plotting – `plt.plot()`

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## □ Syntax:

```
plt.plot(x, y, fmt, **kwargs)
```

- `x`: *optional* – abscissa – horizontal-axis data
- `y`: ordinate – vertical-axis data
  - `x` and `y` are equal-length vectors
- `fmt`: *optional* – format specification string – defines:
  - Line type – e.g. solid, dashed, dotted
  - Line color
  - Marker shape – placed at each data point
- `**kwargs`: *optional* - arbitrary number of keyword/argument pairs, e.g.
  - `linewidth=2`
  - `markersize=8`



# plot() – fmt – Line Style

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```
plt.plot(x, y, fmt, **kwargs)
```

- Three components – ***line style, marker, color***
  - ▣ Each is *optional* – specify some or all
- ***Line Style*** specifiers:

Specifier	Line Style
' - '	Solid
' - - '	Dashed
' : '	Dotted
' - . '	Dash-dot

- Default is a solid line

# plot() – fmt – Marker

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## □ **Marker** specifiers:

### ▣ A partial list

Specifier	Marker
' + '	Plus sign
' o '	Circle
' * '	Asterisk
' . '	Point
' x '	Cross
' s '	Square
' d '	Diamond

Specifier	Marker
' ^ '	Upward-pointing triangle
' v '	Downward-pointing triangle
' > '	Right-pointing triangle
' < '	Left-pointing triangle
' p '	pentagon
' h '	hexagon

## □ Default is no marker

- ▣ Markers are placed at every data point – can get crowded for closely spaced data

# plot() – fmt – Line/Marker Color

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## □ **Color** specifiers:

Specifier	Color
'r'	Red
'g'	Green
'b'	Blue
'c'	Cyan

Specifier	Color
'm'	Magenta
'y'	Yellow
'k'	Black
'w'	White

## □ Default color is blue

- If multiple x,y pairs are specified in a single plot command, line/marker colors will cycle through automatically (white is skipped for white background)

# plot() - \*\*kwargs

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```
plt.plot(x, y, fmt, **kwargs)
```

- ***Keyword/value pairs*** – a few examples:
  - linewidth (lw): width of line – points
    - linewidth=2
  - markeredgecolor (mec): color of the marker or edge color for filled markers - a string
    - markeredgecolor='k'
  - markerfacecolor (mfc): face color of filled markers – a string
    - markerfacecolor='g'

# plot() - \*\*kwargs

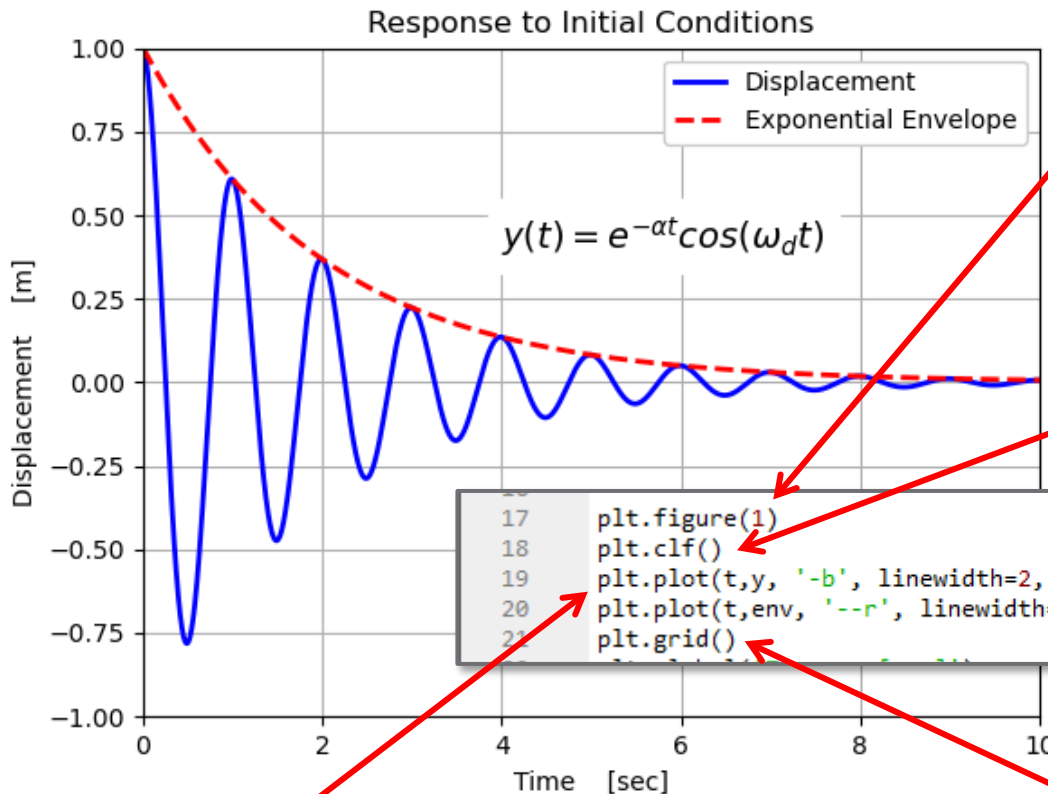
13

```
plt.plot(x, y, fmt, **kwargs)
```

- ***Keyword/value pairs*** – (continued):
  - ▣ `markersize (ms)`: size of markers – points
    - `markersize=8`
  - ▣ `label`: string attached to the plot that will be displayed in the legend
    - `label='displacement'`

# Using plot()

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`plt.figure(n)`

- Creates figure window

`plt.clf`

- Clears figure window
- Persistence/history/hold mode enabled by default

```
17 plt.figure(1)
18 plt.clf()
19 plt.plot(t,y, '-b', linewidth=2, label='Displacement')
20 plt.plot(t,env, '--r', linewidth=2, label='Exponential Envelope')
21 plt.grid()
```

`plt.plot()`

- Plots the data

`plt.grid()`

- Turns on grid lines

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# Plot Annotation

# Plot Annotation

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- **Title**

```
plt.title('string', **kwargs)
```

- **Axis labels**

```
plt.xlabel('string', **kwargs)  
plt.ylabel('string', **kwargs)
```

- **Text**

```
plt.text(x,y,'string', **kwargs)
```

- Text string printed at location (x,y) on the current figure axes

- **\*\*kwargs**

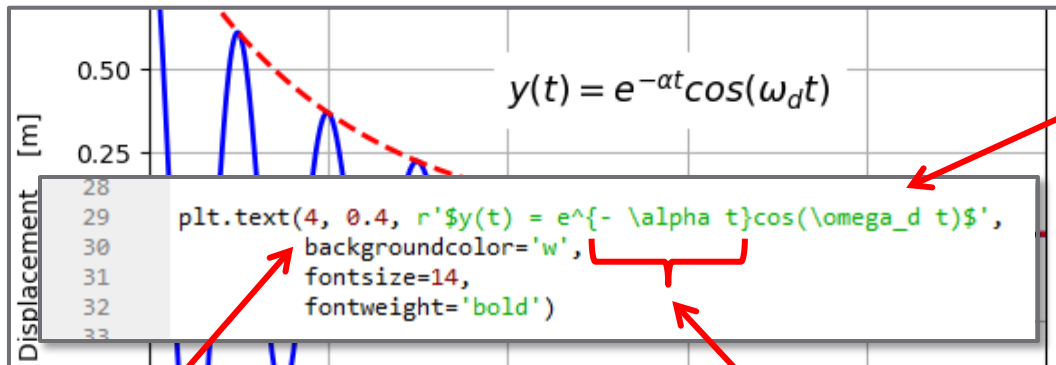
- Keyword/value pairs specifying text properties
- Common to all annotation functions
- For example: `color='r'`, `backgroundcolor='w'`, `fontsize=12`, etc.



# Plot Annotation – Mathematical Expressions

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- Matplotlib can interpret TeX character sequences
  - E.g. `\beta`, `\mu`, `\omega`, `\div`, etc.
  - Search Matplotlib documentation for ‘mathematical expressions’ for more information
  - Precede opening string quote with an `r` to create a **raw string**
  - Enclose mathematical expressions in dollar signs, `$ ... $`



## Subscript

- Underscore, `_`
- Enclose multiple characters in curly brackets, `{ ... }`

## BackgroundColor='...'

- Improves readability with gridlines

## Superscript

- Carrot, `^`
- Enclose multiple characters in curly brackets, `{ ... }`

# Plot Legend

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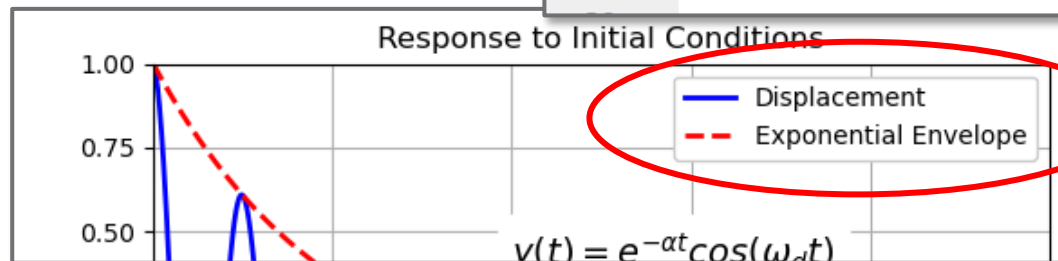
- Add a legend to a figure to identify multiple traces

```
plt.legend(**kwargs)
```

- **\*\*kwargs**: optional keyword/value arguments, e.g.:
  - `loc='best'`, `title='Damping Ratio'`, `fontsize=12`
- Legend labels defined by `label='...'` in `plt.plot()` commands

```
18 plt.clf()
19 plt.plot(t,y, '-b', linewidth=2, label='Displacement')
20 plt.plot(t,env, '--r', linewidth=2, label='Exponential Envelope')
```

```
33
34 plt.legend(loc='upper right', framealpha=1)
35
```



# plt.legend() - \*\*kwargs

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- A few useful keyword arguments:
- `loc='location string'`
  - ▣ Placement of legend box within the plot axes
  - ▣ Default: `loc='best'` – (placed to minimize overlap)
  - ▣ Can alternatively specify numeric location code
  - ▣ `'right'` and `'center right'` are the same

Location String	Location Code
'best'	0
'upper right'	1
'upper left'	2
'lower left'	3
'lower right'	4
'right'	5

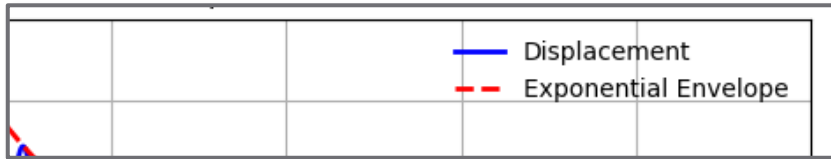
Location String	Location Code
'center left'	6
'center right'	7
'lower center'	8
'upper center'	9
'center'	10

# plt.legend() - \*\*kwargs

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- `framealpha= $\alpha$` 
  - Opacity of legend box background and frame
    - $\alpha=0$  - completely transparent background, no frame
    - $\alpha=1$  - completely opaque background, frame
  - Useful for blocking gridlines to improve readability
  - Default: `framealpha=0.8`

```
33  
34 plt.legend(loc='upper right', framealpha=0)  
35
```



```
33  
34 plt.legend(loc='upper right', framealpha=0.8)  
35
```



```
33  
34 plt.legend(loc='upper right', framealpha=1)  
35
```



# 2-D Line Plots

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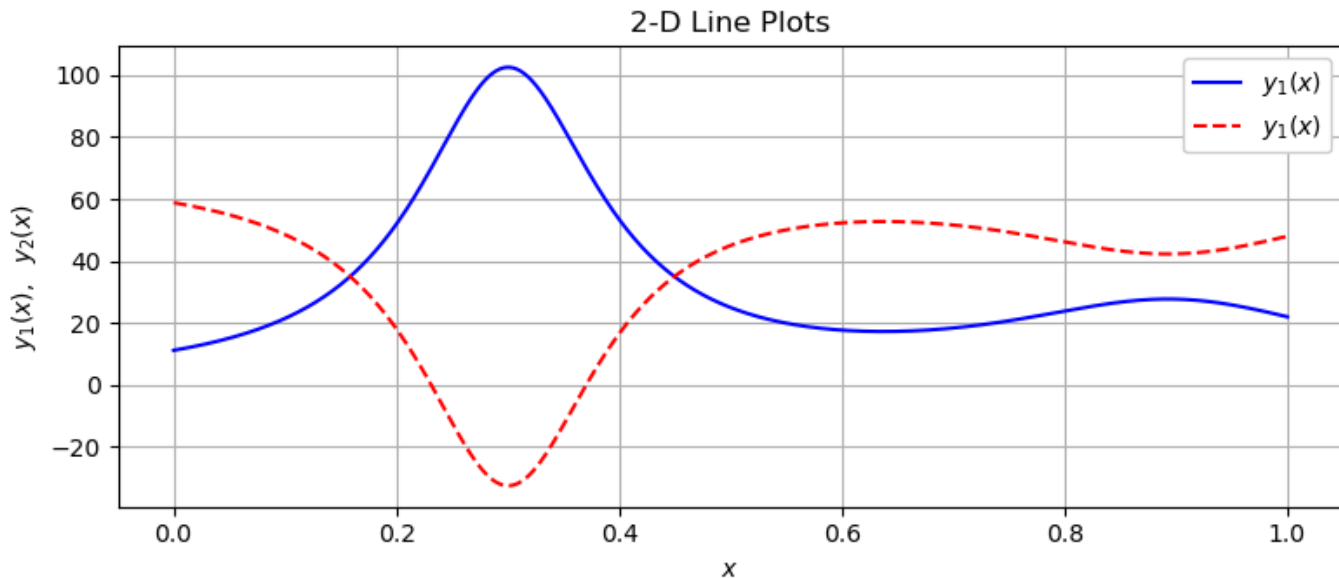
## Exercise

- Write a script to do the following:
  - ▣ Create and  $x$  vector from 0 to 1 with 2000 points
  - ▣ Create vectors  $y_1$  and  $y_2$ :

$$y_1 = \frac{1}{(x - 0.3)^2 + 0.01} + \frac{1}{(x - 0.9)^2 + 0.04}$$

$$y_2 = -y_1 + 70$$

- ▣ Create the following plot:



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# Subplots

# Subplots

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- Plot *multiple sets of axes* on a single figure

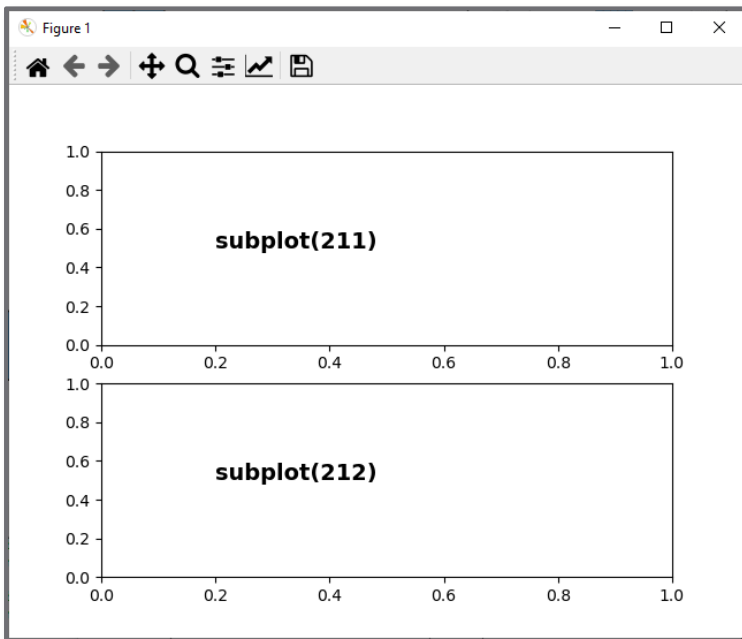
```
ax = plt.subplot(m,n,p)  
ax = plt.subplot(mnp)
```

- `m`: number of rows of axes in the figure window
  - `n`: number of columns of axes in the figure window
  - `p`: index of the currently active subplot – counted left-right, top-bottom
  - `ax`: *optional* – axis object pointing to the indexed axes
- `subplot` command activates the  $p^{\text{th}}$  subplot
    - All subsequent plotting/annotation commands issued to the active subplot
    - To plot to another subplot, call `subplot` again, with a new value for `p`

# Subplot Numbering

24

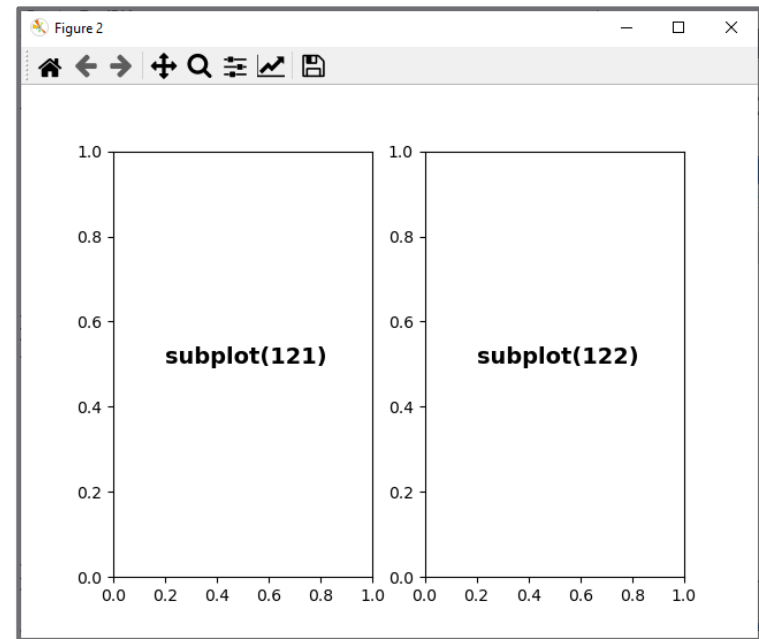
## □ 2 rows, 1 column



```
plt.figure(1); plt.clf()
ax1 = plt.subplot(211)
plt.text(0.2,0.5,'subplot(211)', fontsize=14, fontweight='bold')

ax2 = plt.subplot(212)
plt.text(0.2,0.5,'subplot(212)', fontsize=14, fontweight='bold')
```

## □ 1 row, 2 columns



```
plt.figure(2); plt.clf()
ax1 = plt.subplot(121)
plt.text(0.2,0.5,'subplot(121)', fontsize=14, fontweight='bold')

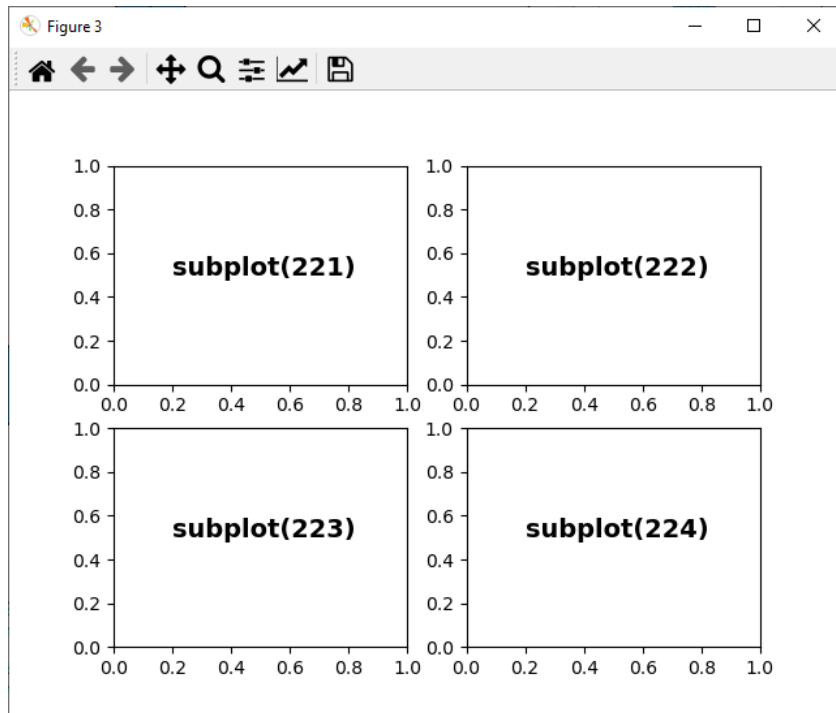
ax2 = plt.subplot(122)
plt.text(0.2,0.5,'subplot(122)', fontsize=14, fontweight='bold')
```



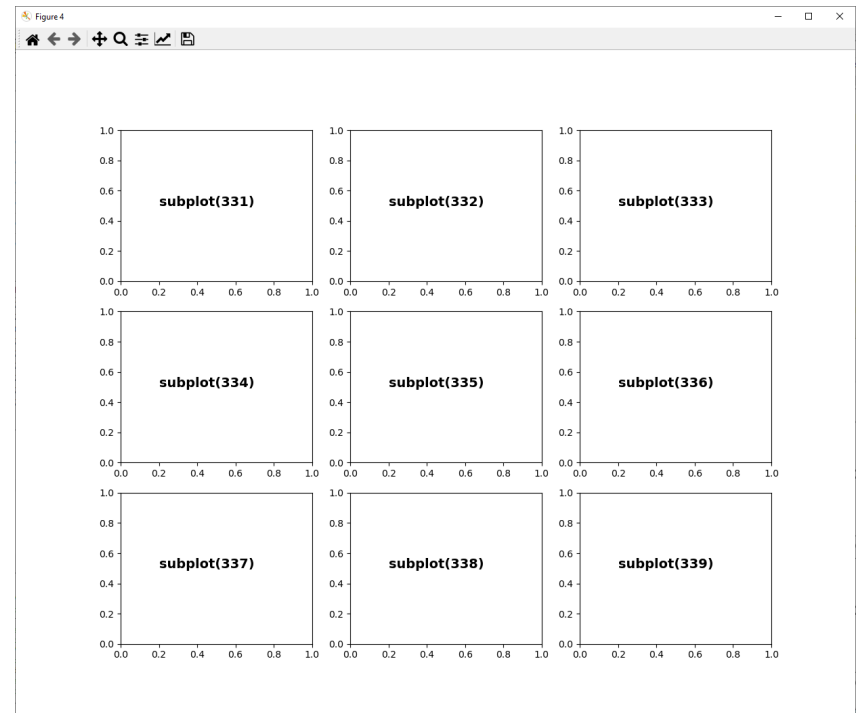
# Subplot Numbering

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□ 2 rows, 2 columns



□ 3 rows, 3 columns



□ Can have an arbitrary number of rows and columns

# Subplot Numbering

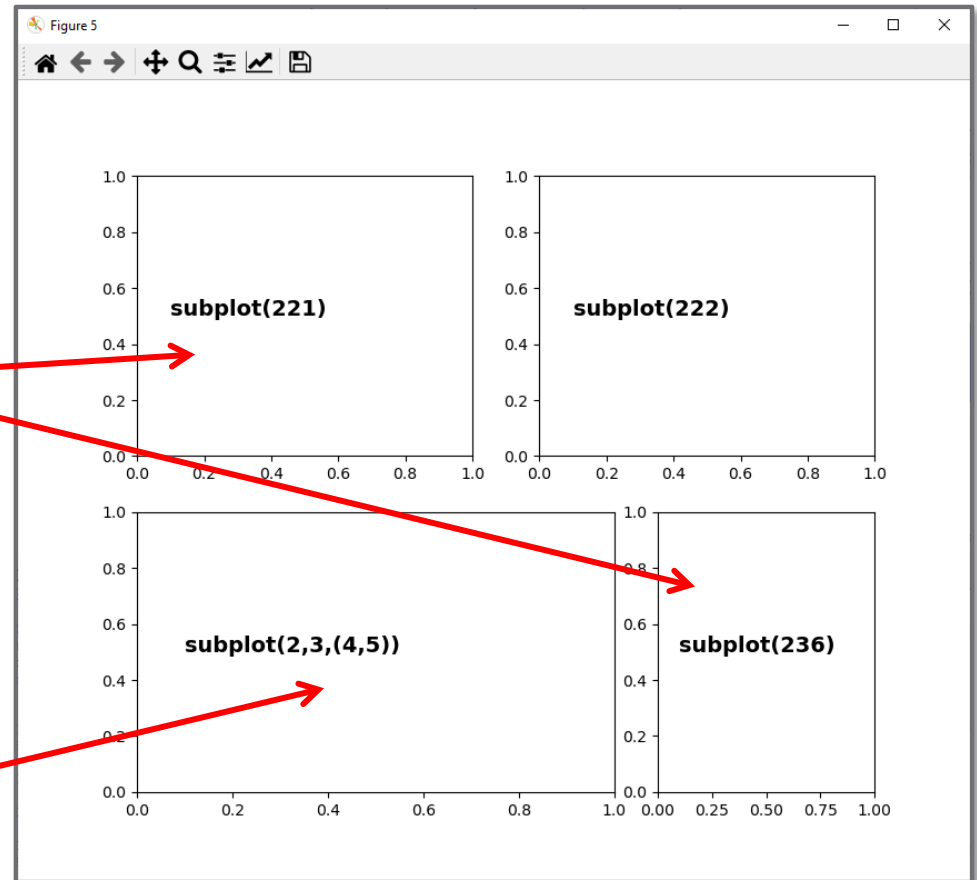
26

`subplot(m,n,p)`

- `m` and `n` can vary within a figure window

- `p` can be specified as a range using a tuple:

`subplot(m,n,(p1,p2))`



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# Axis Control

# Axis Scaling – `plt.xlim()`, `plt.ylim()`

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- Specify axis limits as positional arguments (args)

```
plt.xlim(xmin, xmax)  
plt.ylim(ymin, ymax)
```

```
25  
26 plt.xlim(0, 10)  
27 plt.ylim(-1, 1)  
28
```

- Or, specify limits as keyword arguments (kwargs)

```
plt.xlim(left=xmin, right=xmax)  
plt.ylim(bottom=ymin, top=ymax)
```

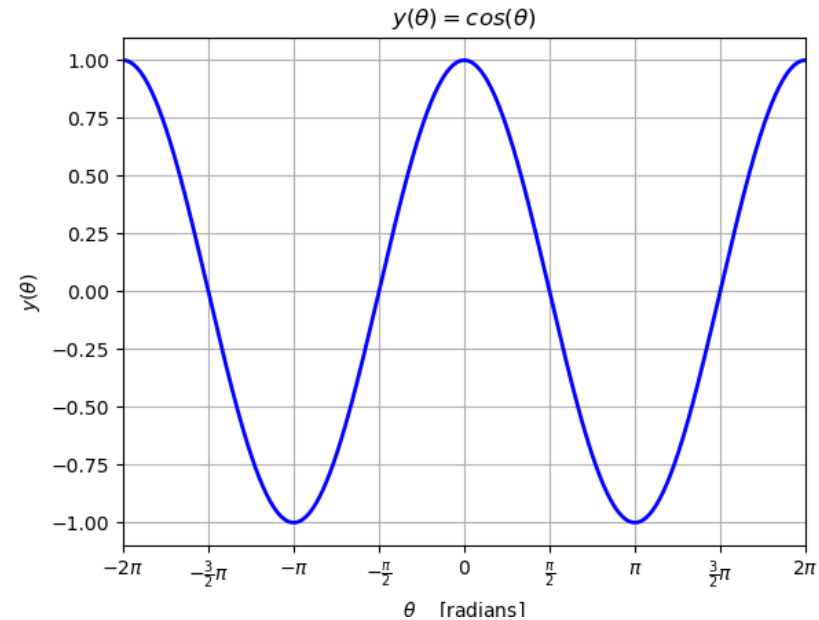
- Specify only one kwarg to allow for **autoscaling** of the other, e.g.:

```
plt.xlim(right=10e-3)  
plt.ylim(bottom=-12)
```

# Controlling Axis Tick Marks – `plt.xticks()`

29

```
8
9 plt.figure(1); plt.clf()
10 plt.plot(x,y, '-b', linewidth=2)
11 plt.grid()
12 plt.xlim(-2*np.pi, 2*np.pi)
13 plt.xlabel(r'$\theta$ [radians]')
14 plt.ylabel(r'$y(\theta)$')
15 plt.title(r'$y(\theta) = \cos(\theta)$', fontweight='bold')
16 plt.xticks(np.arange(-2*np.pi,2.5*np.pi,np.pi/2),
17            [r'$-2\pi$', r'$-\frac{3}{2}\pi$', r'$-\pi$',
18             r'$-\frac{\pi}{2}$', r'$0$', r'$\frac{\pi}{2}$',
19             r'$\pi$', r'$\frac{3}{2}\pi$', r'$2\pi$'])
20
```



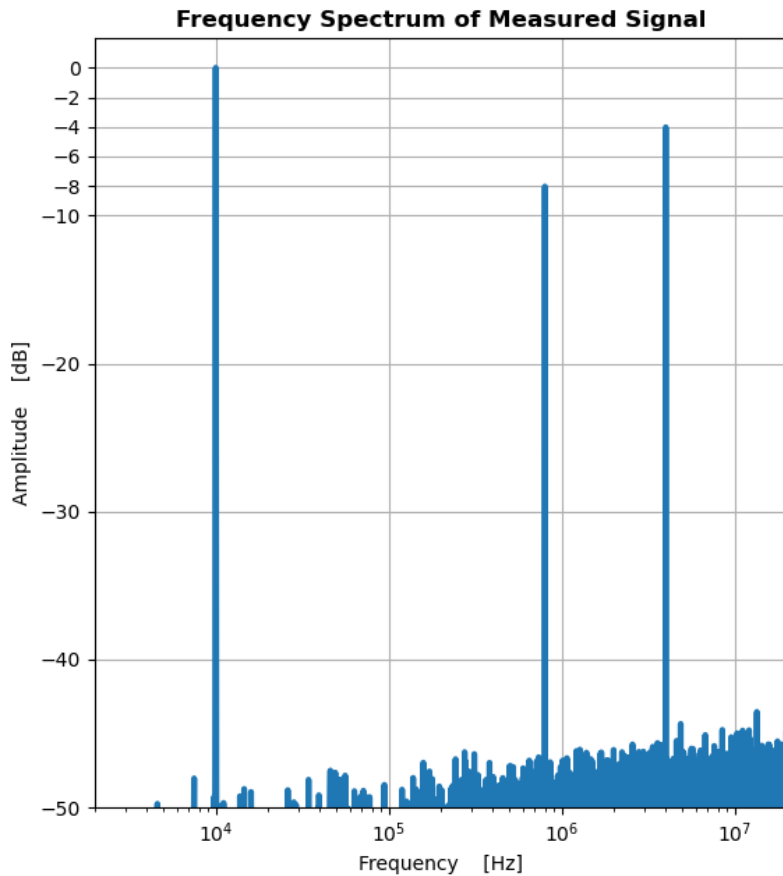
`plt.xticks(ticks, labels)`

- ▣ `ticks`: numeric tick locations
  - Array or list
- ▣ `labels`: text label at each tick
  - List of strings

- ▣ Interprets TeX characters
  - ▣ Raw strings – precede with `r`
  - ▣ Enclose in dollar signs, `$`

# Controlling Axis Tick Marks – `plt.yticks()`

30



```
56 plt.figure(2)
57 plt.clf()
58 plt.semilogx(f, V123dBnorm, linewidth=3)
59 plt.grid()
60 plt.xlabel('Frequency [Hz]')
61 plt.ylabel('Amplitude [dB]')
62 plt.title('Frequency Spectrum of Measured Signal',fontweight='bold')
63 plt.xlim(2e3, 20e6)
64 plt.ylim(-50, 0)
65 plt.yticks(np.concatenate((np.arange(-50, 0, 10), np.arange(-8, 2, 2))))
66
```

- Non-uniform tick spacing is allowed
- If labels are not specified, default (numeric) labels are placed at each tick mark

# Dual y-Axes – `plt.twinx()`

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- Plot with ***different y-axes on right and left sides of figure***

- Generate an axis object for the left-hand axis:

```
ax1 = plt.axes()
```

- Plot to the left-hand axis, generating a handle to the line for a legend creation:

```
line1, = plt.plot(t2/1e-6, vs2, '-b', linewidth=2, label='$v_s(t)$')
```

- Create a second (right-hand) y-axis, sharing a common x-axis:

```
ax2 = plt.twinx(ax1)
```

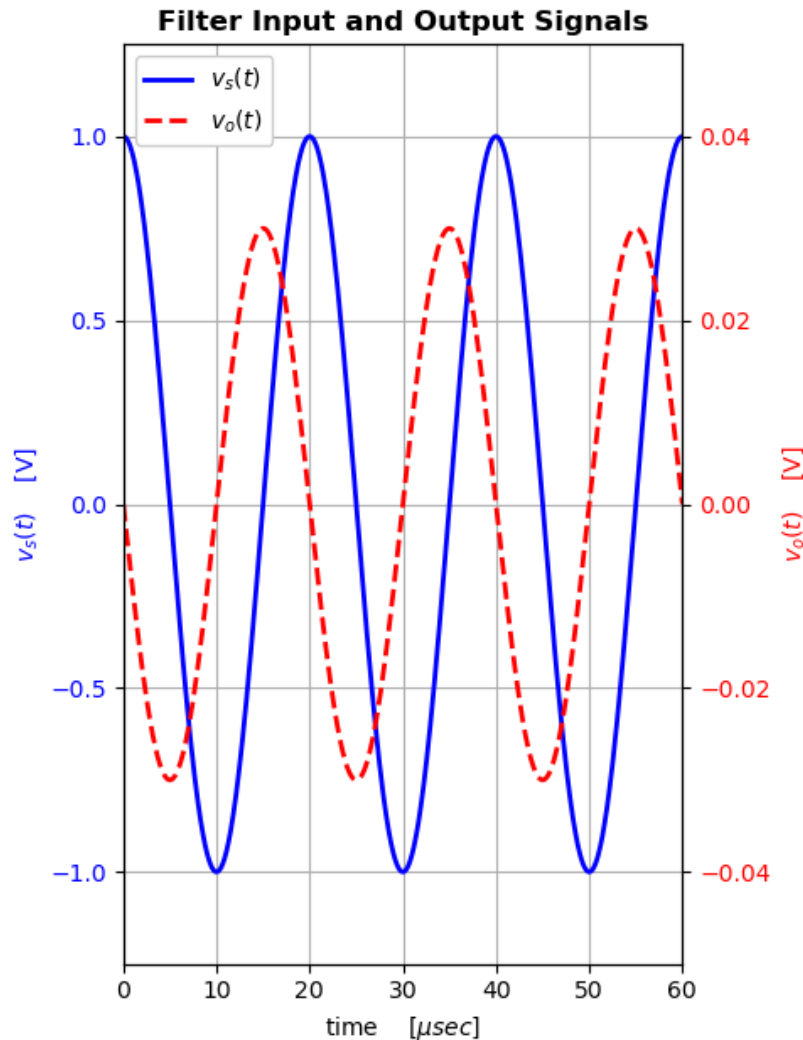
- Plot to the right-hand axis:

```
line2, = plt.plot(t2/1e-6, vo2, '--r', linewidth=2, label='$v_o(t)$')
```

- Use line handles to include all traces in a legend
- Can set colors of y-axis labels and ticks to match corresponding lines

# Dual y-Axes – `plt.twinx()`

32



```
24
25 fig1 = plt.figure(1)
26 plt.clf()
27
28 ax1 = plt.axes()
29 ▼ line1, = plt.plot(t2/1e-6,vs2,'-b',
30                    linewidth=2,
31                    label='$v_s(t)$')
32
33 plt.grid()
34 plt.ylabel('$v_s(t)$ [V]', color='b')
35 plt.ylim(-1.25, 1.25)
36 plt.yticks(color='b')
37 plt.xlabel('time [$\mu$ sec$]')
38
39 ax2 = plt.twinx(ax1)
40 ▼ line2, = plt.plot(t2/1e-6,vo2,'--r',
41                    linewidth=2,
42                    label='$v_o(t)$')
43
44 plt.ylabel('$v_o(t)$ [V]', color='r')
45 plt.ylim(-0.05, 0.05)
46 plt.yticks(color='r')
47
48 plt.xlim(0, np.max(t2)/1e-6)
49 ▼ plt.title('Filter Input and Output Signals',
50            fontweight='bold')
51
52 ▼ plt.legend(handles=[line1, line2],
53            loc=2, framealpha=1)
54
55 plt.tight_layout()
```



33

# More Plot Types

# Logarithmic Axes

34

- Useful for displaying datasets that span a very large range
- **Log-log plot** – both axes are logarithmic

```
plt.loglog(x, y, fmt, **kwargs)
```

- **Logarithmic X-axis**

```
plt.semilogx(x, y, fmt, **kwargs)
```

- **Logarithmic Y-axis**

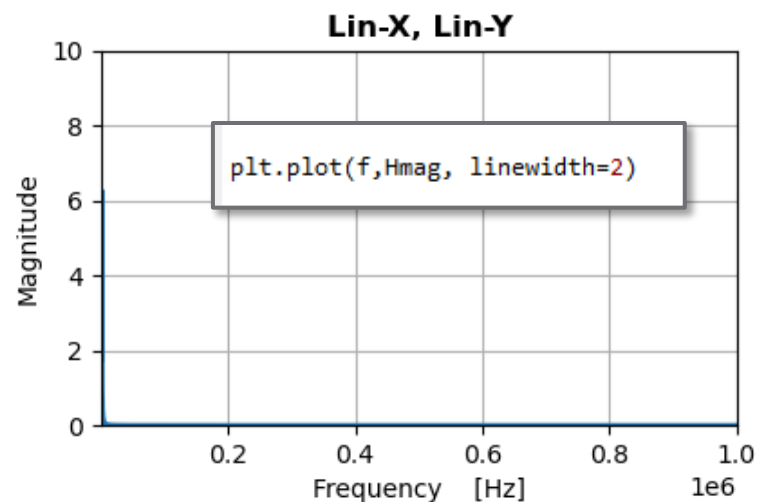
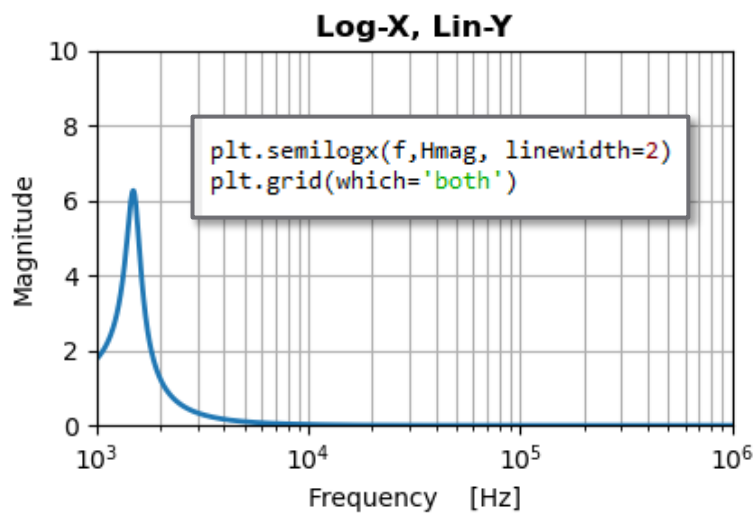
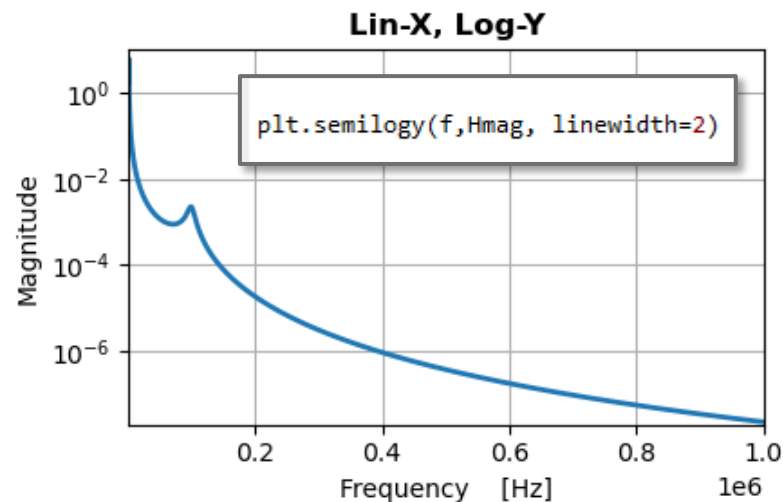
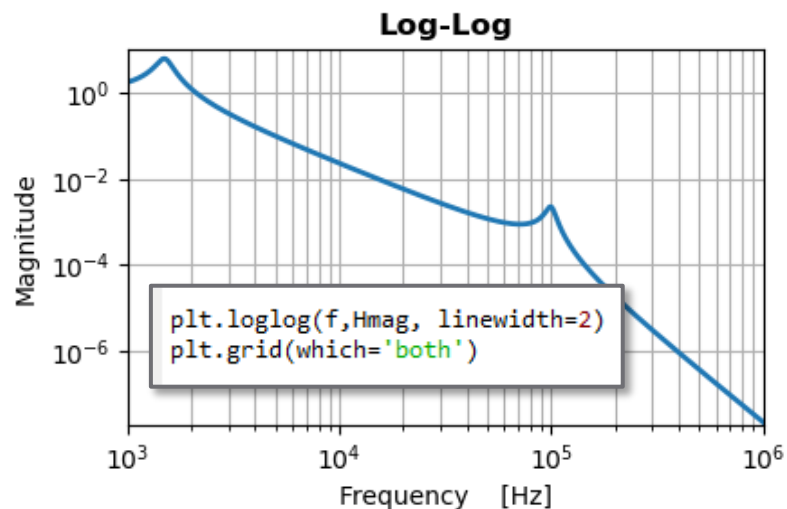
```
plt.semilogy(x, y, fmt, **kwargs)
```

- Generating ind. variable vector for log-x plots:

```
np.logspace(X1, X2, N)
```

# Logarithmic Axes

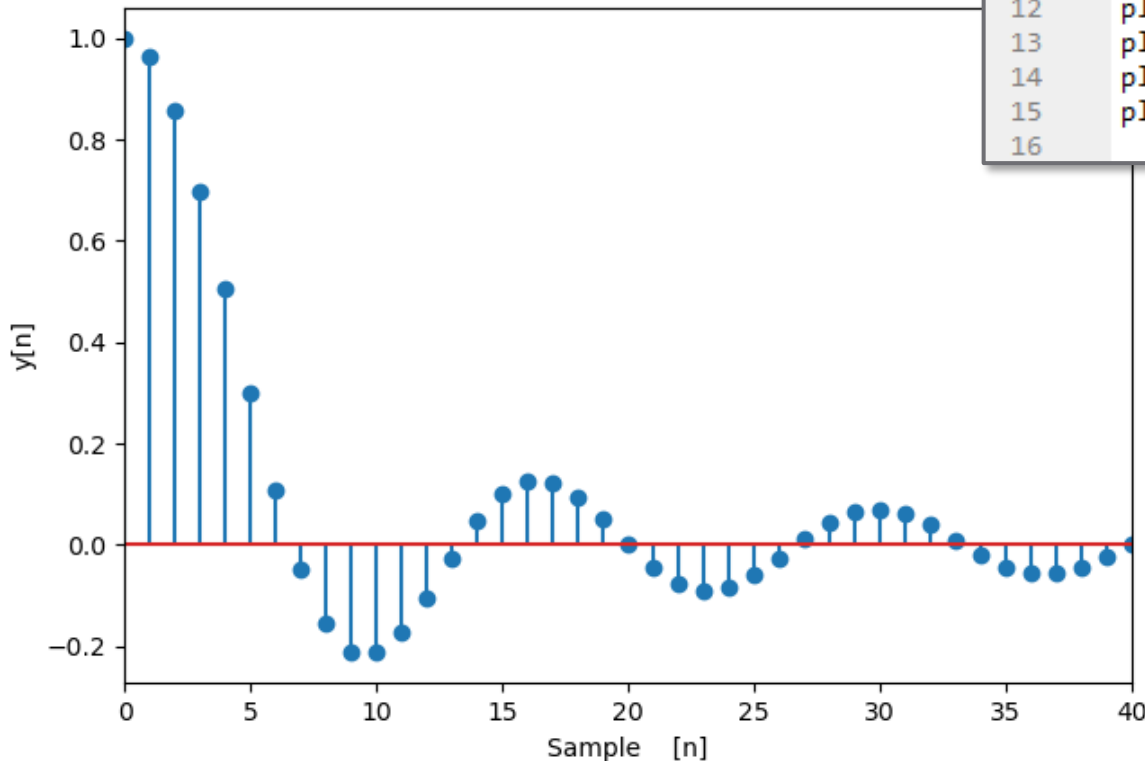
35



# Stem Plot – `plt.stem()`

36

`plt.stem(x,y)`



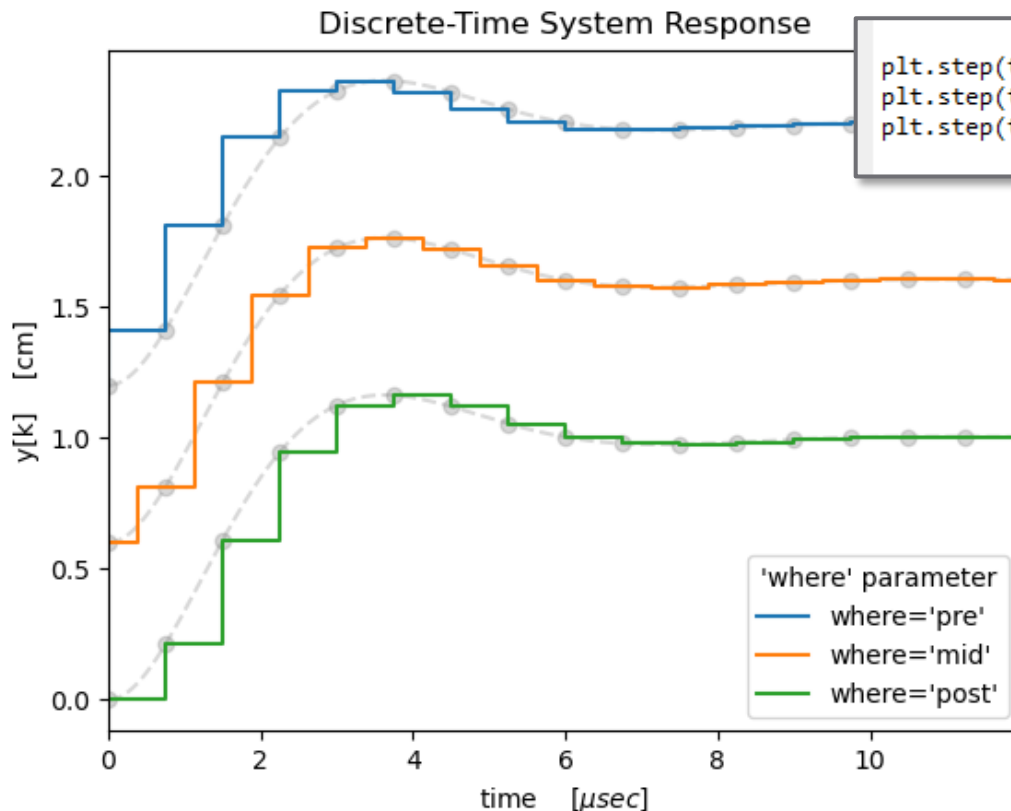
```
5
6  n = np.arange(41)
7
8  y = np.sinc(0.15*n)
9
10 plt.figure(1)
11 plt.clf()
12 plt.stem(n,y)
13 plt.xlabel('Sample [n]')
14 plt.ylabel('y[n]')
15 plt.xlim(min(n), max(n))
16
```

- Good for plotting discrete-time data
- ▣ E.g. digital control, signal processing applications

# Plotting Zero-Order-Hold Data – `plt.step()`

37

```
plt.step(x, y, where='pre', **kwargs)
```



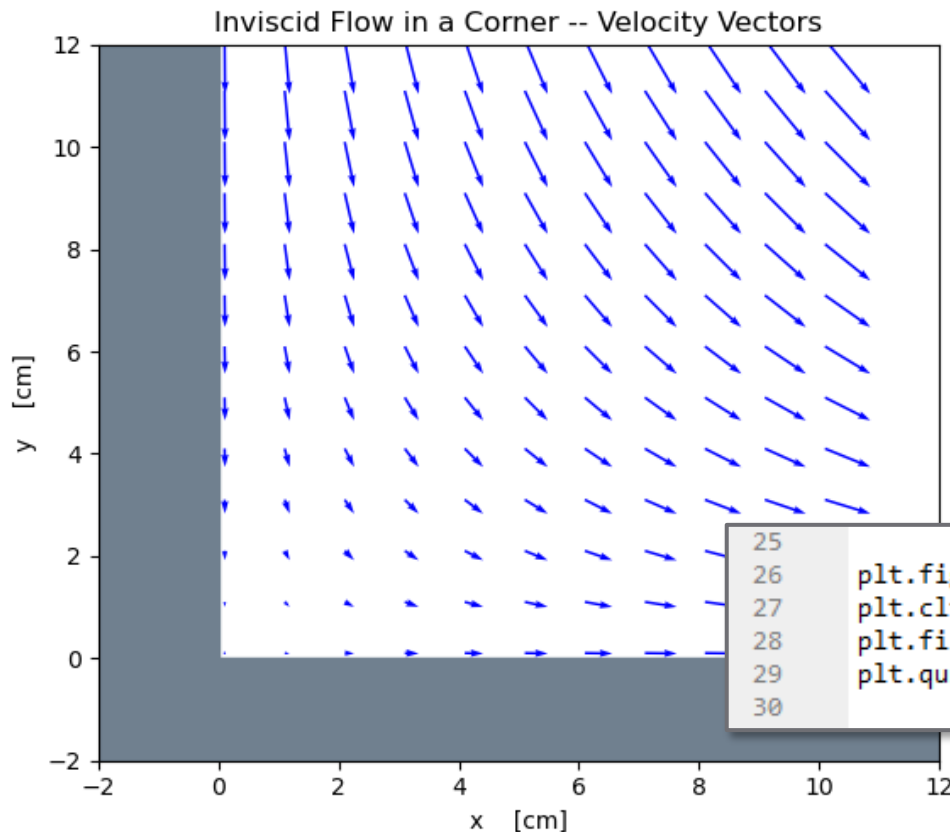
```
plt.step(td/1e-6, vod + 2*plt_off, label="where='pre'")  
plt.step(td/1e-6, vod + plt_off, where='mid', label="where='mid'")  
plt.step(td/1e-6, vod, where='post', label="where='post'")
```

- Again, useful for discrete-time applications
  - ▣ E.g. digital controls

# Plotting Vector Fields – `plt.quiver()`

38

```
plt.quiver(x, y, u, v, **kwargs)
```



- `x, y`: matrices of `x, y` coordinates – generate with `np.meshgrid()` – more later
- `u, v`: velocity components at `x, y` locations – matrices

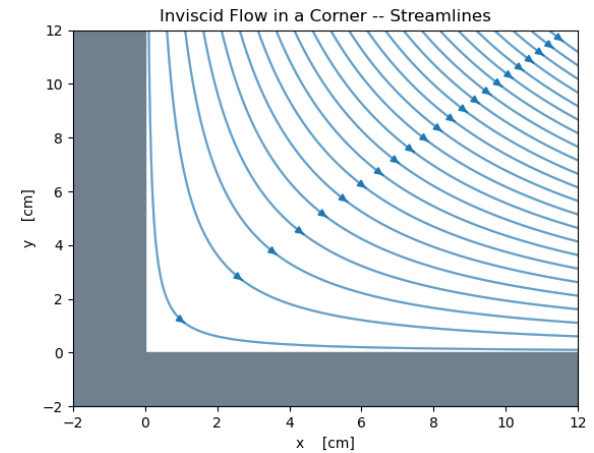
```
25  
26 plt.figure(1)  
27 plt.clf()  
28 plt.fill(xw,yw,color=(0.4375, 0.5, 0.5625))  
29 plt.quiver(xm,ym,vx,vy, units='dots', width=1.5, color='b')  
30
```

# Streamline Plots – `plt.streamplot()`

39

```
plt.streamplot(x, y, u, v,  
              density=den,  
              start_points=start)
```

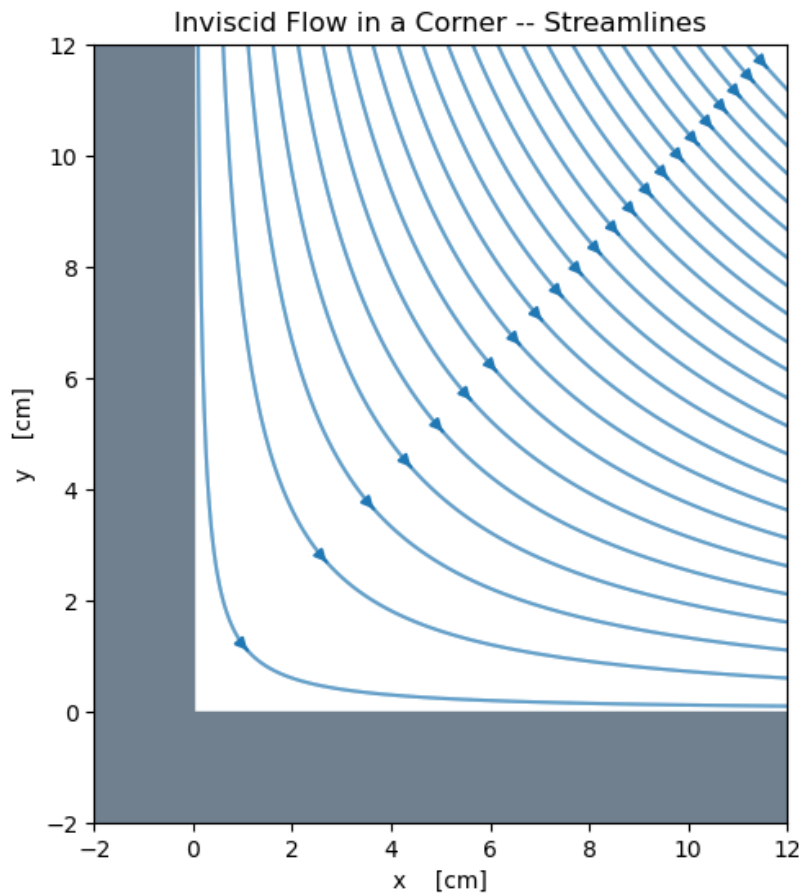
- ❑ `x, y, u, v`: same as for `plt.quiver()`
- ❑ `den`: *optional* - allowable density of streamlines – default: 1 – max. 30 lines in each direction
- ❑ `start`: 2 x N matrix of (x, y) starting coordinates for streamlines
- ❑ Streamlines will break to avoid exceeding density setting
  - ❑ Set density excessively high, e.g. `density=30`
  - ❑ Specify `start_points` to control number of gridlines, but have them be unbroken



# Streamline Plots – `plt.streamplot()`

40

```
plt.streamplot(x, y, u, v, density=den, start_points=start)
```



```
41 x = np.arange(0.1, 12.2, 0.5)
42 y = np.arange(0.1, 12.2, 0.5)
43 xm, ym = np.meshgrid(x, y)
44
45 # velocity components
46 vx = A*xm
47 vy = -A*ym
48
49 # start points for streamlines
50 start = np.array([xm[-1,:], ym[-1,:]])
51 start = start.T
52
53 # plot
54 plt.figure(2)
55 plt.clf()
56 plt.fill(xw,yw,color=(0.4375, 0.5, 0.5625))
57
58 plt.streamplot(xm, ym, vx, vy, density=50,
59               start_points=start)
60
61 plt.xlabel('x [cm]')
62 plt.ylabel('y [cm]')
63 plt.title('Inviscid Flow in a Corner -- Streamlines')
64 plt.xlim(-2, 12)
65 plt.ylim(-2, 12)
66
```



# Subplots

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## Exercise

- Save your script from the previous exercise to a new file
- Modify the script to produce the following figure
  - ▣ You may find the following useful:
    - `plt.suptitle(titlestr)`
    - `plt.tight_layout()`

