

Hands on OFDM crash course

(Orthogonal Frequency-division Multiplexing: standard modulation format for 5G New Radio)

"Preach the Gospel at all times. Use words if necessary."

St. Francis of Assisi

"Talk is cheap. Show me the code "

Linus Torvalds

“Simplicity is the ultimate sophistication.”

Leonardo da Vinci

You should always **submit a full set of slides**, regardless of the number of solved ones.

The **name of the presentation file** should look like this: Surname_First_NumerLastSolvedSlide, (do not use Polish letters), example "Zoladz_Miroslaw_50.pptx"

Organization, Materials content and modification

Most of the slides contain screenshots of the **scripts to be completed**.

Their **text versions** can be found in the appendix attached to the presentation.

The paths to the script files are given either directly **on the slide or in the slide notes**

Problem solutions should be placed **directly in the presentation**.

In the case of scripts, **screenshots of their solutions should be placed ON the task scripts**.

Screenshots should contain **ONLY code and line numbers**.

Please **don't** give **console screenshots** unless it is explicitly stated in the command.

Organization, Materials content and modification, cont.

In addition, please:

- **do not remove/move** any elements of the presentation, in particular slides,
- **do not remove my comments** from the code,
- **don't comment out lines** of code (either something is or isn't),
- **don't use** comprehension lists or maps, just plain for.

Please ask questions via chat or in a meeting, not on slides

Python tool

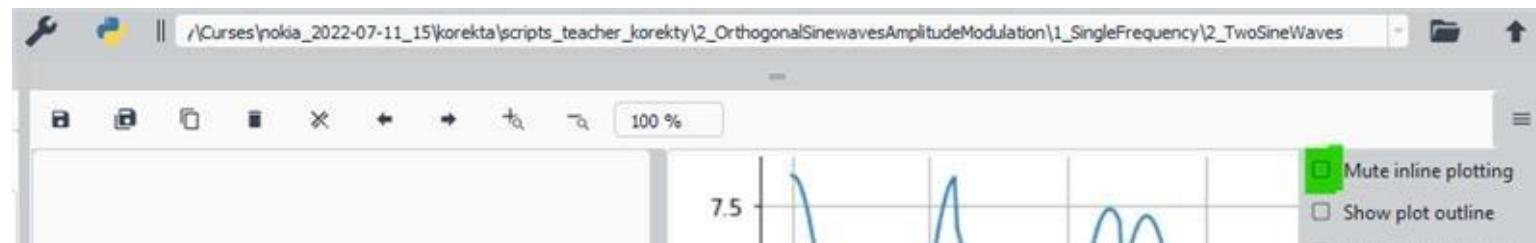
Preferred environment : <https://www.anaconda.com/products/distribution>

(Other tools allowed but we do not support you in case of problems)

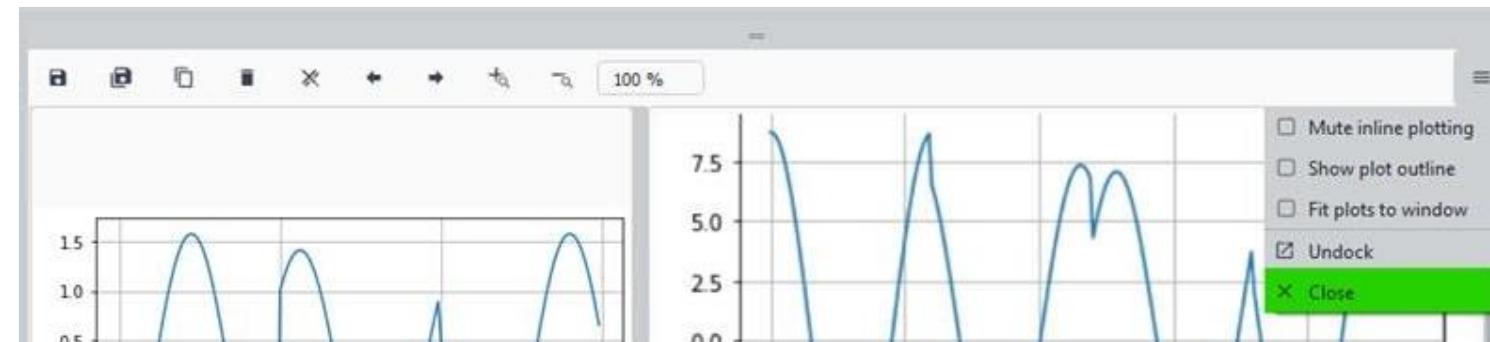
Preferred application: "Spider" (from Anaconda)

Preferred settings: Prints and pot in the same window:

1) Uncheck "Mute.."



2) Close all panels in Console



Useful shortcuts

Console clear: Ctrl-I

Code block commenting\uncommenting : select blok, press "ctrl-1"

1. Sinewaves orthogonality
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation

Dot product of vectors

Dot product of signals

Sum of periodical signals

Dot product of sinusoids

2D vectors

- Dot product formula
- Orthogonal examples
- Dot product vs. angle

Vector as a list of numbers

- 2D example
- 3D example

Vector as a signal - signal as a vector

Dot product of signals

Signal's similarity

Dot versus phase shift

Dot versus amplitudes

Interferences

Dot product formula

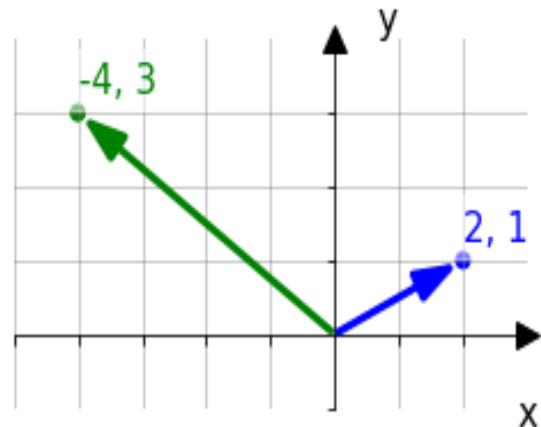
Vector coordinates: b (blue) = (x, y) ; g (green) = (x, y)

Product formula: $b \cdot g = (x \cdot x) + (y \cdot y)$;

input: vectors,

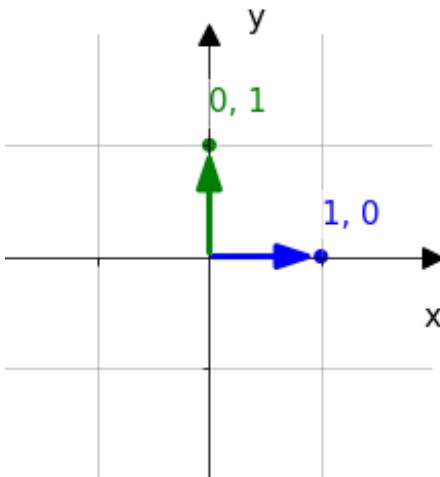
output: scalar <- sum of multiplication of corresponding coordinates

$$g = (-4, 3), \quad b = (2, 1)$$

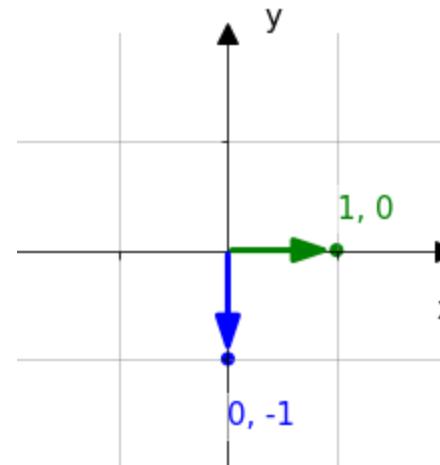


$$(-4, 3) \cdot (2, 1) = (-4 \cdot 2) + (3 \cdot 1) = -5$$

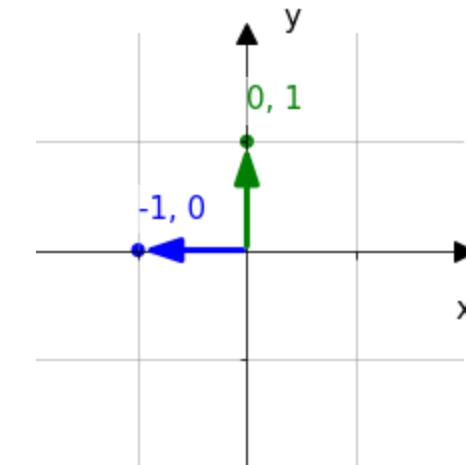
Dot Product: Orthogonal vectors examples



$$(x, y) * (x, y) = (0, 1) * (1, 0) = (0*1) + (1*0) = 0$$



$$(1*0) + (0*-1) = 0$$



$$(0*-1) + (1*0) = 0$$

In all cases dot product equals to zero.

Maybe because one of the corresponding coordinates is always zero ?

$$\begin{array}{r} 0, 1 \\ 1, 0 \\ \hline 0, 0 \end{array}$$

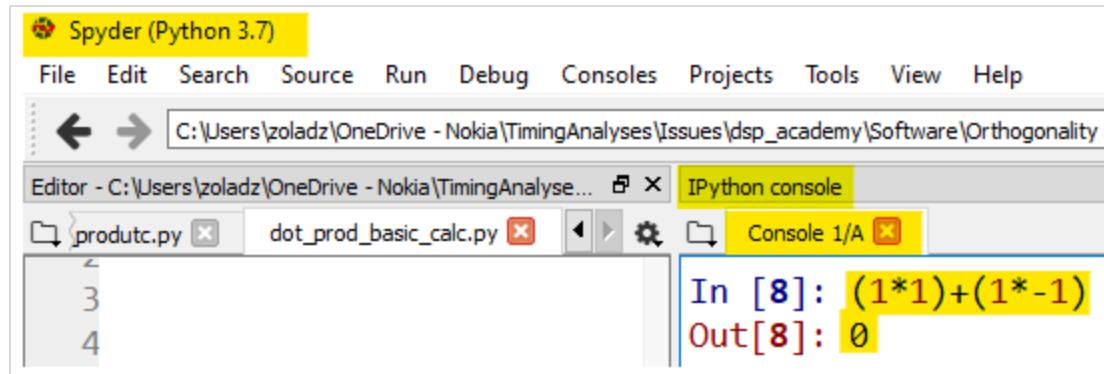
$$\begin{array}{r} 1, 0 \\ 0, -1 \\ \hline 0, 0 \end{array}$$

$$\begin{array}{r} 0, 1 \\ -1, 0 \\ \hline 0, 0 \end{array}$$

Dot Product: Orthogonal vectors examples: Nonzero coordinates

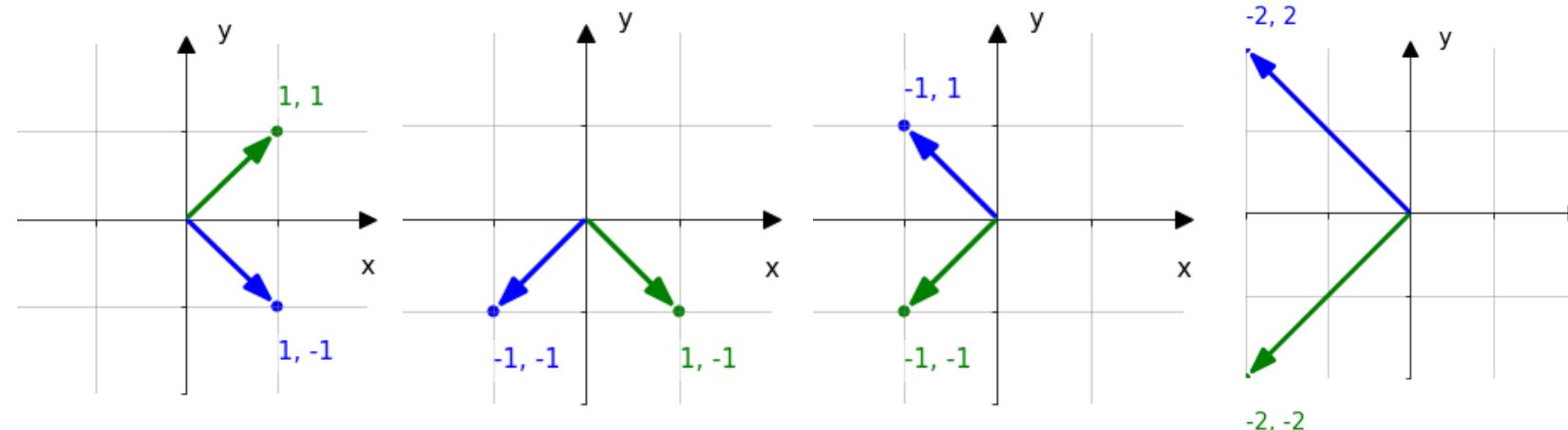
Calculate dot product of following vectors.

Use Spider REPL



```
Spyder (Python 3.7)
File Edit Search Source Run Debug Consoles Projects Tools View Help
C:\Users\zoladz\OneDrive - Nokia\TimingAnalyses\Issues\dsp_academy\Software\Orthogonality
Editor - C:\Users\zoladz\OneDrive - Nokia\TimingAnalyses\Issues\dsp_academy\Software\Orthogonality IPython console
produtc.py dot_prod_basic_calc.py Console 1/A
In [8]: (1*1)+(1*-1)
Out[8]: 0
```

REPL (stands from **R**ead–**E**val–**P**rint **L**oop),
A simple interactive computer programming environment that takes single user inputs, executes them, and returns the result to the user. [Wikipedia]



Calculations	$(1*1)+(1*-1)$	$(-1*1)+(-1*-1)$	$(-1*-1)+(1*-1)$	$(-2*-2)+(2*-2)$
result	0	0	0	0

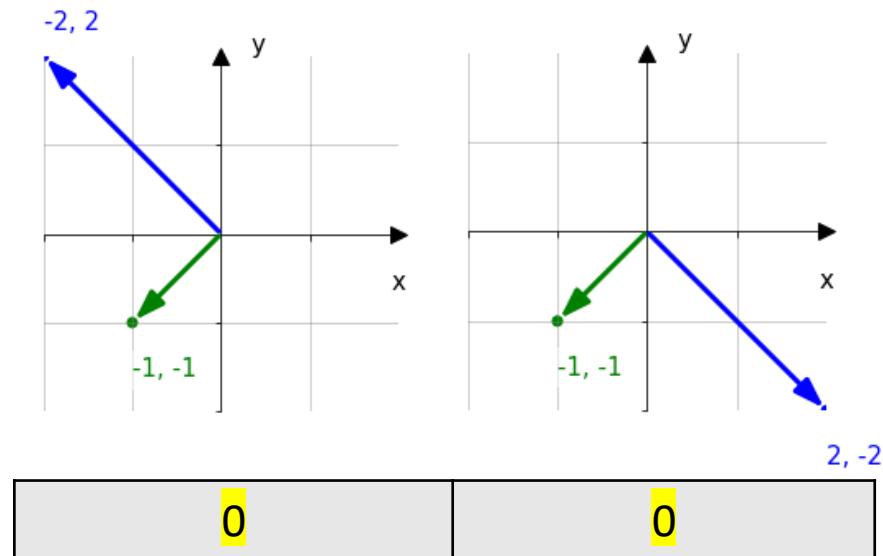
Still zero ? Maybe because we use the coordinates of the same absolute value (1 or 2)?

Dot Product: Orthogonal vectors examples: Nonzero coordinates, cont.

Calculate dot product of following vectors.

To work more efficiently instead of REPL use script on the right

Note: correct mistakes in dot product formula



Still zero ? Maybe because we use the same absolute value of a **single vector** coordinates (1 or 2)?

```
green_x = -1
green_y = -1

blue_x = -2
blue_y = 2

dot_product = (green_x+blue_y) * (green_y+blue_y)

print(dot_product)
```

Fix dot product formula
Run the script (F5)
Find result in console

A screenshot of a Jupyter Notebook interface. The script 'dot.py' is open in the editor. It contains the following code:

```
1 green_x = -1
2 green_y = -1
3
4 blue_x = -2
5 blue_y = 2
6
7 dot_product = (green_x green_y) (blue_x blue_y)
8
9 print(dot_product)
```

The 'Console 1/A' tab shows the output of the script. In cell 17, the code is run, and the result is 0. In cell 18, the code is run again, and the result is 0.

In [17]: r
zoladz/One
0

In [18]:

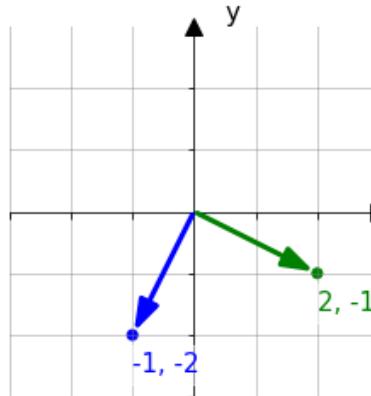
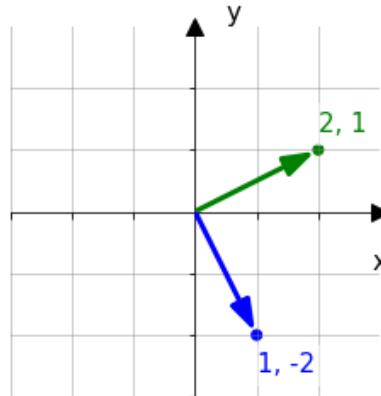
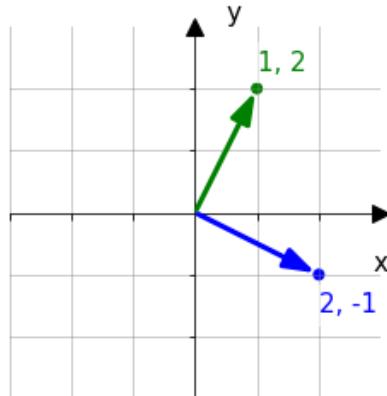
Dot Product: Orthogonal vectors examples: Nonzero coordinates, cont.

Calculate dot product of following vectors.

Use script with, more concise, vector coordinates notation (\rightarrow).

(Use the same file)

```
1 green = [1,2]
2 blue = [2,-1]
3
4 dot_product = (green[0]*green[1]) + (blue[0]*blue[1])
5 print(dot_product)
6
7
```



0	0	0
---	---	---

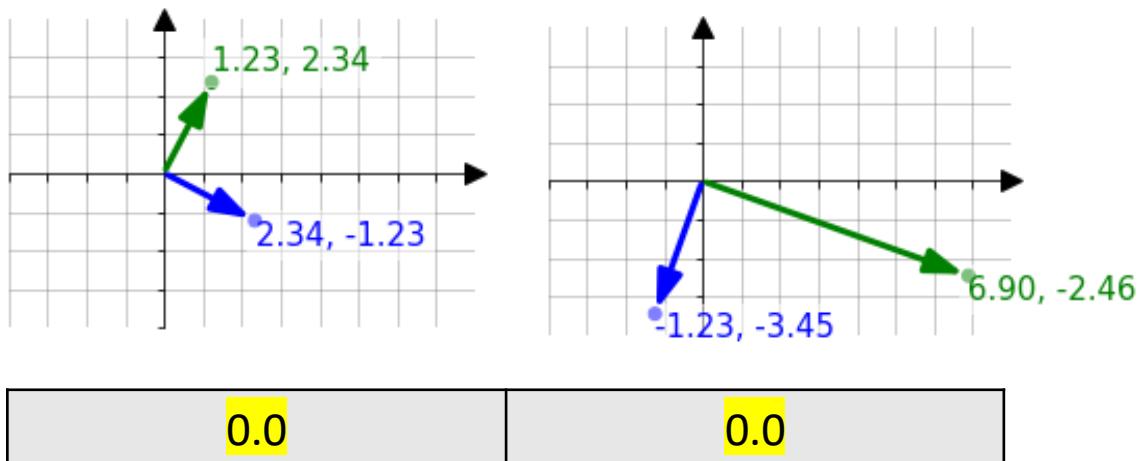
Still zero ? Maybe because we use integer coordinates?

Dot Product: Orthogonal vectors examples: Nonzero coordinates, cont.

1. Calculate dot product of following vector configurations.

Use script version with “for” loop for iteration through vector indices. In this case these are 0 and 1.

This code works for vectors of any length.



```
1 green = [1.23, -1.23]
2 blue = [-1.23, -2.46]
3
4 dot_product = 0
5 for i in range(len(green)): # i = 0,..len(green)-1
6     dot_product += green[i] * blue[i]
7
8 print(dot_product)
1_SinewavesOrthogonality\1_DotProductOfVectors\3_dot_calc_loop_usage.py
```

2. Avoid loop-ing by using “sum” function from

```
1 import numpy as np
2
3 green = np.array([1.23, -1.23])
4 blue = np.array([-1.23, -2.46])
5
6 dot_product = np.sum(green*blue)
7
8 print(dot_product)
1_SinewavesOrthogonality\1_DotProductOfVectors\3_dot_calc_sum_usage.py
```

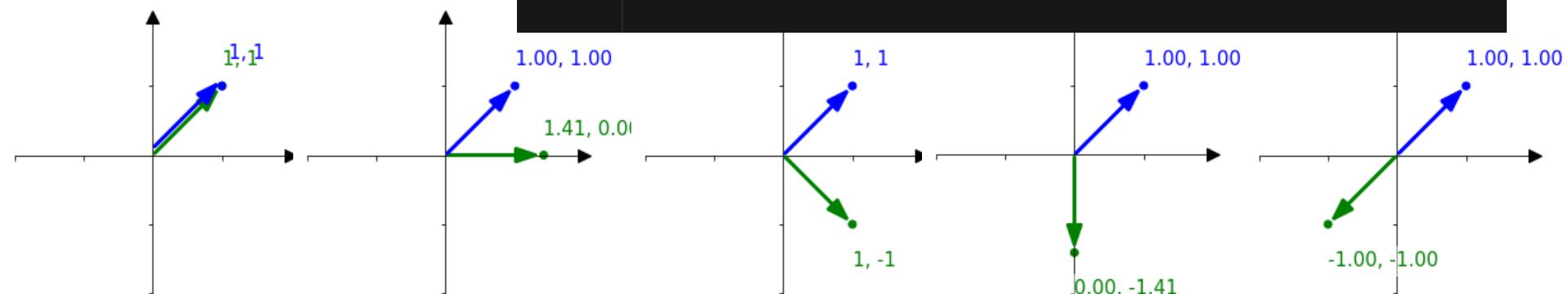
Evidently dot product of any perpendicular vectors equals to zero. How about other angles ?

Dot Product: Non orthogonal vectors examples

Calculate dot product for the selected angles between vectors.

Take advantage of “dot” function from “numpy” library

```
1 import numpy as np
2
3 green = [1,1]
4 blue = [1,1]
5
6 dot = np.dot(green, blue)
7 print(dot)
```



dot product	2	1.41	0	-1.41	-2.0
-------------	---	------	---	-------	------

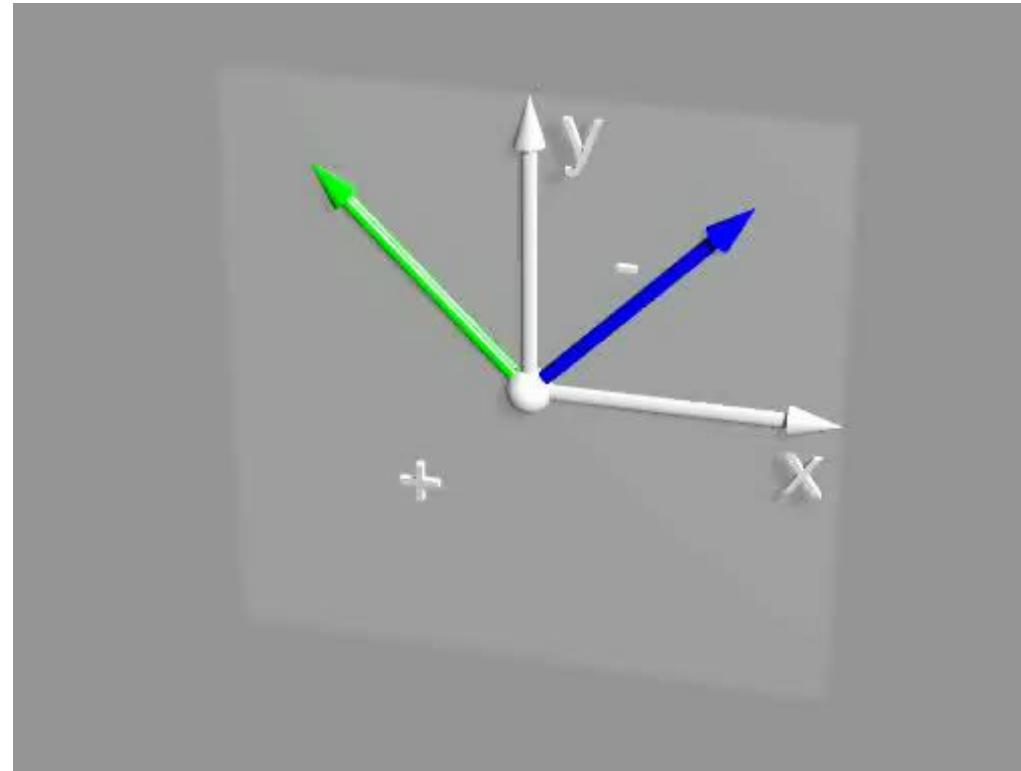
For which angle dot product has maximum value and for which a minimum value?

Maximum for 0 and minimum for 180 degrees between vectors

Dot Product: Non orthogonal vectors examples, cont.

Results from previous slide let us suppose that the **dot product** :

- takes its **maximum** when the vectors points at **same direction**,
- equals to **zero** when the vectors are **orthogonal**
- takes its **minimum** when the vectors points at the **opposite direction**.



Click to play

Dot Product v.s. vectors angle

Print dot product between **green** and **blue** vector for 360° angle range with 10° steps.

Assume that **green** vector is fixed at $[0,1]$ and **blue** vector rotates.

Expected result

```
000: +1.000
010: +0.985
020: +0.940
...
360: +1.000
```

```
1 import numpy as np
2 import math
3
4 green = [0,1]
5 usage
6
7 def rotate_vector(vector, angle):
8     rad_angle = np.radians(angle)
9     x = vector[0] * math.cos(rad_angle) - vector[1] * math.sin(rad_angle)
10    y = vector[0] * math.sin(rad_angle) + vector[1] * math.cos(rad_angle)
11    vector_rotated = np.array([x, y])
12    return vector_rotated
13
14 for i in range(0,370,10):
15     blue = rotate_vector(green, i)
16     dot_product = np.dot(green, blue)
17     dot_rounded = np.round(dot_product, decimals=10)
18     print(f'{i:03d}:{dot_rounded: +0.3f}')
```

000:+1.000
010:+0.985
020:+0.940
030:+0.866
040:+0.766
050:+0.643
060:+0.500
070:+0.342
080:+0.174
090:+0.000
100:-0.174
110:-0.342
120:-0.500
130:-0.643
140:-0.766
150:-0.866
160:-0.940
170:-0.985
180:-1.000
190:-0.985
200:-0.940
210:-0.866
220:-0.766
230:-0.643
240:-0.500
250:-0.342
260:-0.174
270:-0.000
280:+0.174
290:+0.342
300:+0.500
310:+0.643
320:+0.766
330:+0.866
340:+0.940
350:+0.985
360:+1.000

Auxiliary examples (not solution for task)

```
# Using "range" function and "for" loop
# for iterating from 5 to 110 with step 7.
for i in range(5,110,7): # yes, 110
    print(i)

# Scaling above range to range (0,1)
# just to have number with decimal point.
print(i, ' : ', (i-5)/(110-5))

# Using f-strings to control "numbers format".
# Replaces 1b
print(f'{i:03d}: {(i-5)/(110-5) :+0.3f}')
```

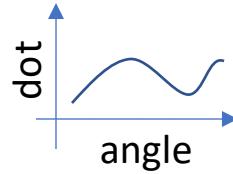
```
# Rotating vector by 45 deg
# by using function "rotate_vector"

from mylib import rotate_vector

vector = [0,1]
rot_vector= rotate_vector(vector,45)
print(rot_vector)
```

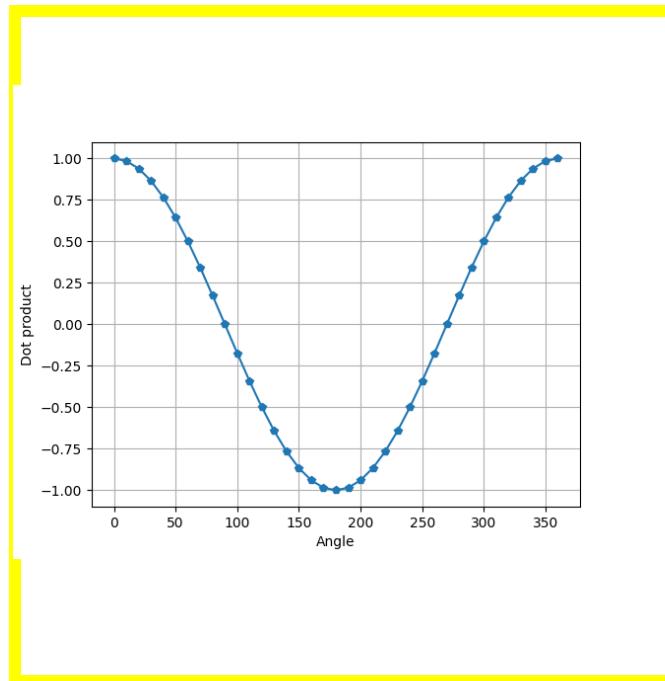
Dot Product v.s. vectors angle, cont.

“Replace” printing from previous slide with plotting.



8_dot_calc_angle_range_plot.py

```
1 import matplotlib.pyplot as plt
2 import numpy as np
3 from mylib import rotate_vector
4 v = np.array([0, 1])
5
6 angle_list = []
7 dot_list = []
8
9 for angle in range(0,370,10):
10     angle_list.append(angle)
11     v_rot = rotate_vector(v, angle)
12     dot = np.sum(v_rot*v)
13     dot_list.append(dot)
14
15 plt.plot(*args: angle_list, dot_list, '-p')
16
17 plt.xlabel("Angle")
18 plt.ylabel("Dot product")
19
20 plt.grid()
21 plt.show()
```



Auxiliary examples (not solution for task)

7_list_example.py

```
# Generating copy of list "w"
1 v = [1,3,6,7]
2
3 w = list()
4 for i in v:
5     w.append(i)
6
7 print(w)
```

6 plot example.py

Drawing plot

```
import matplotlib.pyplot as plt
v = [1,3, 6, 7]
w = [1,9,36,49]
plt.plot(v, w, '-p')
plt.xlabel('V')
plt.ylabel('W')
plt.grid()
```



1. Sinewaves orthogonality
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2D vectors

- Dot product formula
- Orthogonal examples
- Dot product vs. angle

Vector as a list of numbers

- 2D example
- 3D example

Vector as a signal - signal as a vector

Dot product of signals

Signal's similarity

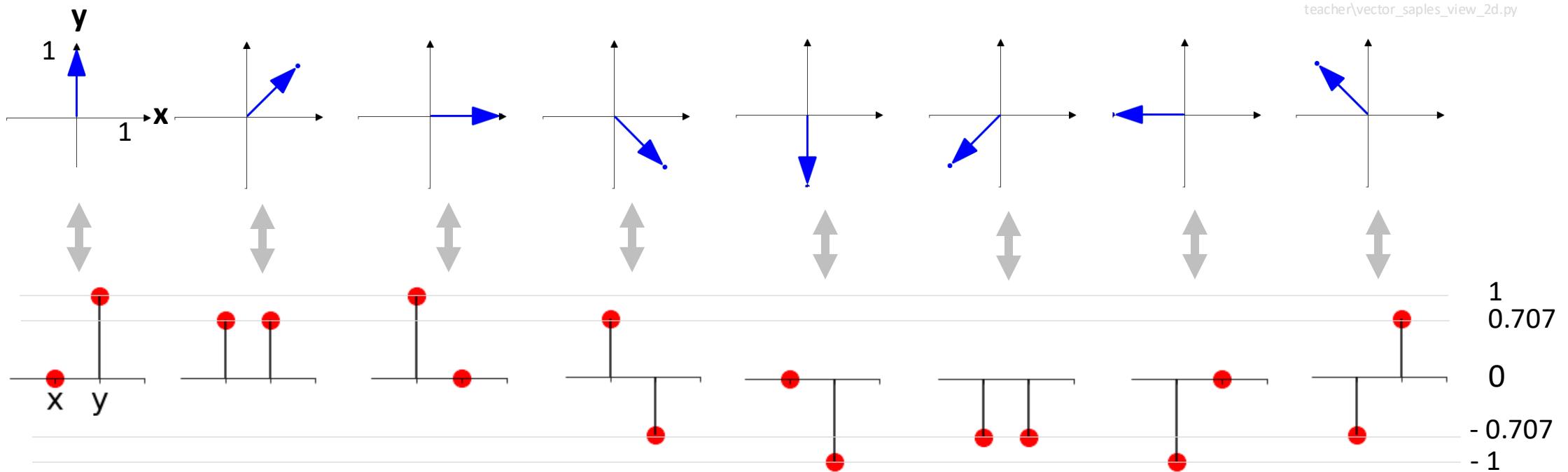
Dot versus phase shift

Dot versus amplitudes

Interferences

Vector as a list of numbers: 2D example

2D vector can be presented on a single axis as a **list of values**



Vector as a list of numbers: 2D example, cont.

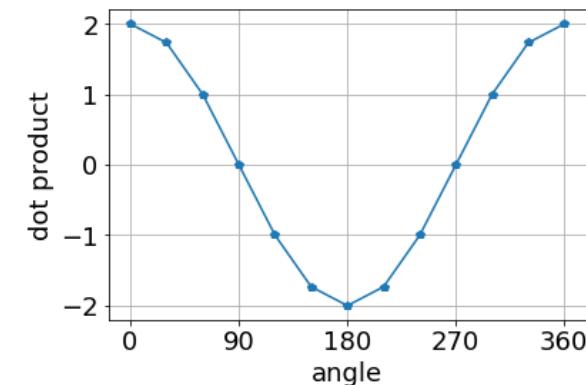
Find vectors orthogonal to vector A

vector A	Orthogonal	Orthogonal	Antiparallel
4	7	1	6
8	5	3	2

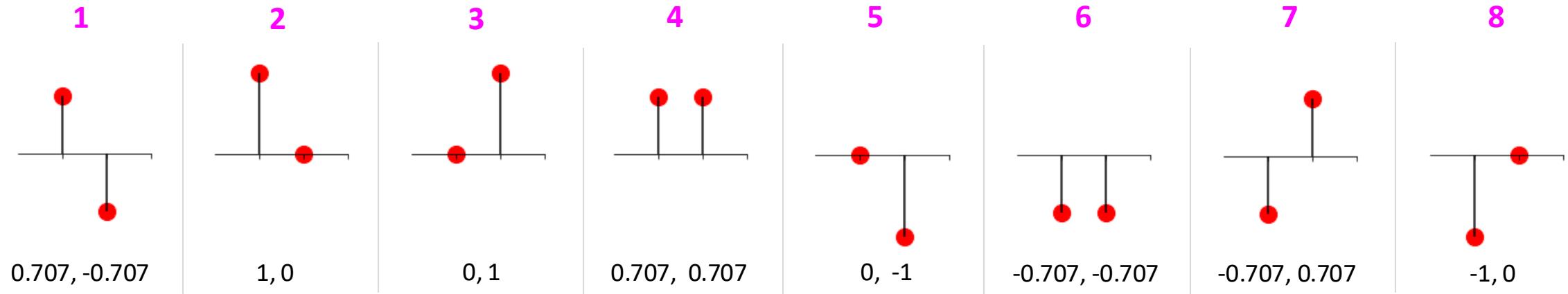
Replace question marks with vector **index**.

Use REPL or script

cheat sheet

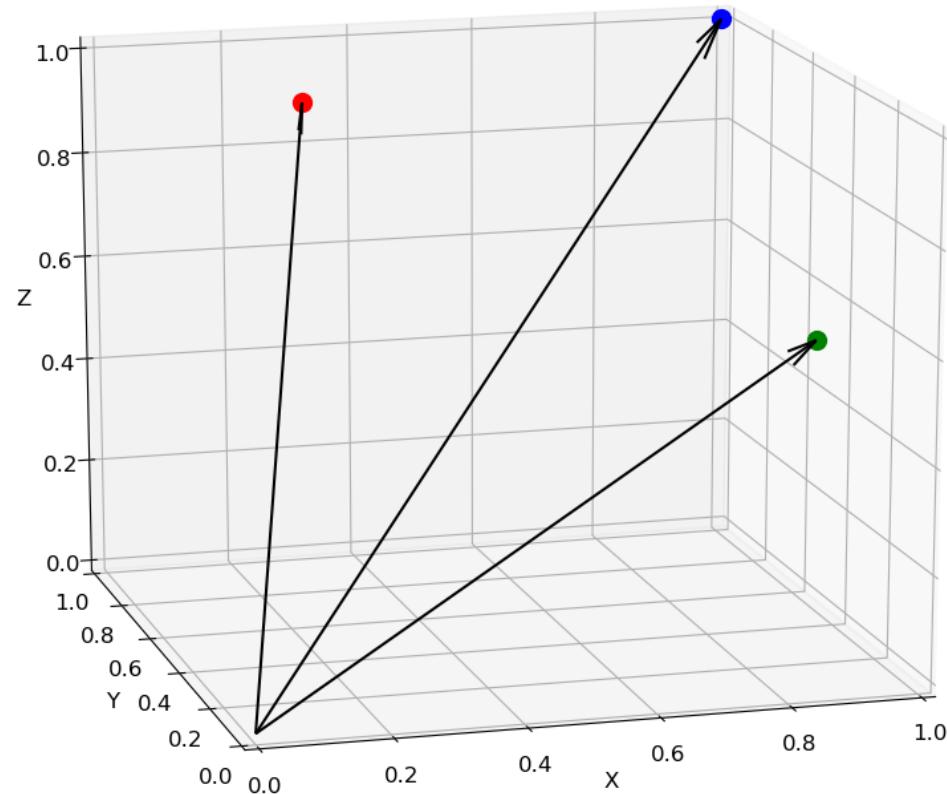


teacher\aux_dot_calc_angle_range_plot.py

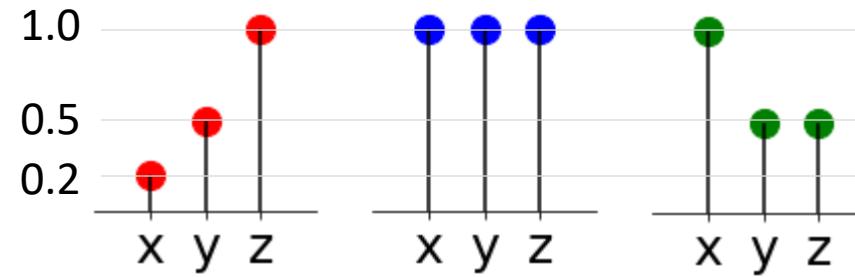


Vector as a list of numbers: 3D example

Also, **3D vector** can be presented on a **single axis**.



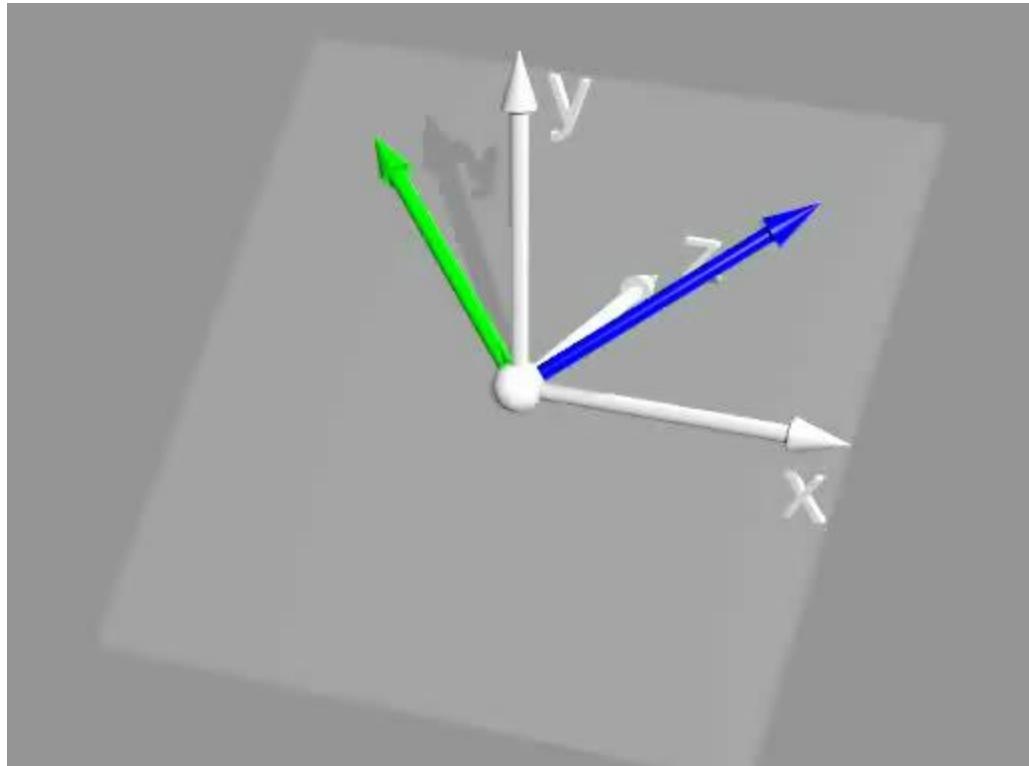
Teacher\vector_3d_cartesian_view.py



Vector as a list of numbers: 3D example, cont.

As in case of 2D vectors a **dot product** allows to check how two 3D vectors are oriented towards each other (parallel, antiparallel, orthogonal and so on)

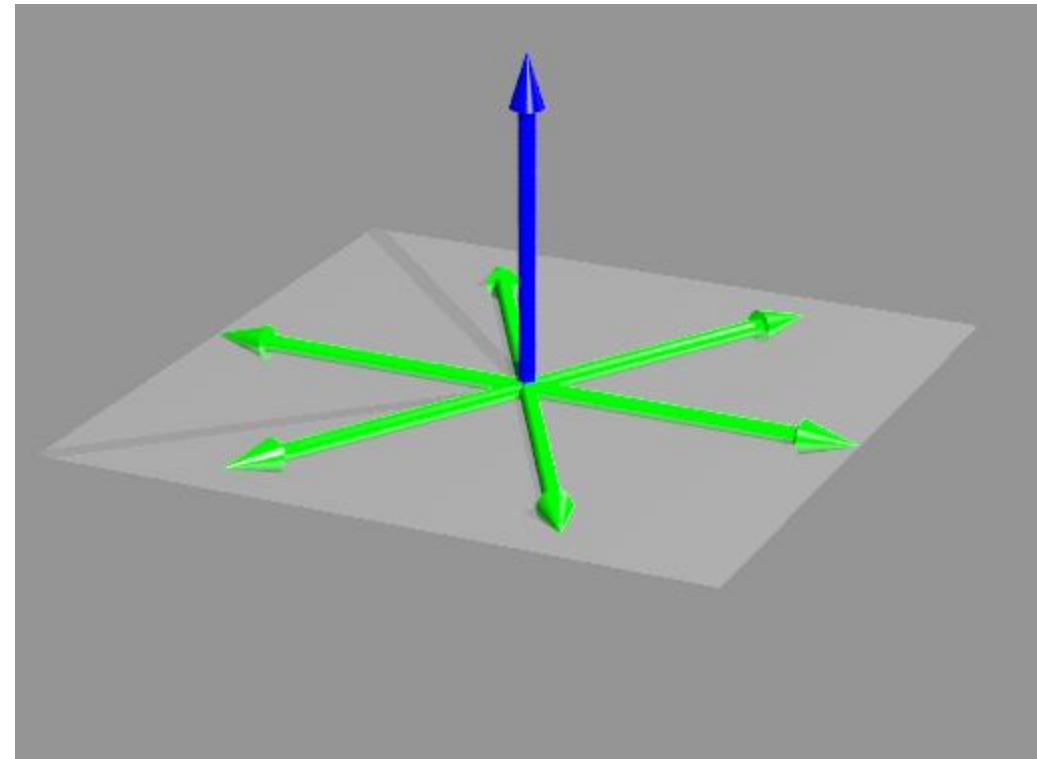
Click to see how does dot product “work” for 3D vectors



3d_vect_dot.pov

© 2022 Nokia

Unlike the 2D vector, the specified **3D vector** can have an **infinite number of orthogonal vectors**



3d_vect_dot_infit_othog.pov

NOKIA

1. **Sinewaves orthogonality**
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2D vectors

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Vector as a signal - signal as a vector

In fact, any **list of values** (scalars) can be considered **a vector in a space**.
The **dimension** of space equals to **values number**.

Examples:

2D: (2.3, 0.4): $x=2.3, y=0.4$

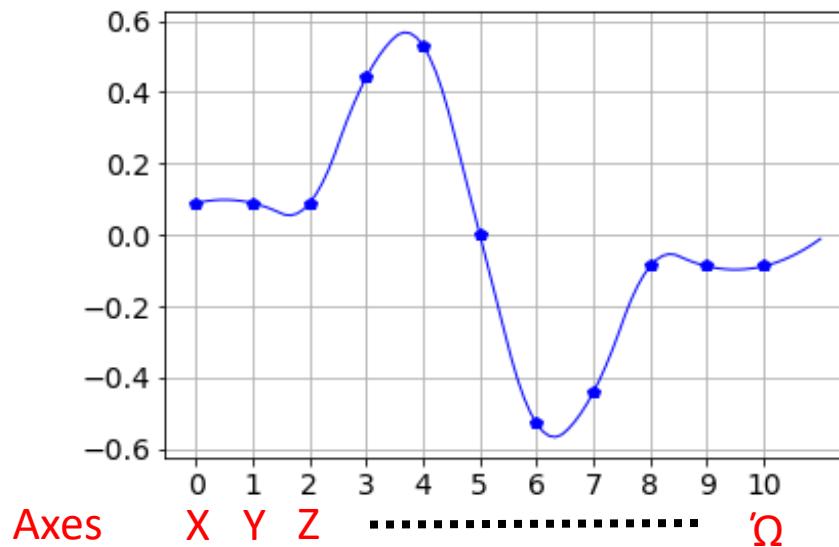
3D: (2.3, 0.4, 12.7): $x=2.3, y=0.4, z= 12.7$

4D: (2.3, 0.4, 12.7, 9.2): $x=2.3, y=0.4, z= 12.7, \dot{z}=9.2$

ND: (2.3, 0.4, 12.7, 9.2, ..., 17.3): $x=2.3, y=0.4, z= 12.7, \dot{z}=9.2, \dots \Omega=17.3$

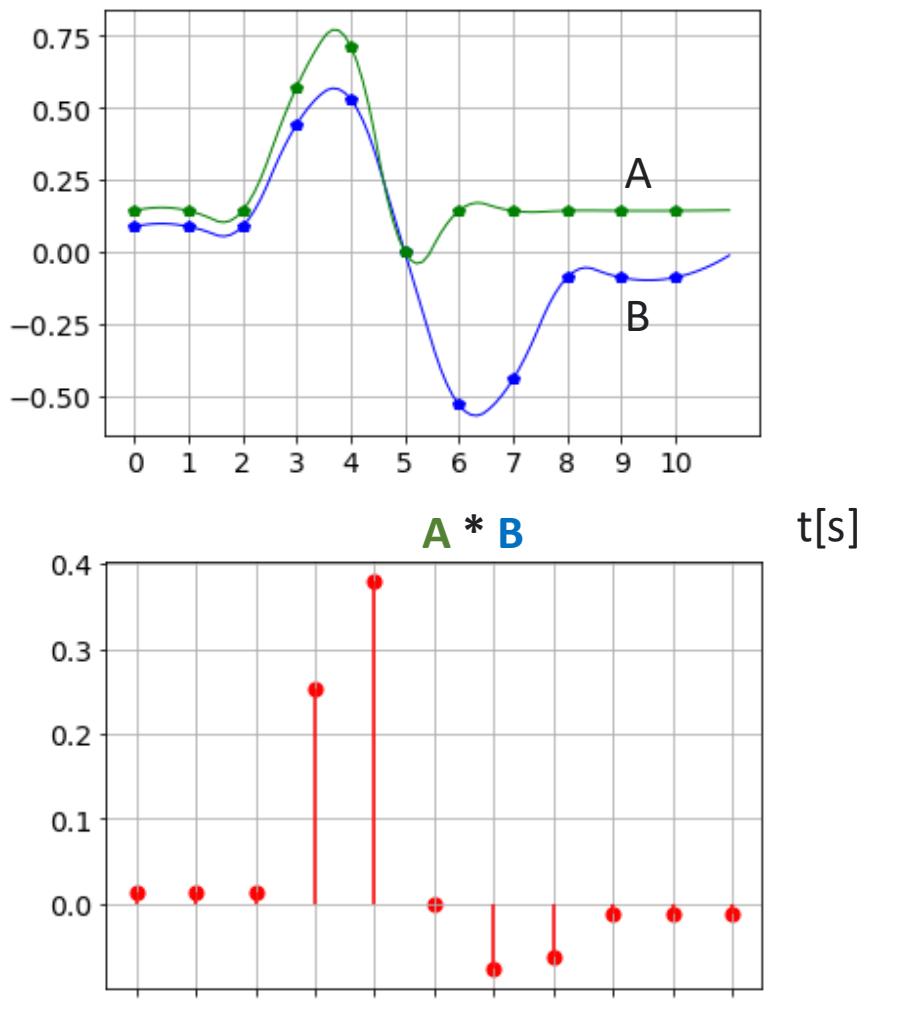
0 , 1 , 2 , 3 , ..., N <- coordinate indexes

On the other hand, any signal is a list of values, so **any signal** can be considered a **vector in N dimensional space**.



As it was said dot product let us measure how two vectors are oriented towards each other, so, **dot product** let us also measure **relation between two signals** (parallel, antiparallel, orthogonal, and so one).

One can say that **dot product** let us evaluate a **degree of similarity** between **two signals**.



dot product $\rightarrow \sum_{i=0}^{10} A[i] * B[i] = 0.4924$

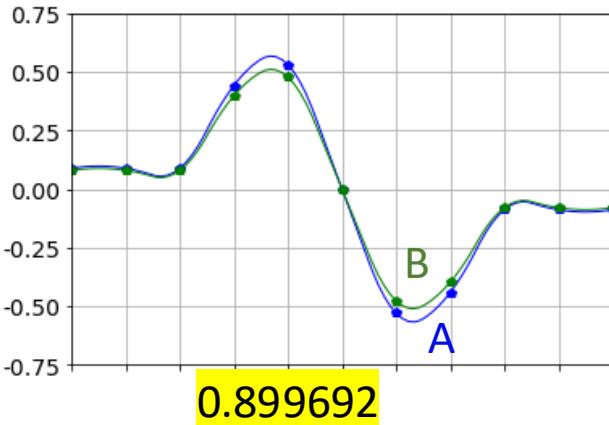
Signals similarity evaluation by using dot product

Use Python to replace question marks with dot product.

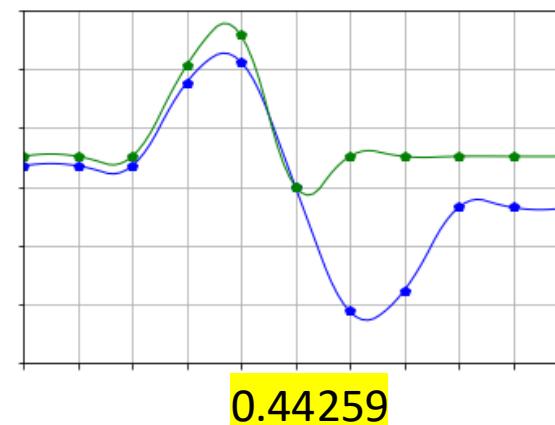
Use signal samples value given above the plots

Use round(x,6) when printing dot value

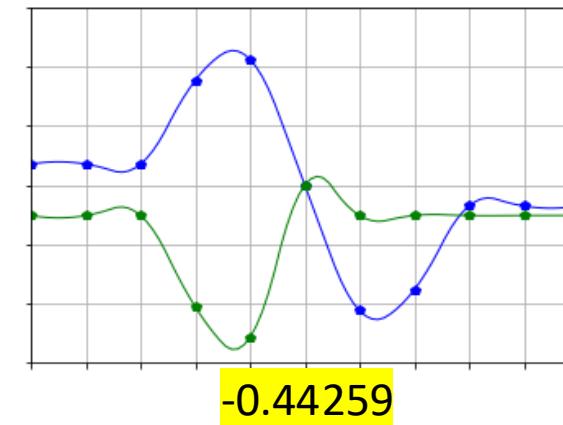
0.088,0.088,0.088,0.442,0.530,0.000,-0.530,-0.442,-0.088,-0.088,-0.088
0.080,0.080,0.080,0.398,0.477,0.000,-0.477,-0.398,-0.080,-0.080,-0.080



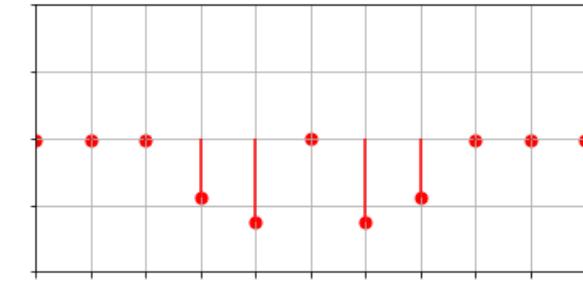
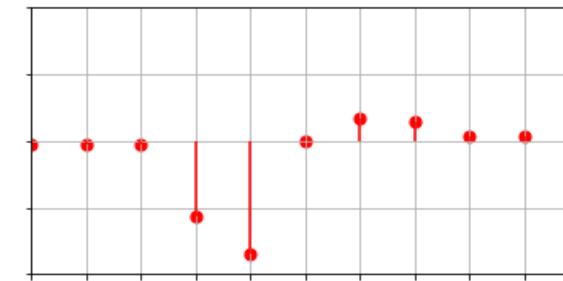
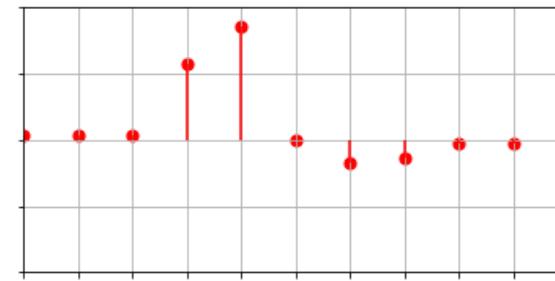
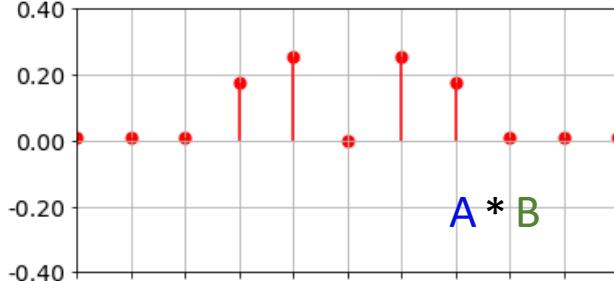
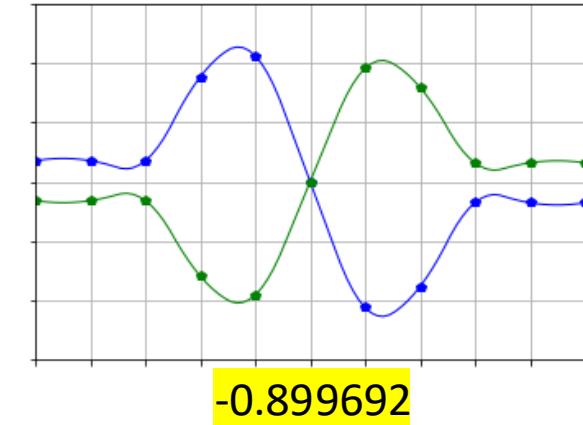
0.129,0.129,0.129,0.514,0.643,0.000,0.129,0.129,0.129,0.129,0.129



-0.129,-0.129,-0.129,-0.514,-0.643,-0.000,-0.129,-0.129,-0.129,-0.129,-0.129



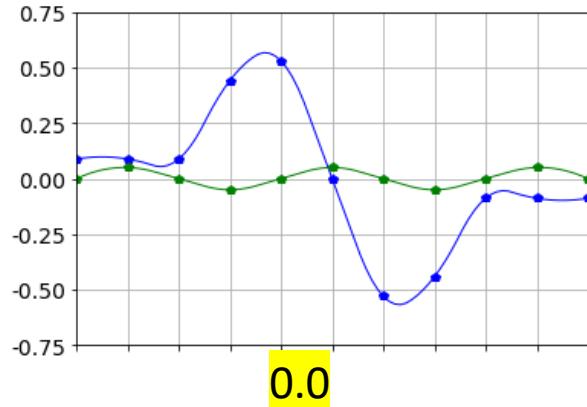
-0.080,-0.080,-0.080,-0.398,-0.477,-0.000,0.477,0.398,0.080,0.080,0.080



Signals similarity evaluation by using do product, **cont.**

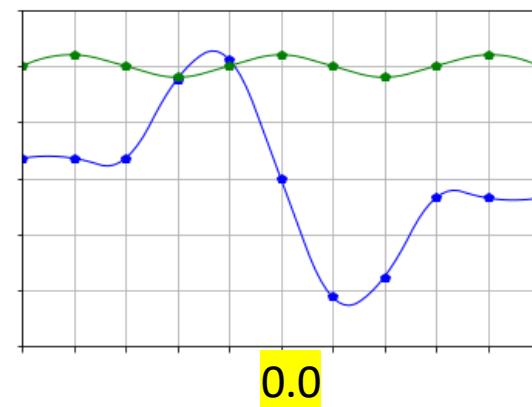
Please continue

0.088 0.088 0.088 0.442 0.530 0.000 -0.530 -0.442 -0.088 -0.088 -0.088
0.000 0.050 0.000 -0.050 0.000 0.050 0.000 -0.050 0.000 0.050 0.000



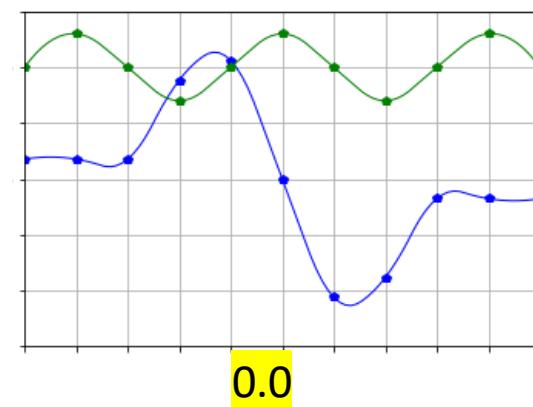
0.0

0.500 0.550 0.500 0.450 0.500 0.550 0.500 0.450 0.500 0.550 0.500



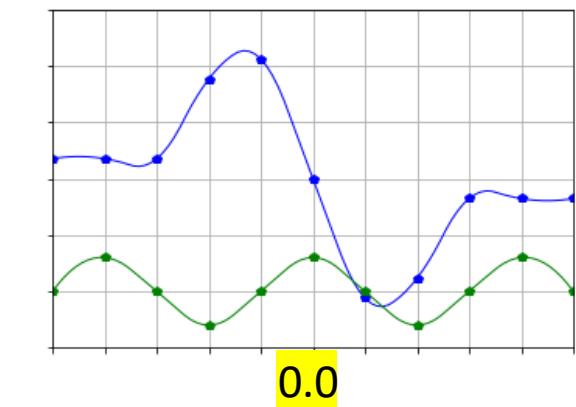
0.0

0.500 0.650 0.500 0.350 0.500 0.650 0.500 0.350 0.500 0.650 0.500

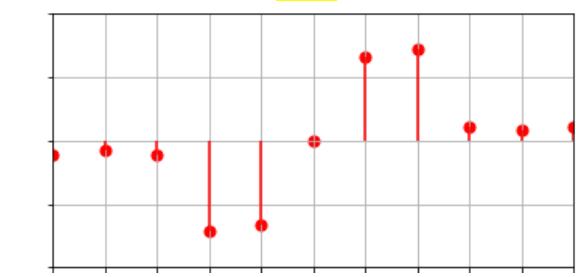
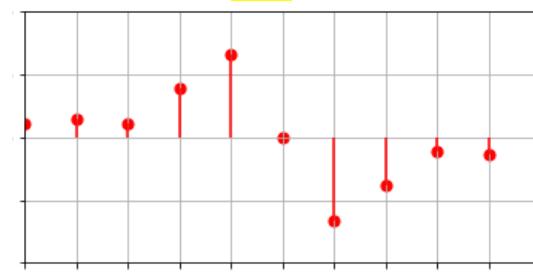
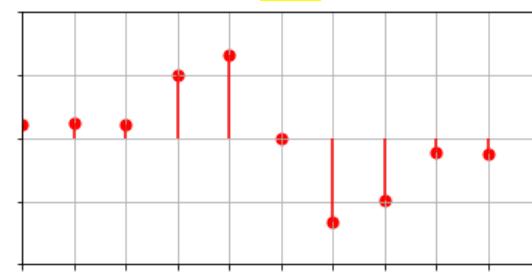
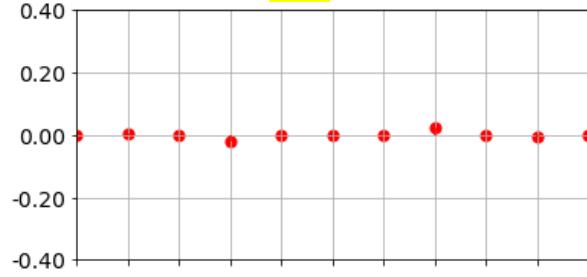


0.0

-0.500 -0.350 -0.500 -0.650 -0.500 -0.350 -0.500 -0.650 -0.500 -0.350 -0.500



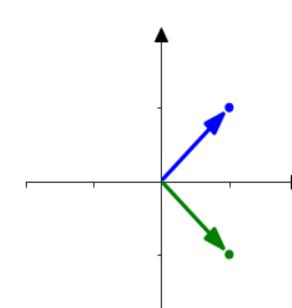
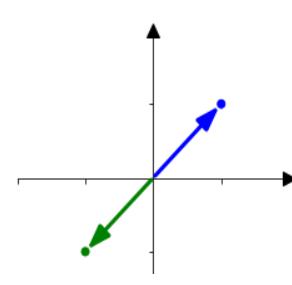
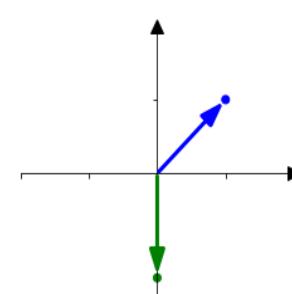
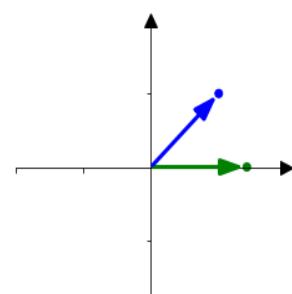
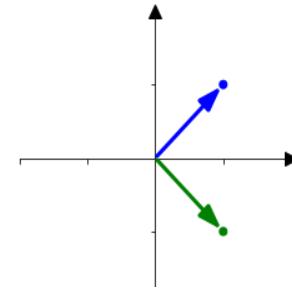
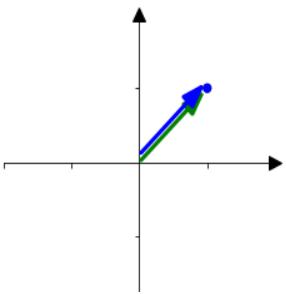
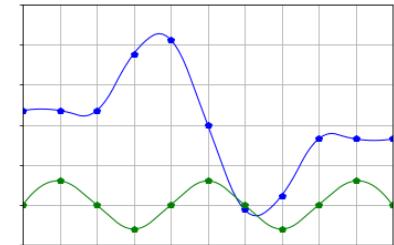
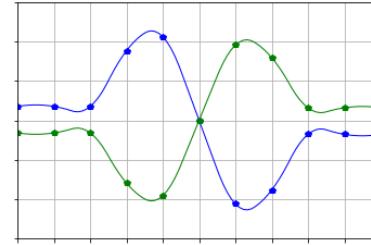
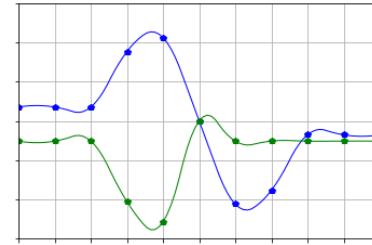
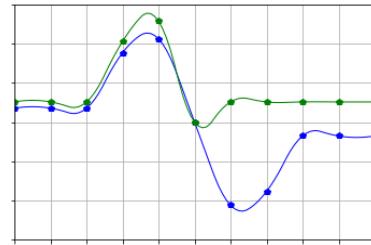
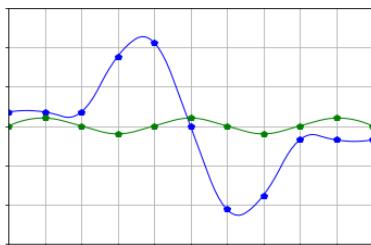
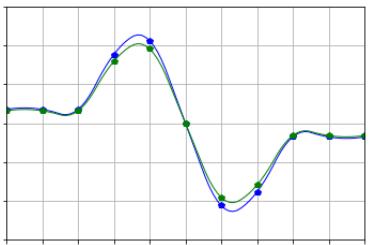
0.0



Signals similarity evaluation by using dot product, cont.

Find analogy between signal pairs and 2D vectors pairs

Put vectors figures below proper signal figures



Plots customization: Example

Example of generation of vectors (1D array) with sinusoid and triangle waves

data preparation

```
import numpy as np
import matplotlib.pyplot as plt
from scipy import signal #required for triangle signal generation

# DATA CREATION

# definition of pi constant by using numpy library
pi = np.pi

# time vector.
# from zero to 2pi in 30 steps
t = np.linspace(0, 3*2*pi, 60, endpoint=False) #

# "simple" sinusoid
sin_a = np.sin(t)

# sinusoid with amplitude equal to 2 and time shift qual to pi/4
sin_b = 2*np.sin(t+pi/4)

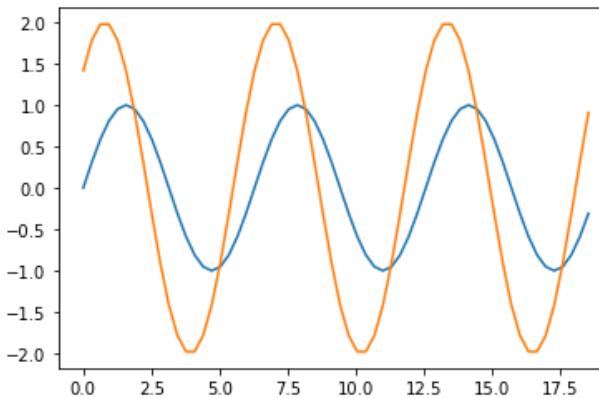
# triangular waveforms
#"0.5" denotes proportion between positive and negative slope
trian_a = signal.sawtooth(t, 0.5)
trian_b = 2*signal.sawtooth(t+pi/2, 0.5)
trian_c = trian_a+trian_b
```

Plots customization: Example cont.

Simple plotting

```
# adding waveforms to figure
plt.plot(t,sin_a)
plt.plot(t,sin_b)

# drawing figure
plt.show()
```

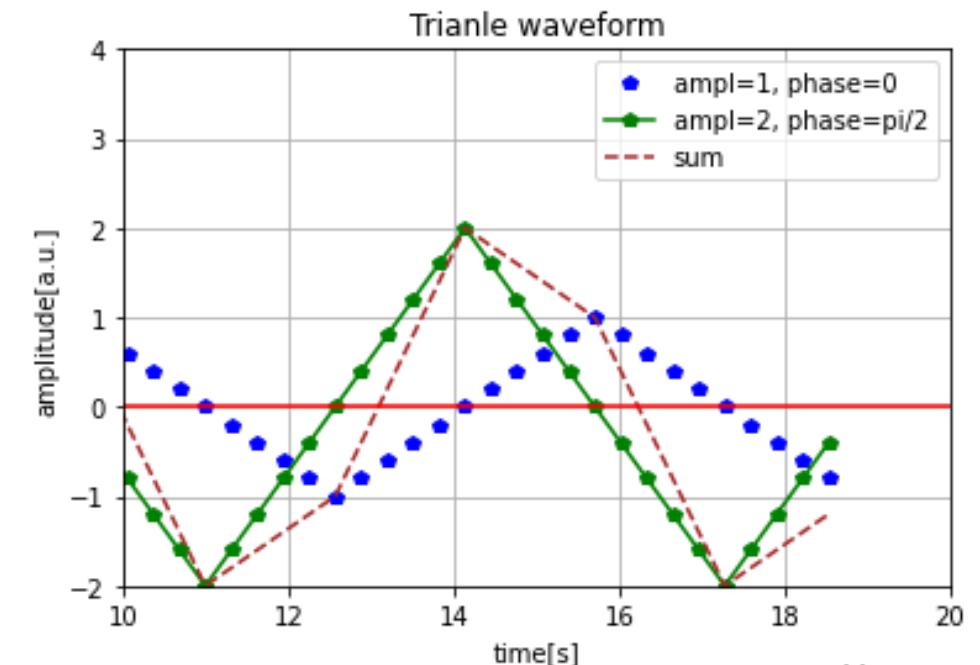


Plots customization

```
# adding waveforms to figure
plt.plot(t,trian_a, 'p', label='ampl=1, phase=0', color='blue')
plt.plot(t,trian_b,'-p', label='ampl=2, phase=pi/2', color='green')
plt.plot(t,trian_c,'--', label='sum', color='brown')

# customizing figure
plt.title('Triangle waveform')
plt.xlabel('time[s]')
plt.ylabel('amplitude[a.u.]')
plt.xlim(10,20)
plt.ylim(-2,4)
plt.axhline(y=0,color='red')
plt.grid()
plt.legend()

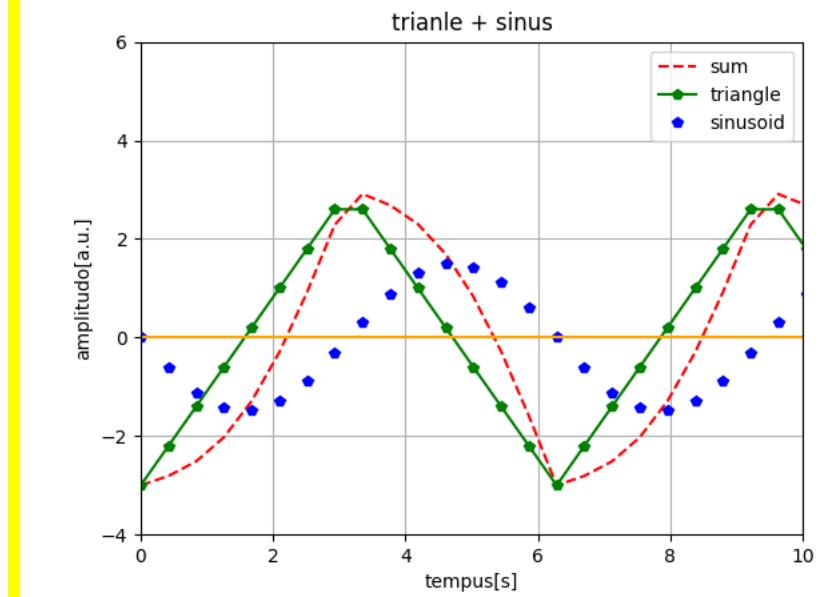
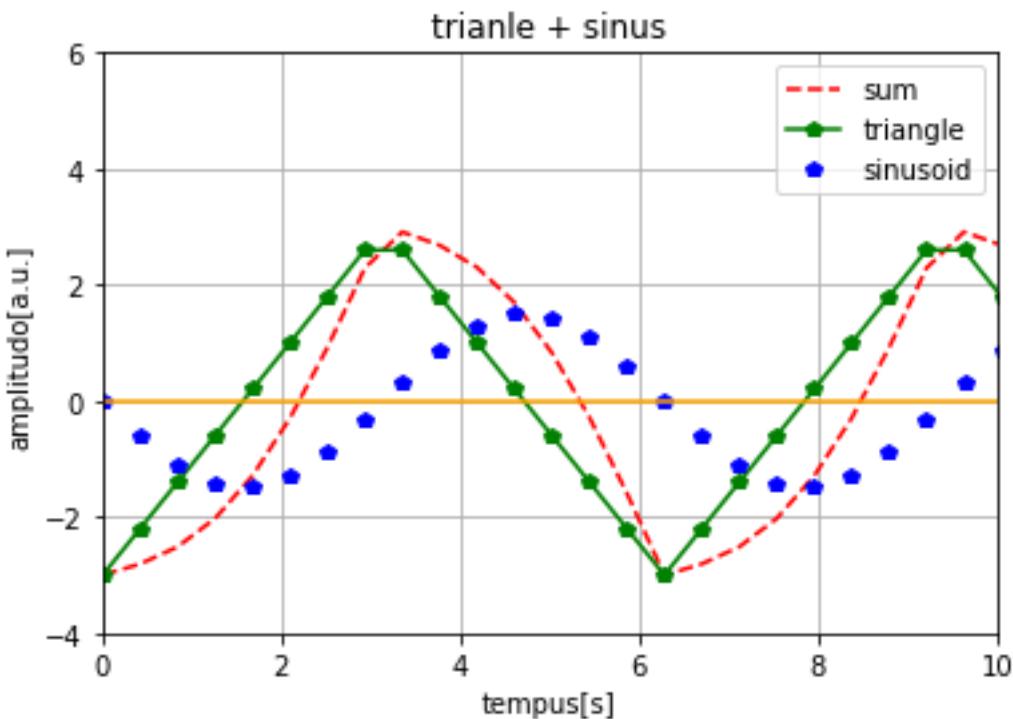
# drawing figure
plt.show()
```



Plots customization: Exercise

Generate figure as below.

Don't forget axes titles, axes ranges and legend



```
1 import numpy as np
2 import matplotlib.pyplot
3 from scipy import signal
4
5 pi = np.pi
6 t = np.linspace( start: 0,
7
8 trian_a = 1.5*np.sin(-t)
9 trian_b = 3*signal.sawtooth(2*pi*t)
10 trian_c = trian_a+trian_b
11
12 plt.plot(*args: t, trian_c)
13 plt.plot(*args: t, trian_b)
14 plt.plot(*args: t, trian_a)
15
16
17 plt.title('triangle + sinus')
18 plt.xlabel('tempus[s]')
19 plt.ylabel('amplitude[a.u.]')
20 plt.xlim(*args: 0,10)
21 plt.ylim(*args: -4,6)
22 plt.axhline(y=0, color='orange')
23 plt.grid()
24 plt.legend()
25
26 plt.show()
```

1. **Sinewaves orthogonality**
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation

Dot product of vectors

Dot product of signals

Sum of periodical signals

Dot product of sinusoids

2D vectors

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- Orthogonal examples
- Dot product vs. angle

Vector as a list of numbers

- 2D example
- 3D example

Vector as a signal - signal as a vector

Dot product of signals

Signal's similarity

Dot versus phase shift

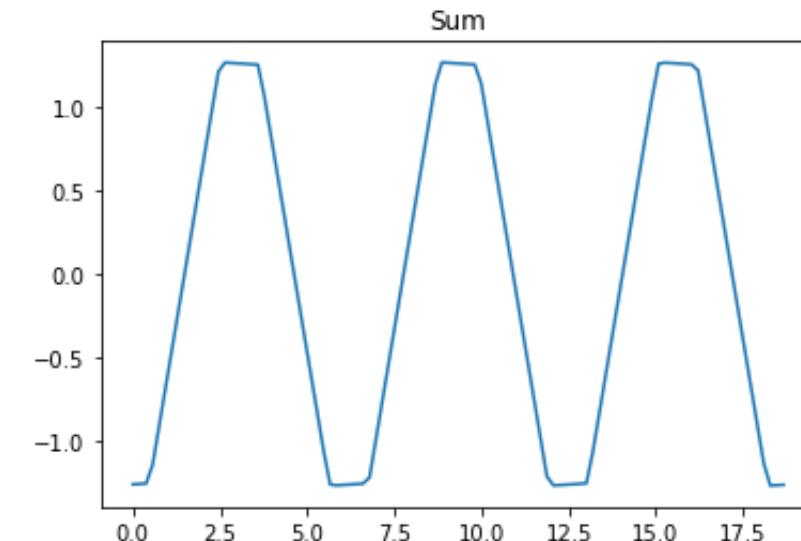
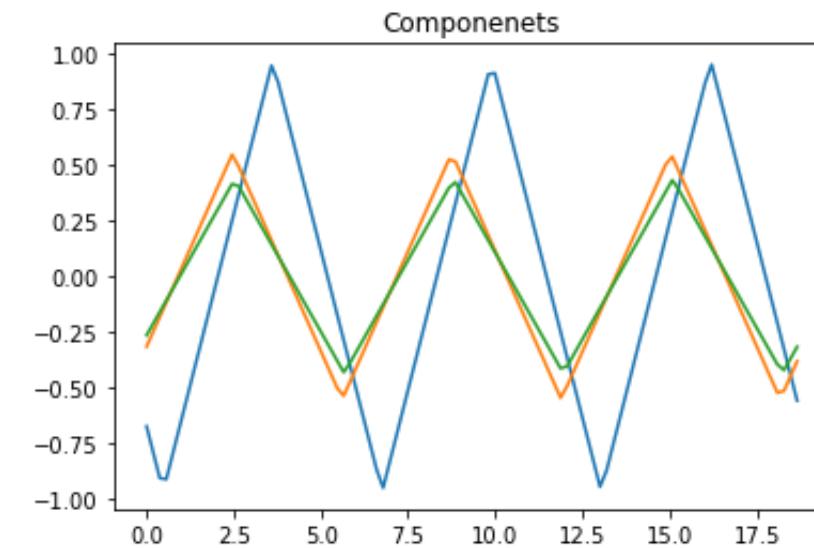
Dot versus amplitudes

Interferences

Sum of periodic signals (same frequency)

Run script for 2 rectangular waveform and sawtooth waveform (see details in code comments)

```
...  
from scipy import signal  
...  
  
t = np.linspace(0, 3*(2*pi), 100, endpoint=False)  
  
y_sum = np.zeros(len(t)) # sumaric vector filled with zeros  
  
for i in range(3): # nr of components  
  
    # generating random values of phase shift and amplitude  
    # "rand" function generates single random nr in range from 0 to 1  
    phase = np.random.rand()*(2*pi)  
    ampl = np.random.rand()  
  
    # generating different waveforms  
    # select single waveform by commenting the remaining ones  
  
    y = ampl * np.sign(np.sin(t+phase))      # rectangle  
    #y = ampl * signal.sawtooth(t+phase, 0.5) # triangle  
  
    plt.plot(t, y, '-')  
    y_sum = y_sum + y  
  
plt.title('Componenets')  
plt.show()  
  
plt.title('Sum')  
plt.plot(t, y_sum, '-')  
plt.show()
```

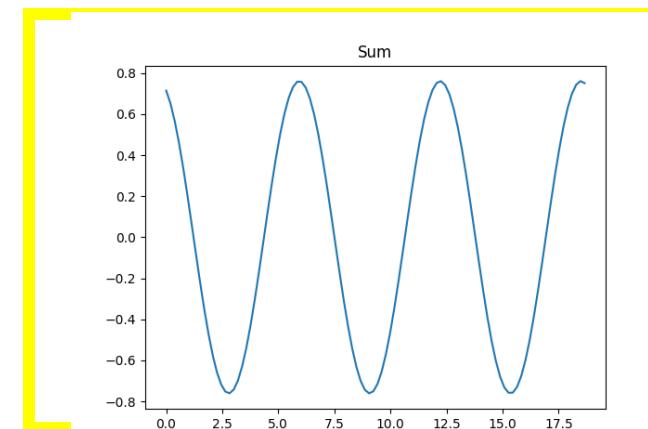
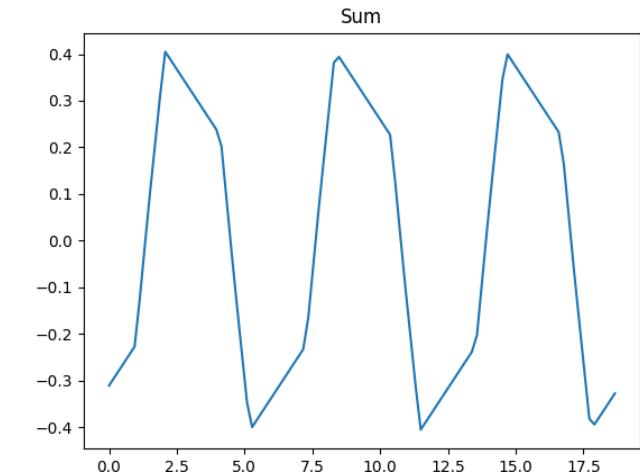
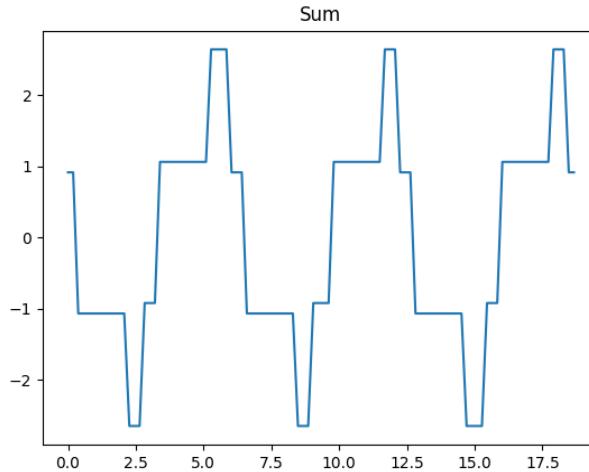


Sum of periodic signals (same frequency), cont.

Extend the script with sinus wave generation

Put sum plots (only)

```
1 import numpy as np
2 from matplotlib import pyplot as plt
3 from scipy import signal
4
5 pi = np.pi
6
7 t = np.linspace( start: 0, 3 * (2 * pi), num: 100, endpoint=False)
8
9 y_sum = np.zeros(len(t)) # sum vector filled with zeros
10
11 for i in range(3): # nr of components
12
13     # generating random values of phase shift and amplitude
14     # "rand" function generates single random nr in range from 0 to 1
15     phase = np.random.rand() * (2 * pi)
16     ampl = np.random.rand()
17
18     # generating different waveforms
19     # select single waveform by commenting the remaining ones
20
21     #y = ampl * np.sign(np.sin(t + phase)) # rectangle
22     y = ampl * signal.sawtooth(t+phase, width: 0.5) # triangle
23     #y = ampl * np.sin(t+phase) #sinus
24
25     plt.plot(*args: t, y, '-')
26     y_sum = y_sum + y
27
28 plt.title('Components')
29 plt.show()
30
31 plt.title('Sum')
32 plt.plot(*args: t, y_sum, '-')
33 plt.show()
```



Sum of periodic signals (same frequency): conclusion

Which waveform type is exceptional and why ?

Exceptional waveform is sinusoid because negative and positive slopes have the same proportion

1. **Sinewaves orthogonality**
2. Orthogonal sinewaves amplitude modulation
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Sum of periodical signals

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Vector as a signal - signal as a vector

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Signal's similarity

Dot versus phase shift

Dot versus amplitudes

Interferences

dot vs. phase shift

Fix and complete following script to generate plots and prints as below

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 pi = np.pi
4
5 # PARAMETER
6 PHASE_SHIFT = pi/2+pi/2
7
8 # VECTORS
9 t = np.linspace( start: 0, 2*pi, num: 30, endpoint=False)
10
11 Ref = np.sin(t)
12 Shifted = np.sin(t+PHASE_SHIFT)
13 Ref_mult_Shifted = Ref*Shifted
14 dot_product = np.sum(Ref_mult_Shifted) #use Ref_mult_Shifted
15
16 # PLOTS (HINT: use separate plots, not one with grid)
17
18 # components
19 plt.plot( *args: t, Ref, '-p', color='blue')
20 plt.plot( *args: t, Shifted, '-p', color='green')
21 plt.legend(["Ref", "Shifted"])
22 plt.title("Components")
23 plt.grid()
24 plt.axhline(y=0, color='black')
25 plt.show()
26 # multiplication, HINT: use "stem" function for plotting
27 plt.stem( *args: t, Ref_mult_Shifted, markerfmt='darkorange')
28 plt.legend(["Ref_mult_Shifted"])
29 plt.grid()
30 plt.axhline(y=0, color='red')
31 plt.ylim([-1,1])
32 plt.show()
33 # print phase shift and dot product value
34 print(PHASE_SHIFT,f' dot = {dot_product:0.2f}',)
```

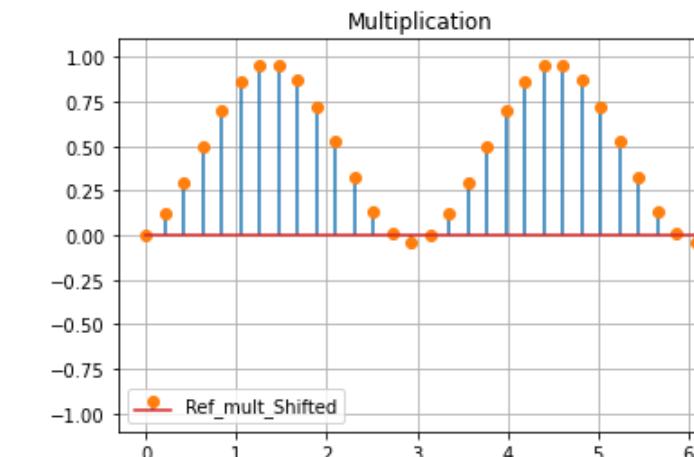
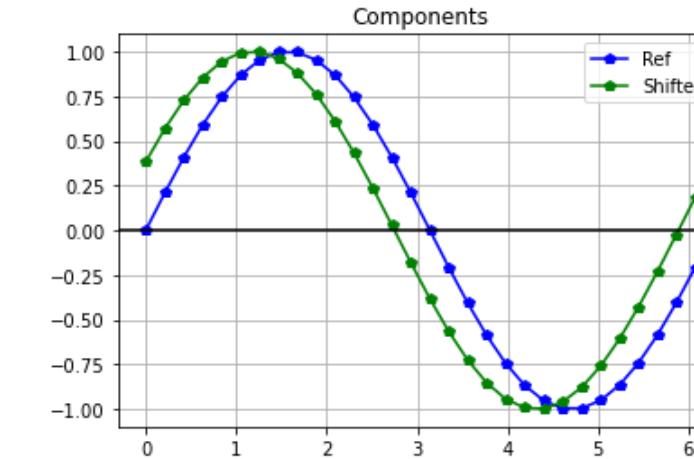
False)

ted

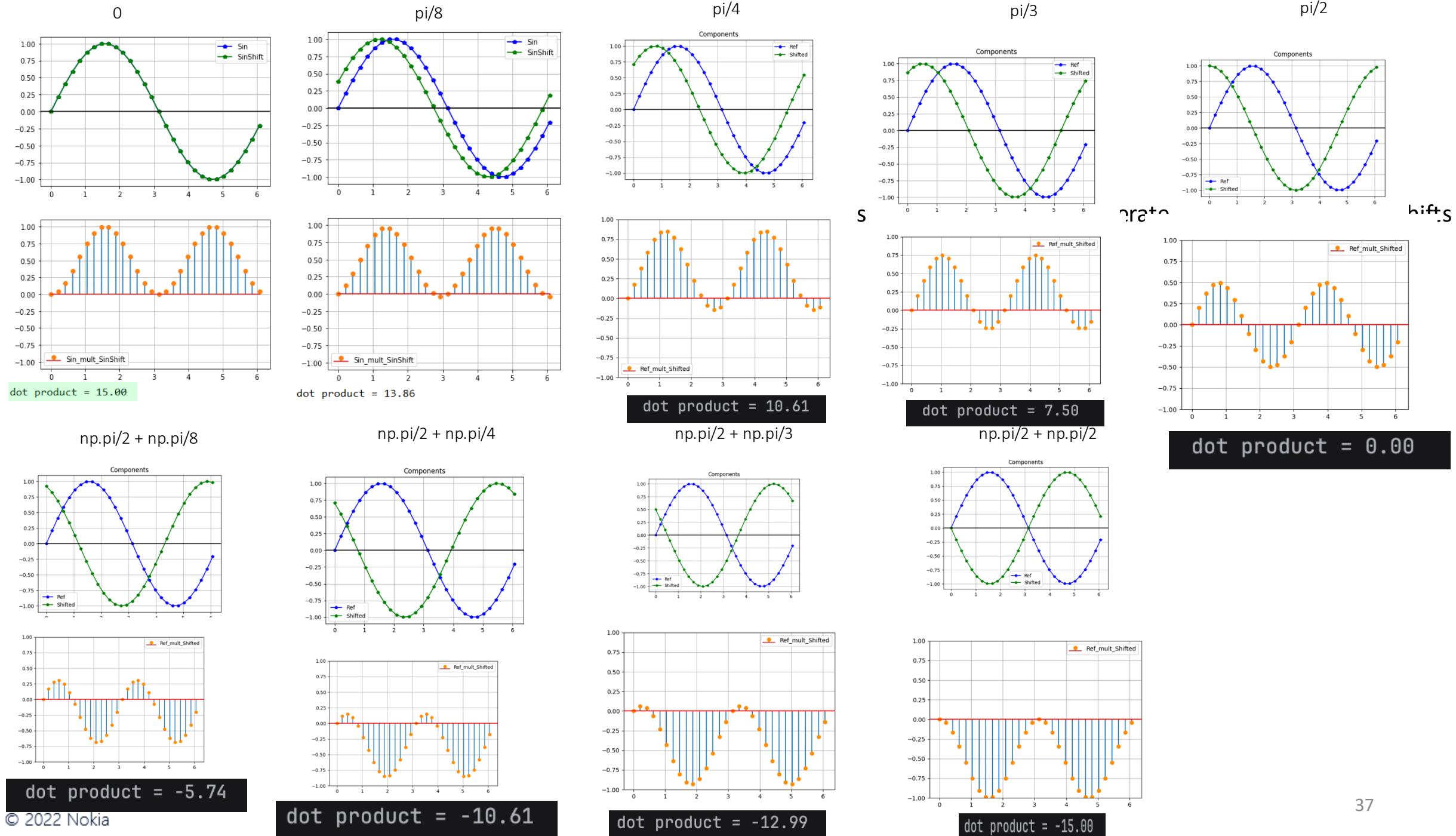
one with grid)

ction for plotting

alue

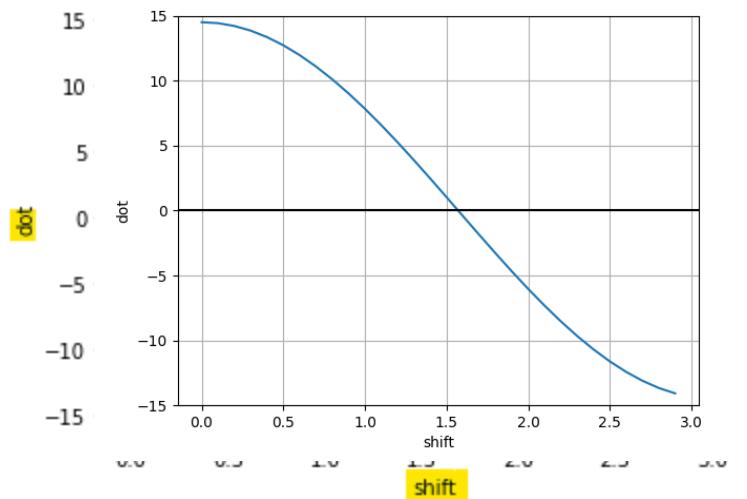


phase_shift = 0.39
dot_product = 13.86



Plot relationship between **dot** product and **phase shift**

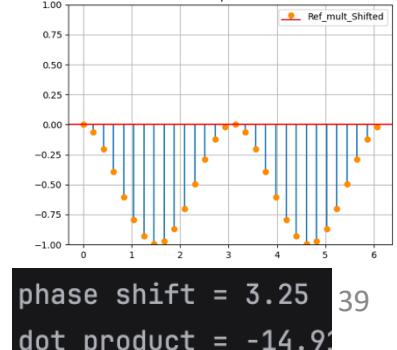
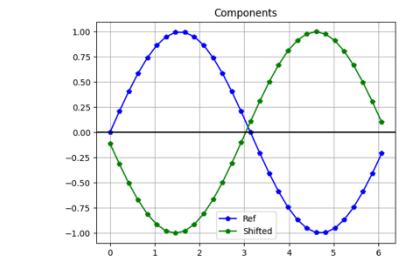
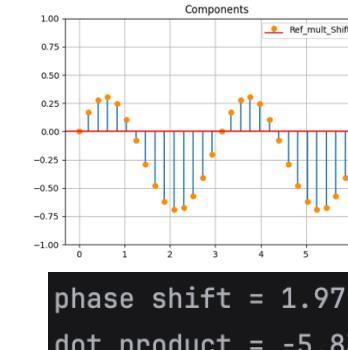
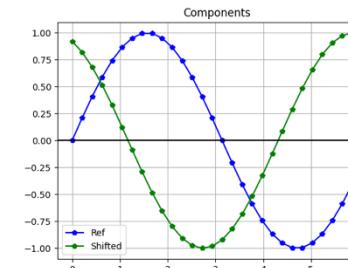
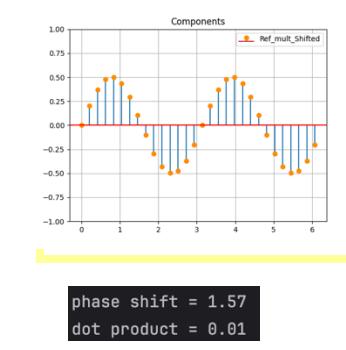
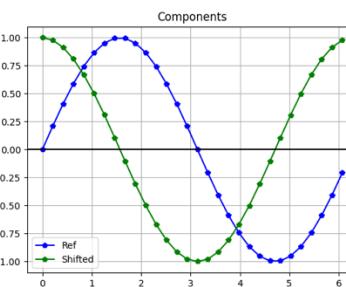
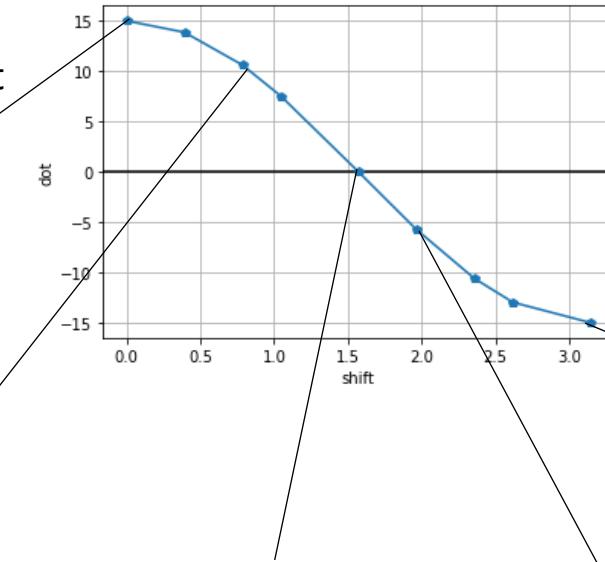
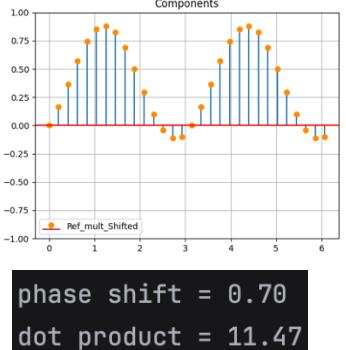
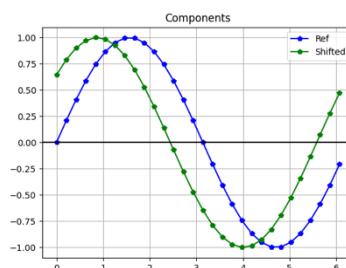
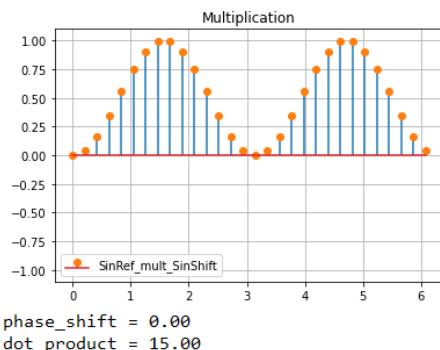
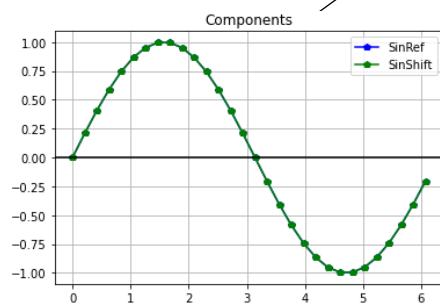
Shift values should be in the range as on the plot below however,
its values do not have to be limited to values from previous slide (linspace)



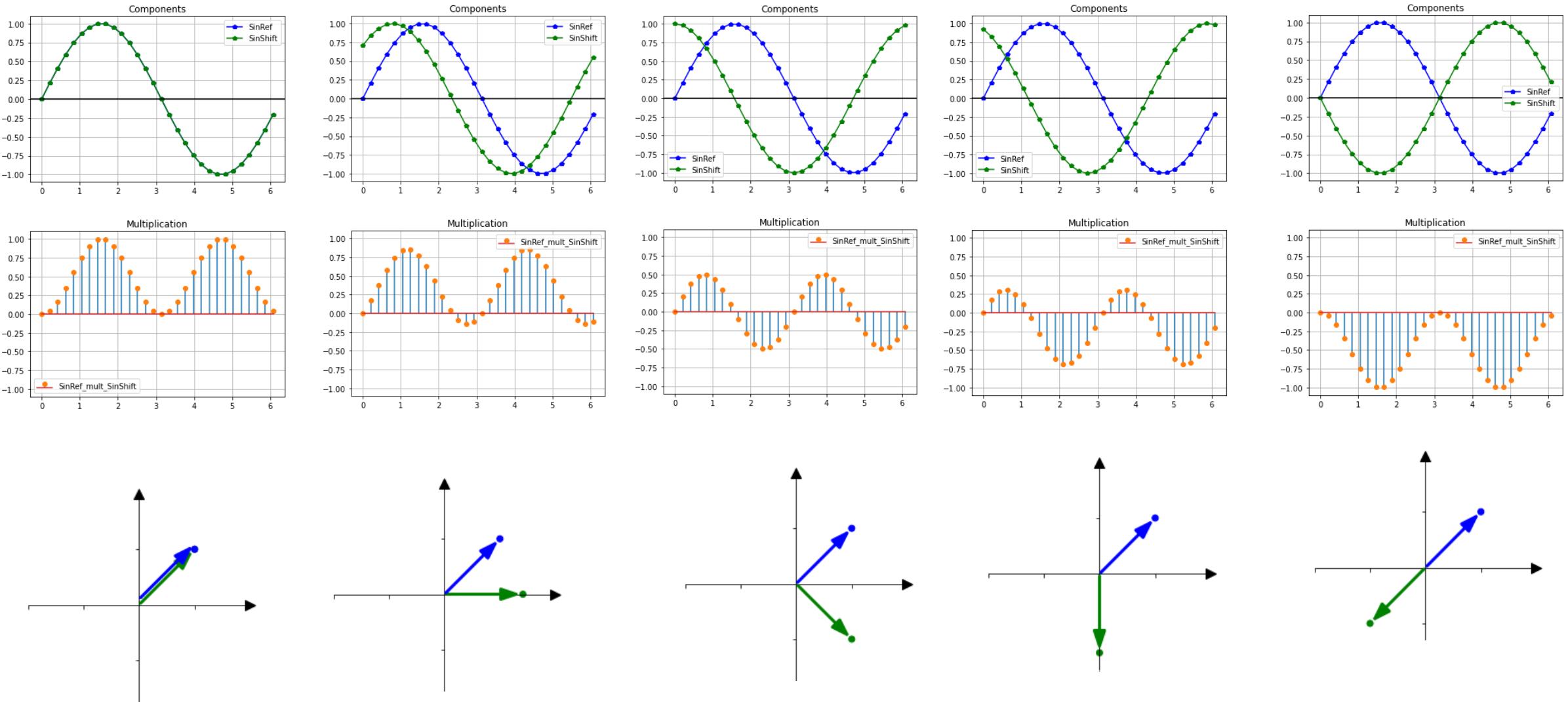
```
1  import numpy as np
2  import matplotlib.pyplot as plt
3
4  pi = np.pi
5
6  t = np.linspace( start: 0, 2 * pi, num: 30)
7  phaseShift = np.linspace( start: 0, stop: 3, num: 30, endpoint=False)
8  Ref = np.sin(t)
9
10 dot_products = []
11
12 for phase in phaseShift:
13     shifted = np.sin(t + phase)
14     dot_product = np.dot(shifted, Ref)
15     dot_products.append(dot_product)
16
17 plt.plot( *args: phaseShift, dot_products)
18 plt.xlabel('shift')
19 plt.ylabel('dot')
20 plt.ylim( *args: -15,15)
21 plt.axhline( y: 0, color='black')
22 plt.grid()
23 plt.show()
```

dot vs. phase shift, cont.

Base on results from previous page
 assign plots to points on “phase shift – dot value” plot



dot vs. phase shift, cont



Put vector figures below proper sinusoids plots

1. **Sinewaves orthogonality**
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation

Dot product of vectors

Dot product of signals

Sum of periodical signals

Dot product of sinusoid

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Dot versus phase shift

Dot versus amplitudes

Interferences

dot versus amplitudes: sinus amplitude measurement

Examine **dot product** of two sinewaves of the **same frequency and phase** for time vectors of different size.

Use following script to fill tables with dot product of sinusoids of selected amplitudes for two different TIME_VECTOR_SIZES

```
# PARAMS
TIME_VECTOR_SIZE = 30

A = 1
B = 2

# CALCULATIONS
t = np.linspace(0, 2*pi, TIME_VECTOR_SIZE, endpoint=False)

Sin_A = A * np.sin(t)
Sin_B = B * np.sin(t)
dot = np.dot(Sin_A,Sin_B)

# PRESENTATION
print(f'A = {A}')
print(f'B = {B}')
print(f'dot = {dot:0.2f}')
```

		TIME_VECTOR_SIZE=15		
		A		
dot		0	1	2
	0	0.00	0.00	0.00
	1	0.00	7.50	15.00
	2	0.00	15.00	30.00

		TIME_VECTOR_SIZE=30		
		AMP_A		
dot		0	1	2
AMP_B		0.00	0.00	0.00
0		0.00	15.00	30.00
1		0.00	30.00	60.00

Base on table content write formula illustrating relationship between **dot product** value and values of **A**, **B** and **TIME_VECTOR_SIZE**,
dot_product(AMP_A, AMP_B, TIME_VECTOR_SIZE,) =
A*B*TIME_VECTOR_SIZE/2

dot versus amplitudes : normalization

Value of dot product of two “in-phase” sinuses depends on their: amplitudes and resolution (TIME_VECTOR_SIZE).

In order to use dot product to measure amplitude of sinus one must normalize dot product, i.e., make it independent from time vector resolution

Extend previous script with “A_rx” evaluation.

The value (not formula) of “A_rx” should:

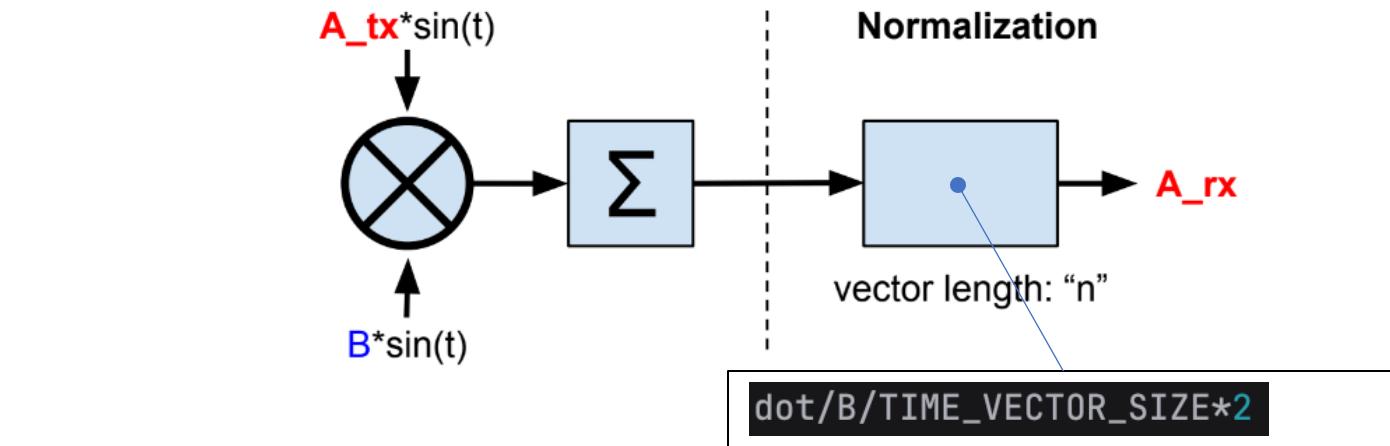
- Be equal to value of A_tx
- be calculated base on dot product
- should not depend on TIME_VECTOR_SIZE changes (see tables)

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 pi = np.pi
4
5 # PARAMS
6 TIME_VECTOR_SIZE = 100
7
8 A_tx = 1
9 B = 2
10
11 # CALCULATIONS
12 t = np.linspace( start: 0, 2*pi, TIME_VECTOR_SIZE, endpoint=False)
13
14 Sin_A = A_tx * np.sin(t)
15 Sin_B = B * np.sin(t)
16 dot = np.dot(Sin_A, Sin_B)
17 A_rx = dot/B/TIME_VECTOR_SIZE*2
18
19 # PRESENTATION
20 print(f'A_tx = {A_tx}')
21 print(f'B = {B}')
22 print(f'dot = {dot:0.2f}')
23 print(f'A_rx = {A_rx:0.2f}'
```

Expected results

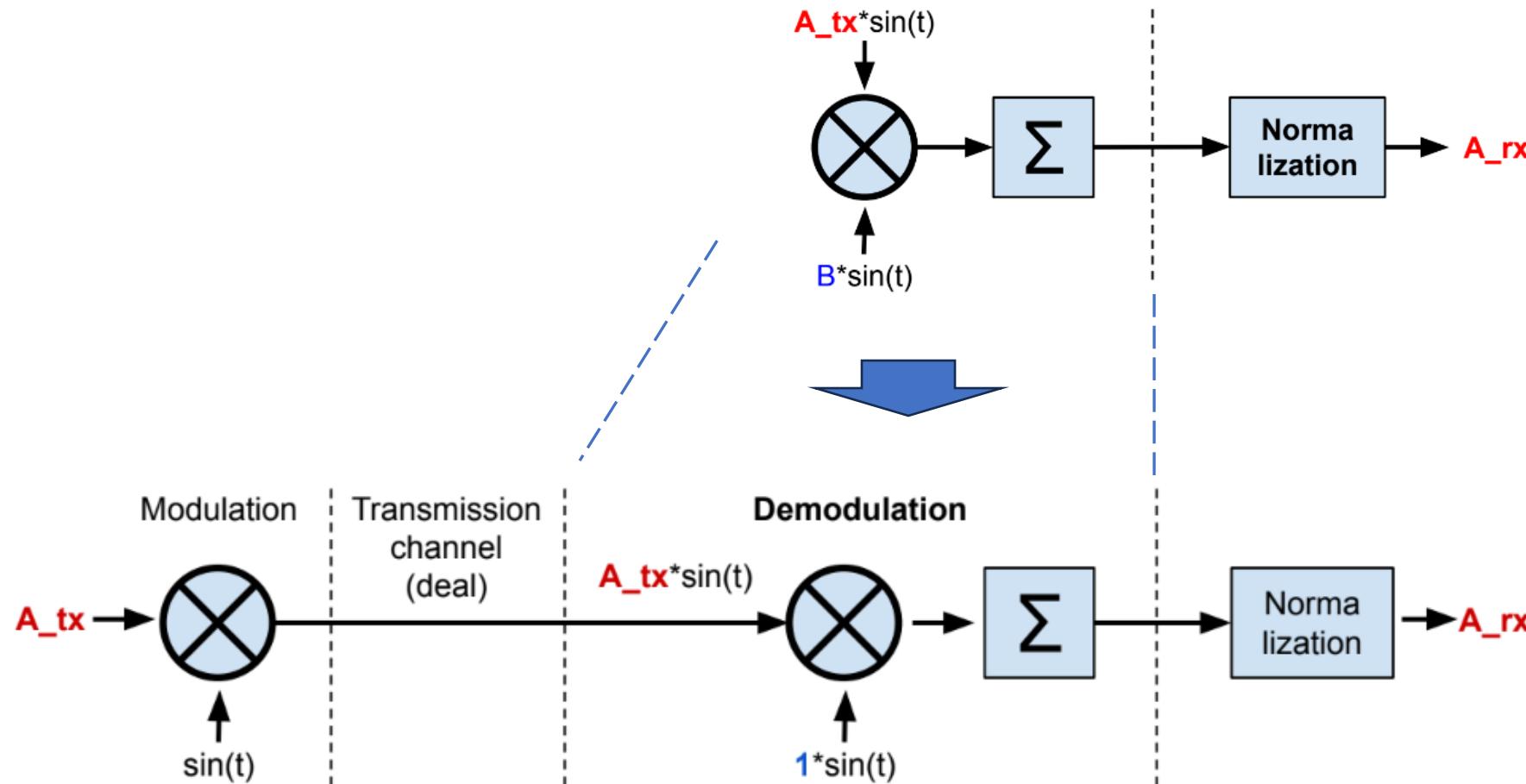
B = 1		TIME_VECTOR_SIZE=15	
A_tx	A_rx	A_tx	A_rx
0	0	1	1
1	1	2	2
2	2		

B = 1		TIME_VECTOR_SIZE=30	
A_tx	A_rx	A_tx	A_rx
0	0	1	1
1	1	2	2
2	2		



Dot product of the same frequency sinewaves: demodulation

As seen from the previous slide dot product can be used for demodulation of amplitude modulated signals



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Dot product of signals

Signal's similarity

Dot versus phase shift

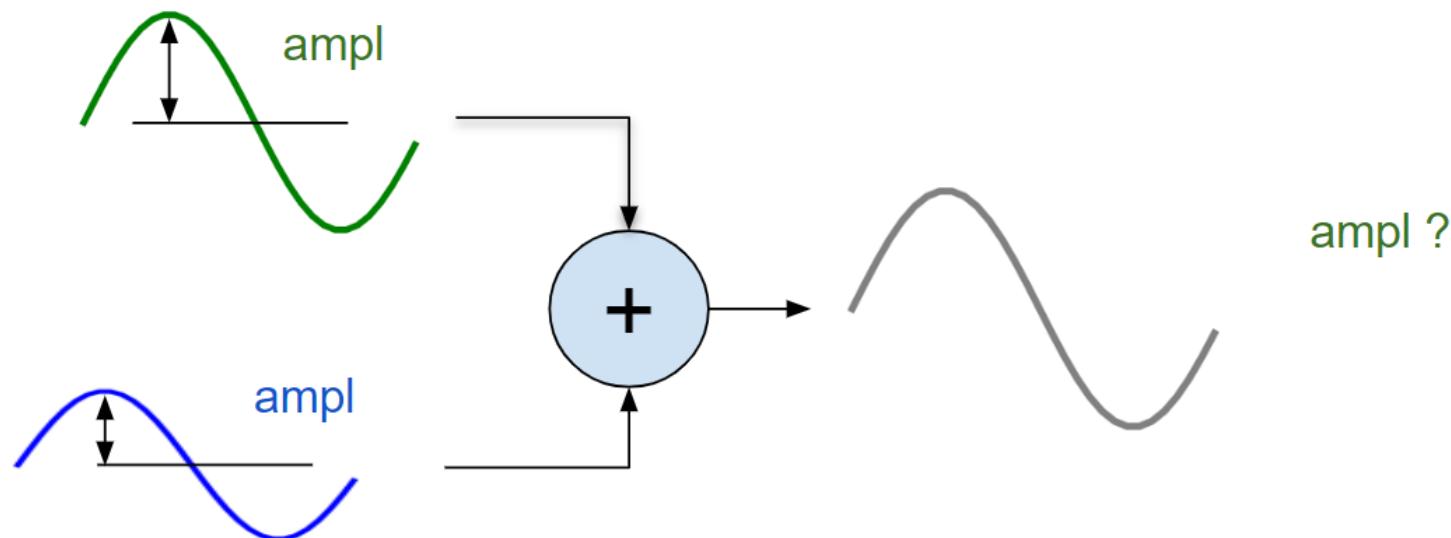
Dot versus amplitudes

Interferences

Dot product of the same frequency sinewaves: Interferencing

Let's assume we have signal which is the **sum** of two sinusoids, **carrier and interferer**.

Will it be possible to **recover carrier amplitude** the spite of interferer presence.



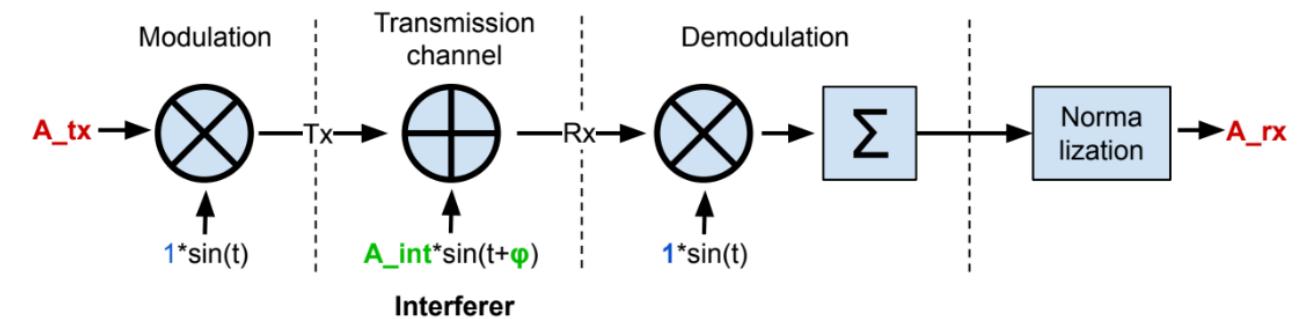
Dot product of the same frequency sinewaves: interferences, cont.

Complete script to implement given scheme.

```

1  import numpy as np
2  import matplotlib.pyplot as plt
3  pi = np.pi
4
5  # PARAMETERS
6  TIME_VECTOR_SIZE = 30
7  A_tx = 1
8  A_int = 2
9  A_int_phi = pi/4 + pi/2
10
11 # CALCULATION
12 t = np.linspace( start: 0, 2*pi, TIME_VECTOR_SIZE, endpoint=False)
13
14 # modulation
15 Tx = A_tx * np.sin(t)
16
17 #channel
18 Interfer = A_int * np.sin(t+A_int_phi)
19 Rx = Tx + Interfer
20
21 # demodulation
22 Rx_dot_Sin = Rx * np.sin(t)
23 Rx_dot_Sin = np.sum(Rx_dot_Sin) # Use Rx_dot_Sin please
24 A_rx = Rx_dot_Sin/TIME_VECTOR_SIZE*2
25
26 # PRESENTATION
27 plt.plot( *args: t,Tx, '-' , label='Tx', color='green')
28 plt.plot( *args: t,Interfer, '-' , label='Interfer',color='blue')
29 plt.plot( *args: t,Rx, '-' , label='Rx', color='gray', linewidth=1)
30 plt.ylim( *args: -3.1, 3.1)
31 plt.legend()
32 plt.grid()
33 plt.axhline(y=0,color='black')
34 plt.show()

```



Use the script to fill the table

$\Phi = \pi/4$		$\Phi = \pi/2$		$\Phi = \pi/2 + \pi/4$	
A_{int}	A_{tx}	A_{int}	A_{tx}	A_{int}	A_{tx}
0.00	0.7	0.00	1	0.00	0
0.50	1.2	0.50	1.4	0.50	0.5
1.00	1.7	1.00	1.7	1.00	1.00
1.50	2.2	1.50	2.1	1.50	1.50
2.00	2.7	2.00	2.4	2.00	2.00

Dot product of the same frequency sinewaves: interferences: conclusion

When do two sinewaves of the same frequency do not disturb each other?

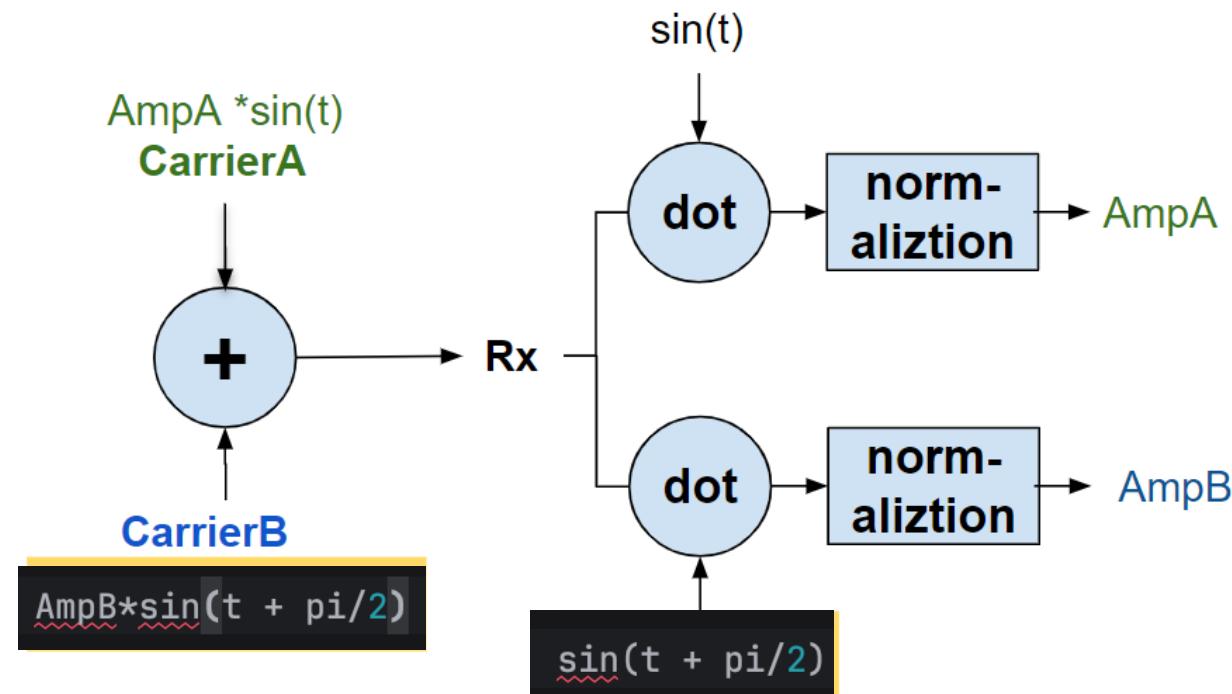
When they are orthogonal (phase $\pi/2$)

In this case sinewaves do not interfere each other because their dot product is 0.

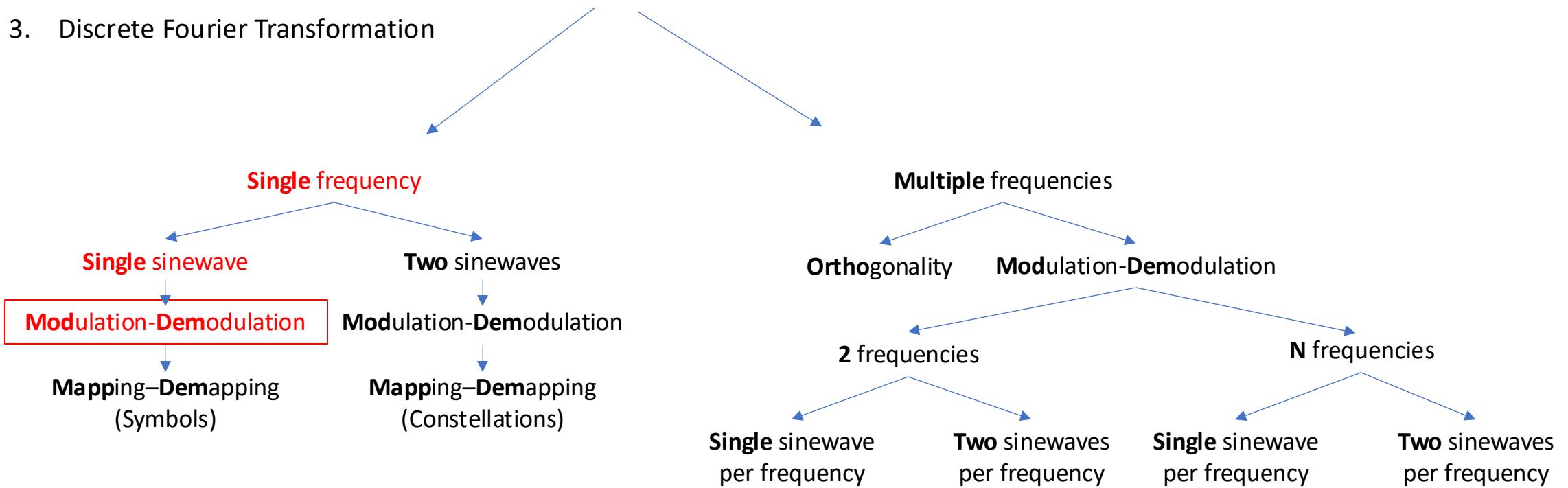
Assuming above condition is satisfied, is it possible to “transfer amplitude” of two sinewaves via one signal?

Can we use “interferer” from previous slide as a second amplitude carier?

If yes, fulfill yellow boxes.



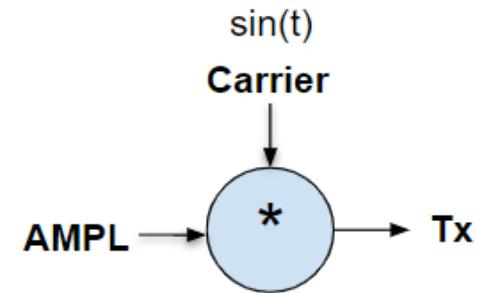
1. Sinewaves orthogonality
 2. Orthogonal sinewaves amplitude modulation
 3. Discrete Fourier Transformation



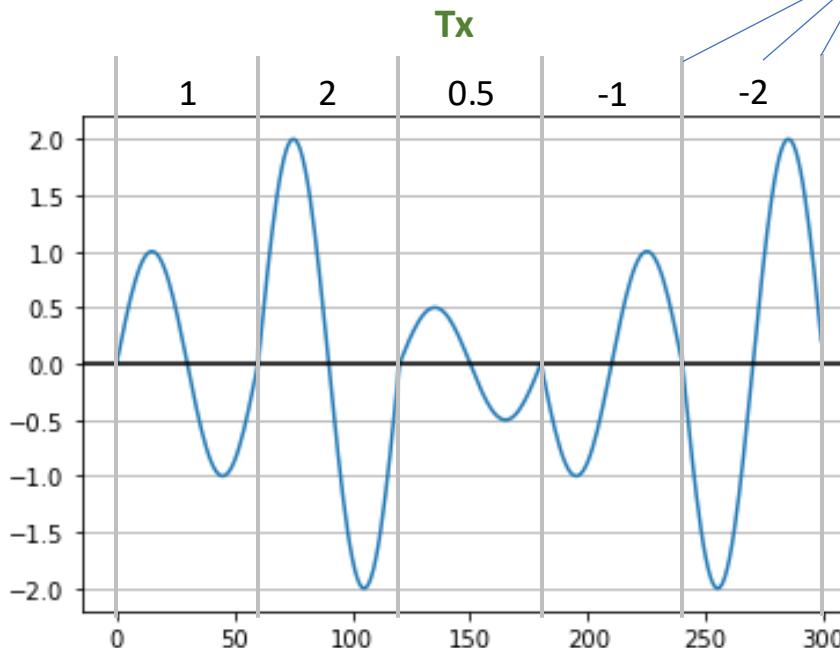
Single sinewave: modulation

Complete script to obtain modulated sinus as below

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 pi = np.pi
4
5 # PARAMETERS
6 TIME_VECTOR_SIZE = 60
7 AMPL_VECTOR = (1,2,0.5,-1,-2)
8
9 # CALCULATION
10 t = np.linspace( start: 0, 2*pi,TIME_VECTOR_SIZE, endpoint=False)
11
12 Carrier = np.sin(t)
13
14 Tx = np.array([])
15 for amp in AMPL_VECTOR:
16     Tx = np.append(Tx, amp * Carrier)
17
18 # PRESENTATION
19 plt.plot(Tx)
20 plt.axhline(y=0,color='black')
21 plt.grid(axis='y')
22 plt.show()
23
24 # SAVING
25 np.save( file: 'TxSignal',Tx)
```



Do not try to obtain this lines and numbers with script
They were added manually



Single sinewave: demodulation: sinewave periods separation

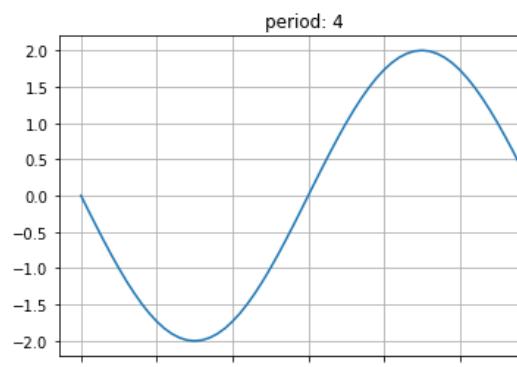
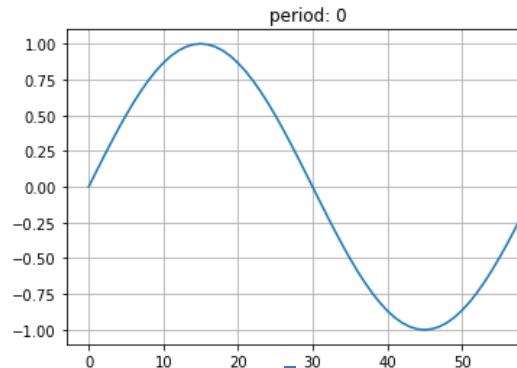
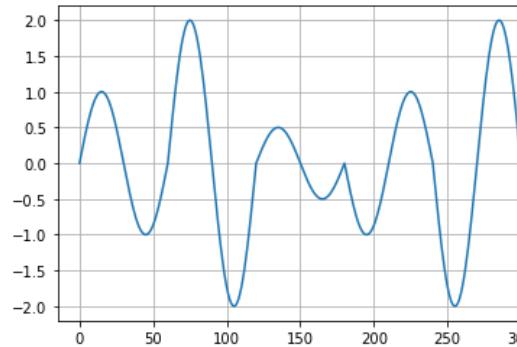
Below script is expected to:

- loads and plots signal saved by previous script,
- Split signal to single periods,
- plots periods individually.

Complete the script to obtain plots as on the right.

```
1  import numpy as np
2  import matplotlib.pyplot as plt
3
4  # parameters
5  PERIOD_VECTOR_SIZE = 60
6  PERIOD_NUMBER = 5
7
8  # loading Rx vector from file and...
9  Rx = np.load('TxSignal.npy')
10
11 # .. plotting it
12 plt.plot(Rx)
13 plt.grid()
14 plt.show()
15
16 # splitting vector into time slots corresponding to single periods
17 RxPeriods = np.reshape(Rx, shape: (PERIOD_NUMBER, PERIOD_VECTOR_SIZE))
18
19 # plotting periods one by one
20 for i, RxPeriod in enumerate(RxPeriods):
21     plt.plot(RxPeriod)
22     plt.title(f'period:{i}')
23     plt.grid()
24     plt.show()
```

periods
SIZE))

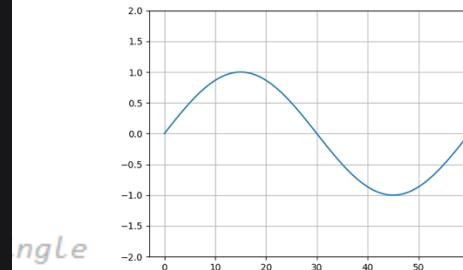
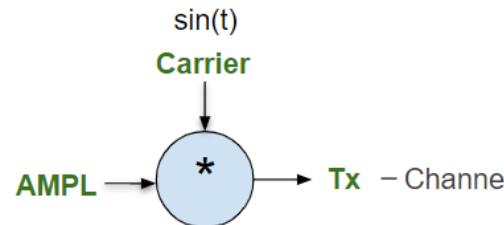


Single sinewave: demodulation: dot product and normalization

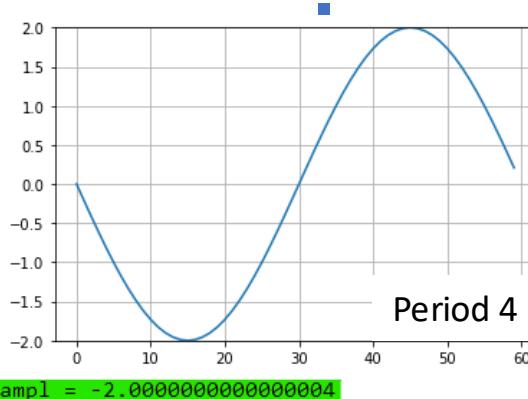
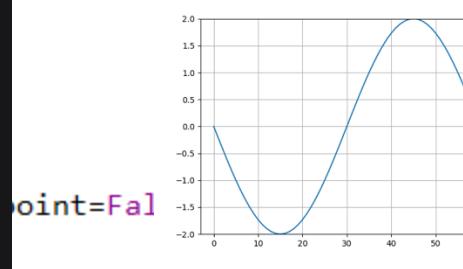
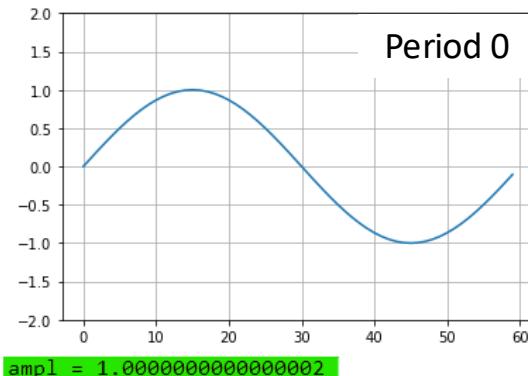
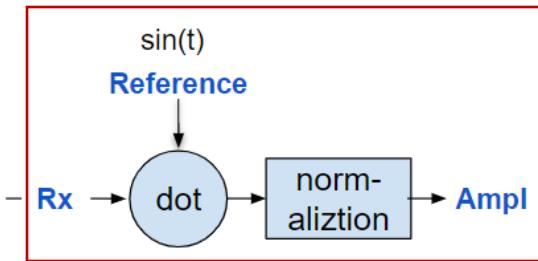
The previous script has been extended with amplitude decoding.

Complete the script to print amplitudes.

```
 1 import numpy as np
 2 > import ...
 3 pi = np.pi
 4
 5 # parameters
 6 PERIOD_VECTOR_SIZE = 60
 7 PERIOD_NUMBER = 5
 8
 9 # loading Rx vector from file and...
10 Rx = np.load('TxSignal.npy')
11
12 # .. plotting it
13 plt.plot(Rx)
14 plt.grid()
15 plt.show()
16
17 # splitting vector into time slots corresponding to single periods
18 RxPeriods = np.reshape(Rx, newshape=(5,60))
19
20 # rx time
21 for RxPeriod in RxPeriods:
22     # plotting
23     plt.plot(RxPeriod)
24     plt.ylim(*args: -2,2)
25     plt.grid()
26     plt.show()
27     # decoding
28     t = np.linspace(start=0, 2*pi, PERIOD_VECTOR_SIZE, endpoint=False)
29     Ref = np.sin(t)
30     dot = np.dot(RxPeriod,Ref)
31     ampl = dot/PERIOD_VECTOR_SIZE*2
32     print(f'ampl = {ampl:0.2f}'
```



ampl = 1.00



Single sinewave: Demodulation: Dot product and normalization, cont.

This script is a modified version of the script from previous slide.

It is expected to print amplitudes in a form of single vector (list).

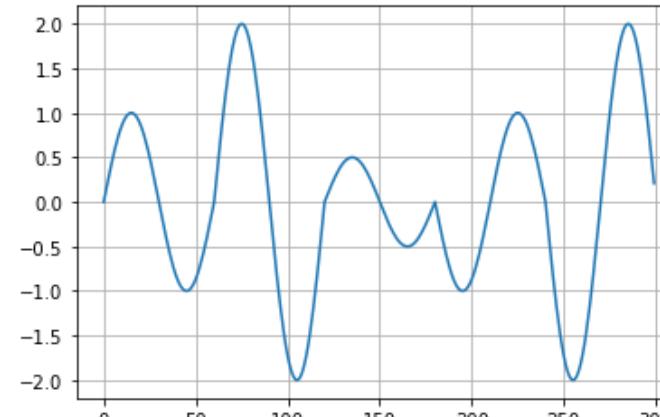
Complete it to get result as shown below.

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 pi = np.pi
4
5 # parameters
6 PERIOD_VECTOR_SIZE = 60
7 PERIOD_NUMBER = 5
8
9 # loading Rx vector from file and...
10 Rx = np.load('TxSignal.npy')
11
12 # ... plotting it
13 plt.plot(Rx)
14 plt.grid()
15 plt.show()
16
17 # splitting vector into time slots corresponding to single periods
18 RxPeriods = np.reshape(Rx, shape=(5,60))
19
20 # decoding amplitudes of Rx time slots
21
22 a_list = [] # create amplitude list
23 for RxPeriod in RxPeriods:
24     # decode amplitude and append it to list
25     # use as many code rows as you need
26     t = np.linspace(start=0, 2*pi, PERIOD_VECTOR_SIZE, endpoint=False)
27     Ref = np.sin(t)
28     dot = np.dot(RxPeriod, Ref)
29     ampl = dot / np.dot(Ref, Ref)
30     a_list.append(ampl)
31
32 np.set_printoptions(precision=16, legacy='1.13') # set print options
33 print(a_list) # print list
```

[1.0, 2.0, 0.5, -1.0, -2.0]

onding to single periods

list

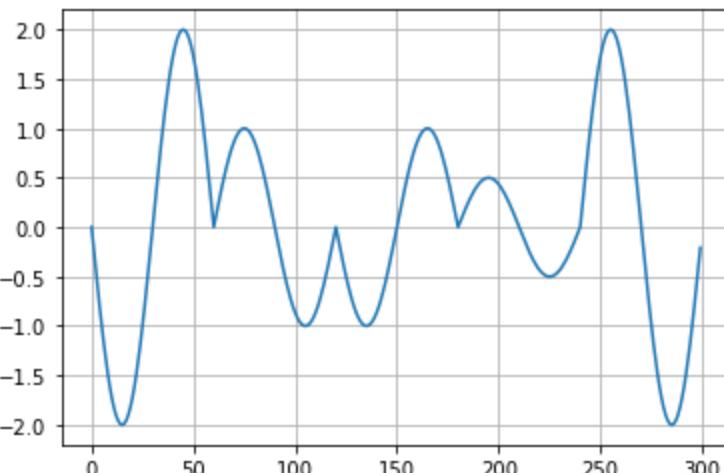


[1.0000000000000002, 2.0000000000000004, 0.5000000000000001, -1.0000000000000002, -2.0000000000000004]

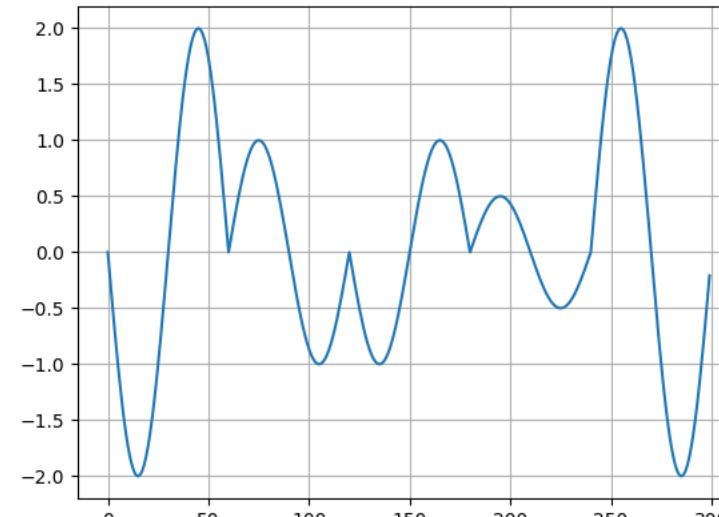
Single sinewave: Demodulation: Dot product and normalization, cont.

Use previous script to decode signal from “TxSignal_Exercise.npy” file.

Result should look as follow.

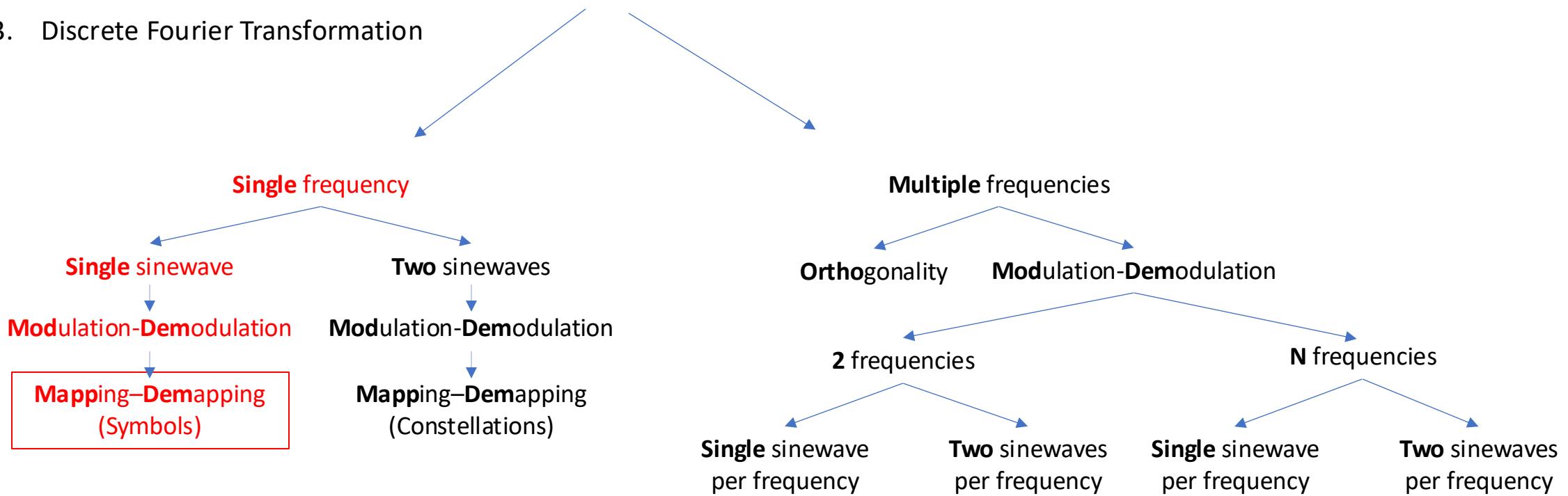


`[-2.00000000000004, 1.00000000000002, -1.00000000000002, 0.50000000000001, 2.00000000000004]`



`[-2.0, 1.0, -1.0, 0.5, 2.0]`

1. Sinewaves orthogonality
 2. Orthogonal sinewaves amplitude modulation
 3. Discrete Fourier Transformation



Copy following scripts

2_OrthogonalSinewavesAmplitudeModulation\1_SingleFrequency\1_SingleSineWave\1_Modulation.py

2_OrthogonalSinewavesAmplitudeModulation\1_SingleFrequency\1_SingleSineWave\2_Demodulation_Step3_AmplitudeDecodingVector.py

to directory:

2_OrthogonalSinewavesAmplitudeModulation\1_SingleFrequency\1_SingleSineWave\3_MappingDemapping

and then rename copied file:

- 1_Modulation.py -> **1_Modulate.py**
- 2_Demodulation_Step3_AmplitudeDecodingVector.py -> **2_Demodulate.py**

Recall the functionalities above scripts.

Run **1_Modulate.py** and then **2_Demodulate.py**.

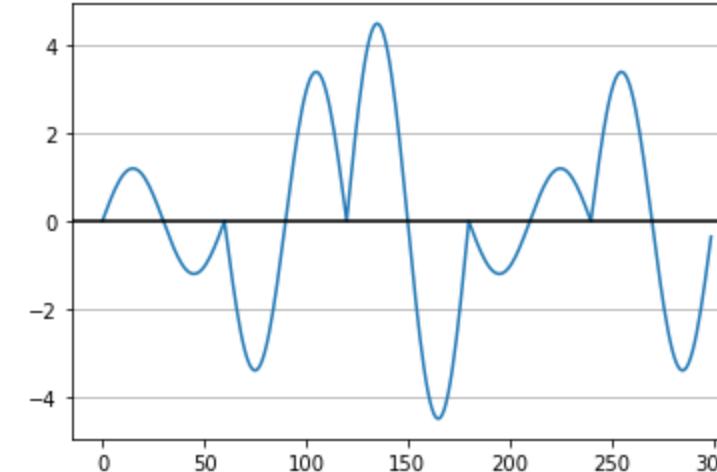
Check whether **2_Demodulate.py** prints **AMPL_VECTOR** from **1_Modulate.py**

preparations : mod-demod scripts merging

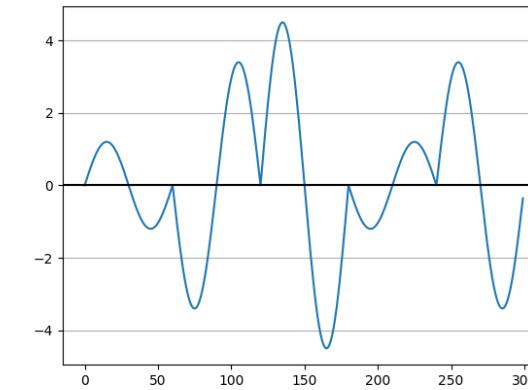
Merge **Modulate_1.py** and **Demodulate_2.py** in single script **3_ModDemod.py**

Remove ALL redundant code

```
1  import numpy as np
2  import matplotlib.pyplot as plt
3  pi = np.pi
4  # PARAMETERS
5  TIME_VECTOR_SIZE = 60
6  AMPL_VECTOR = (1.2, -3.4, 4.5, -1.2, 3.4)
7  # CALCULATION
8  t = np.linspace(start=0, stop=2*pi, num=TIME_VECTOR_SIZE, endpoint=False)
9  # modulation
10 Carrier = np.sin(t)
11 Tx = np.array([])
12 for amp in AMPL_VECTOR:
13     Tx = np.append(Tx, amp * Carrier)
14 # channel
15 Rx = Tx # ideal one
16 # demodulation
17 RxPeriods = np.reshape(Rx, shape=(5,12))
18 amplitudes_l = [] # create amplitude list
19 for RxPeriod in RxPeriods:
20     Ref = np.sin(t)
21     dot = np.dot(RxPeriod, Ref)
22     ampl = dot / np.dot(Ref, Ref)
23     amplitudes_l.append(ampl)
24 # PRESENTATION
25 # Tx plot
26 plt.plot(Tx)
27 plt.axhline(y=0, color='black')
28 plt.grid(axis='y')
29 plt.show()
30 #
31 np.set_printoptions(precision=16, legacy='1.25')
32 print(f'received amplitudes: {amplitudes_l}')
```



received amplitudes: [1.2, -3.4, 4.5, -1.2, 3.4]



received amplitudes: [1.2, -3.4, 4.5, -1.2, 3.4]

Copy **ModDemod.py** to **4_ModDemod_BySingleNumber.py**

At present version, the script first modulates all five numbers and after that demodulates them.

Modify **4_ModDemod_BySingleNumber.py** to modulate and demodulate per single number (reduce loops to one)

Add **perfect channel** between modulation and demodulation.

Decrease transmitted numbers to 4

Plot sinewave corresponding to the last number only (plt.plot(Rx) after loop)

Remove ALL redundant code

Before refactoring

```
# modulation
for ... all five numbers:
    ...
    # demodulation
```

```
for ... all five numbers:
    ...
    # demodulation
```

After refactoring

```
for ... all five numbers:
```

```
    # modulation
```

```
    ...
    # perfect channel
```

```
Rx = Tx
```

```
    # demodulation
```

```
    ...
    # PRESENTATION
```

```
    # Tx plot
    plt.plot(Rx)
    plt.axhline(0, color='red')
    plt.grid(True)
    plt.show()
```

```
    # ...
    np.set_printoptions(precision=3, suppress=True)
```

```
    print(f'result = {result}')
```

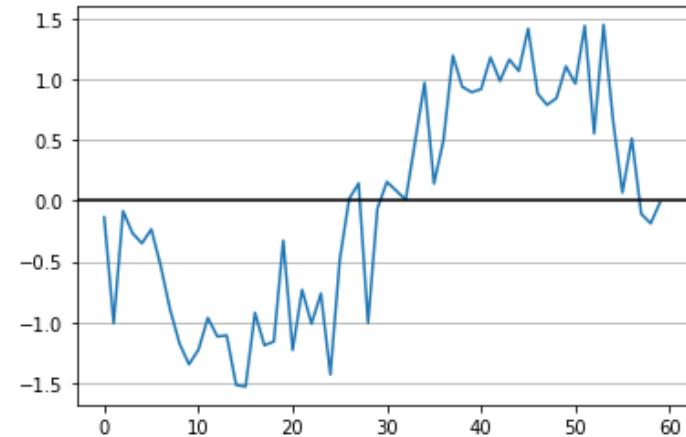
Copy `4_ModDemod_BySingleNumber.py` to `5.1_ModDemod_RealChannel.py`

Add **normal distribution noise** to channel (`numpy.random.normal`)

Set distribution center location at 0, deviation to 0.3 and size accordingly to Tx length

Remove redundant code

Run the script to see noise on the sine



Add **error calculation and printing**.

```
received amplitudes: [1.2321601568330671, -3.4773478822319728, 4.447983206633805, -1.1685442767382594]
errors      : [-0.03216016  0.07734788  0.05201679 -0.03145572]
```

To do that calculate difference between send and received amplitudes

Hint: before subtraction convert list of received amplitudes to numpy array

```
1  > import ...
2  pi = np.pi
3  # PARAMETERS
4  TIME_VECTOR_SIZE = 60
5  AMPL_VECTOR = (1.2, -3
6  # CALCULATION
7  t = np.linspace( start: 60, stop: 60, num: 60)
8  Carrier = np.sin(t)
9  amplitudes_l = []
10
11 for amp in AMPL_VECTOR:
12     # modulation
13     Tx = amp*Carrier
14     # channel
15     Rx = Tx + np.random.normal(0, 0.3, TIME_VECTOR_SIZE)
16     # demodulation
17     dot = np.dot(Rx, Carrier)
18     ampl = dot / np.dot(Carrier, Carrier)
19     amplitudes_l.append(ampl)
20
21 amplitudes_l
22 amplitudes_l = np.array(amplitudes_l)
23 errors = amplitudes_l - AMPL_VECTOR
24
25 # PRESENTATION
26 # Tx plot
27 plt.plot(Rx)
28 plt.axhline(y=0, color='black')
29 plt.grid(axis='y')
30 plt.show()
31
32 #
33 np.set_printoptions(pr
34 print(f'received amplitudes: {amplitudes_l}')
35 print(f'errors: {errors}')
36
37 print(f'errors: {errors}'
```

real channel : noise deviation

Copy `5.1_ModDemod_RealChannel.py` to `5.2_ModDemod_Ranges.py`

Add parameter `NOISE_DEVIATION` to define “scale” argument of the “normal” function and set it to 1.

Increase number of transmission to 100 (single numbers)

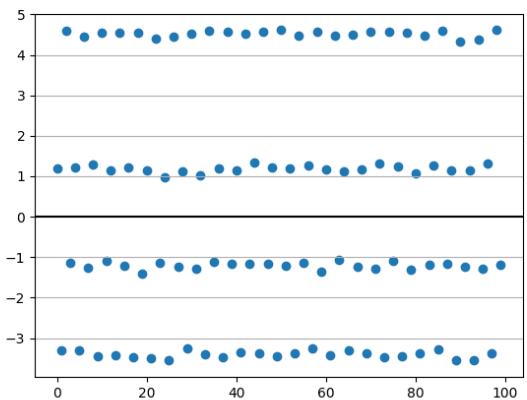
Hint:

```
for i in range(TANSMISION_NR):  
    amp = AMPL_VECTOR[i%4]
```

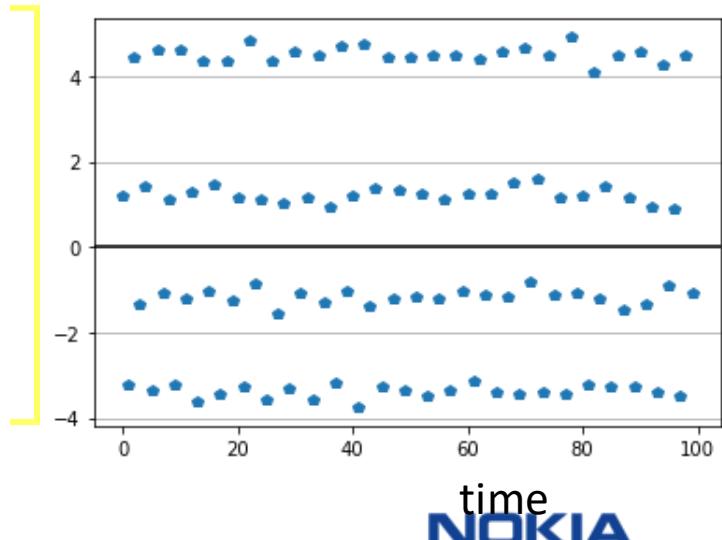
Plot received numbers versus time for the noise deviations: 0.5 and 2 and place below

Remove redundant code (error calculation)

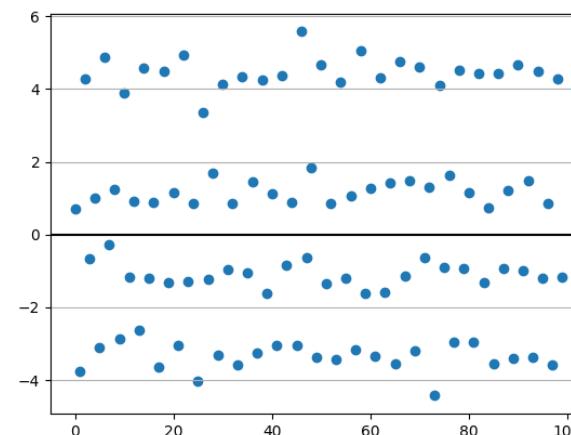
dev=0.5



dev=1



dev=2



```
1  > import ...  
2  pi = np.pi  
3  # PARAMETERS  
4  TIME_VECTOR_SIZE = 60  
5  AMPL_VECTOR = (1.2, -3.4, 4.5,  
6  # CALCULATION  
7  t = np.linspace(start=0, 2*pi,  
8  Carrier = np.sin(t)  
9  amplitudes_l = []  
10 NOISE_DEVIATION = 2  
11 TRANSMISSION_NR = 100  
12  
13  
14 for i in range(TRANSMISSION_NR):  
15     amp = AMPL_VECTOR[i % 4]  
16     # modulation  
17     Tx = amp*Carrier  
18     # channel  
19     Rx = Tx + np.random.normal(0, NOISE_DEVIATION, TIME_VECTOR_SIZE)  
20     # demodulation  
21     dot = np.dot(Rx, Carrier)  
22     ampl = dot / np.dot(Carrier, Carrier)  
23     amplitudes_l.append(ampl)  
24  
25 # PRESENTATION  
26 # Tx plot  
27 plt.scatter(range(TRANSMISSION_NR), amplitudes_l)  
28 plt.axhline(y=0, color='black')  
29 plt.grid(axis='y')  
30 plt.show()  
31 #  
32 np.set_printoptions(precision=2)
```

Observations

In practice, one can not transfer numbers in reliable way directly as amplitudes of sinewave.

For a given noise deviation received amplitudes values are dispersed within a certain range.

So, one sends **specific values** but receives values in **specific range**.

Unlike the number of values, the **number of ranges is limited**.

Question

What is the relationship between noise deviation and number of nonoverlapping ranges?

Assume ranges are distributed evenly.

Give descriptive answer. The relationship between noise deviation and number of nonoverlapping ranges is that as the noise deviation increases , there is a higher possibility that the noisy amplitudes will overlap with neighbouring ranges. As a result, the number of non-overlapping ranges decreases.

noise deviation vs. amplitudes symbol number

Conclusion

We can send only **limited set of values** (amplitudes), and the number of values in the set depends on noise deviation. The elements of that set are called **symbols**.

Code Refactoring

Copy `5.2_ModDemodRanges.py` to `5.3_ModDemodRangesColor.py`

Set `AMPL_VECTOR` to `(1, 2, 3, 4)`

Modify amplitudes plot to draw each symbol with unique color.

Use list indexing.

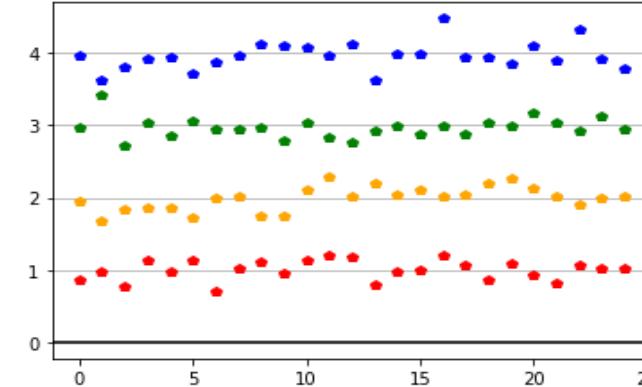
```
# Tx plot
plt.plot(amplitudes_1[.....], 'p', color='red') # each first
plt.plot(amplitudes_1[.....], 'p', color='orange') # each second
plt.plot(amplitudes_1[.....], 'p', color='green') # each third
plt.plot(amplitudes_1[.....], 'p', color='blue') # each fourth
```

Exercise

Use the script to estimate noise deviation acceptable for 8 symbols (amplitudes).

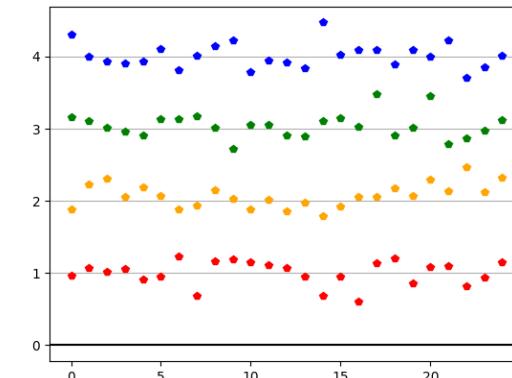
Assume we are limited to same amplitude range.

NOISE_DEVIATION = 1



Estimation of acceptable noise dev.
0.5 both directions

```
> import ...
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
# PRESENTATION
# Tx plot
plt.plot(*args: amplitude)
plt.plot(*args: amplitude)
plt.plot(*args: amplitude)
plt.plot(*args: amplitude)
plt.axhline(y=0,color='b')
plt.grid(axis='y')
plt.show()
#
np.set_printoptions(prec
```



symbol-amplitude mapping

Symbol-amplitude mapping

Usually, symbols have a form a set of bits.

Each combination is assigned to specific amplitude (Tx) and amplitude range (Rx).

Tables on the right show examples of symbol-amplitude mapping

for 2, 4 and 8 symbol transmission schemes for constant amplitude range (c.a. 0.0-5.0)

To transmit specific bitstream one must divide it to groups of bits

of the size appropriate for size of the symbol .

Example

Data to transfer: byte **00100111**: (lsb first)

Transmission scheme: 4 symbols

Symbol: Tx ampl. : Rx range

- 11: 2.0: 1.75-2.25
- 01: 1.0: 0.75-1.25
- 10: 1.5: 1.25-1.75
- 00: 0.5: 0.25-0.75

2 symbols

symbol	Tx amplitude	Rx amplitude range
0	1	0.5 - 1.5
1	2	1.5 - 2.5

4 symbols

symbol	Tx amplitude	Rx amplitude range
00	0.5	0.25 - 0.75
01	1.0	0.75 - 1.25
10	1.5	1.25 - 1.75
11	2.0	1.75 - 2.25

8 symbols

symbol	Tx amplitude	Rx amplitude range
000	0.25	0.125 - 0.375
001	0.50	0.375 - 0.625
010	0.75	0.625 - 0.875
011	1.00	0.875 - 1.125
100	1.25	1.125 - 1.375
101	1.50	1.375 - 1.625
110	1.75	1.625 - 1.875
111	2.00	1.875 - 2.125

symbol-amplitude mapping : exercise

Exercise

Fulfill table with symbols and amplitudes by using 8 symbol Tx scheme

Data to transfer: byte 00100111110011111100111 : (lsb first)

Cheat sheet

8 symbols

symbol	Tx amplitude	Rx amplitude range
000	0.25	0.125 - 0.375
001	0.50	0.375 - 0.625
010	0.75	0.625 - 0.875
011	1.00	0.875 - 1.125
100	1.25	1.125 - 1.375
101	1.50	1.375 - 1.625
110	1.75	1.625 - 1.875
111	2.00	1.875 - 2.125

symbol	Tx amplitude	Rx amplitude range
111	2.00	1.875 - 2.125
100	1.25	1.125 - 1.375
111	2.00	1.875 - 2.125
011	1.00	0.875 - 1.125
110	1.75	1.625 - 1.875
111	2.00	1.875 - 2.125
001	0.50	0.375 - 0.625
001	0.50	0.375 - 0.625

Symbol-Amplitude mapping: mapping functions verification : “symbol_to_amplitude”

In the next exercises we will use readymade functions for “symbol-amplitude” mapping.

The functions make mapping between 2, 4 and 8 symbols amplitudes in range from -1 to 1.

They are collected in `mapper_lib.py` file so to take advantage of them you need to import them into your script.

Examine the content of `mapper_lib.py`

Below script plots mapping from symbol to amplitude for 4 symbols scheme.

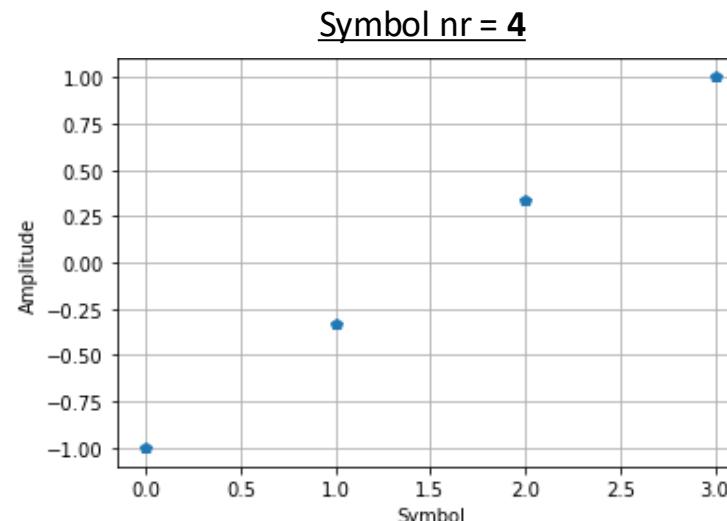
Generate plots for remaining symbol numbers (put them on this slide).

```
import numpy as np
import matplotlib.pyplot as plt
from mapper_lib import symbol_to_ampl

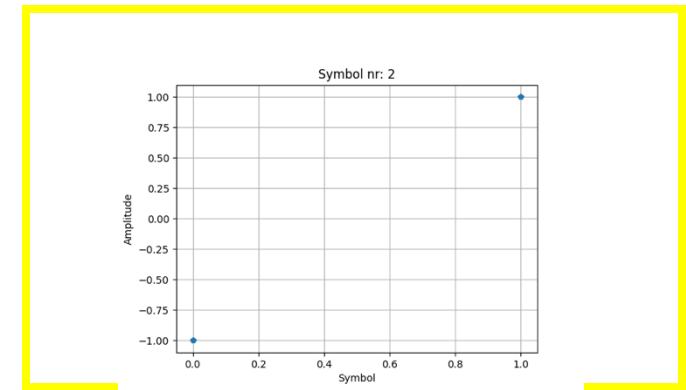
SYMBOL_NR = 4

symbols_1 = range(SYMBOL_NR)
ampl_1 = list()
for symbol in symbols_1:
    ampl = symbol_to_ampl(SYMBOL_NR, symbol)
    ampl_1.append(ampl)
plt.plot(symbols_1, ampl_1, '-p')

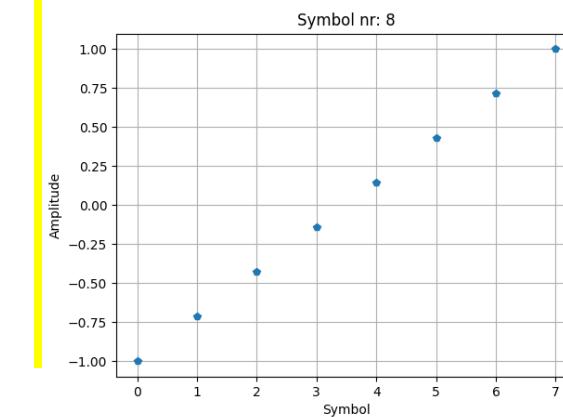
plt.grid()
plt.title(f'Symbol nr: {SYMBOL_NR}')
plt.xlabel('Symbol')
plt.ylabel('Amplitude')
```



Symbol nr = 2



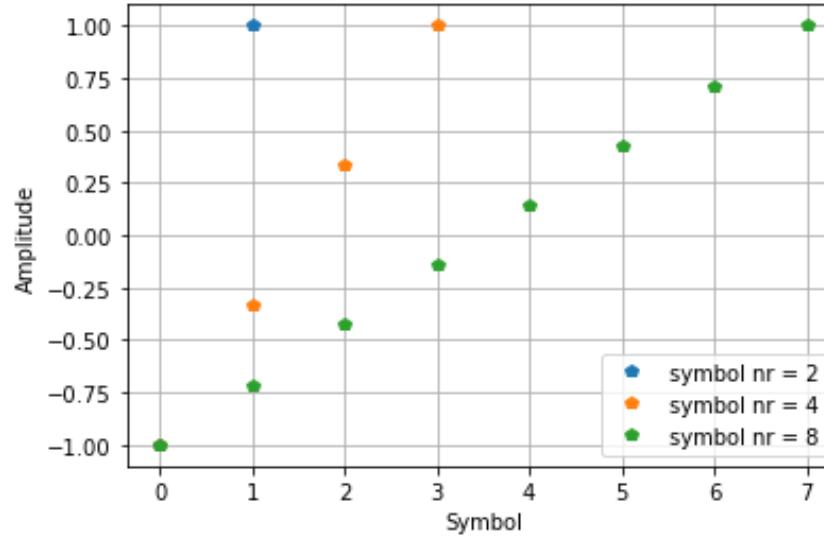
Symbol nr = 8



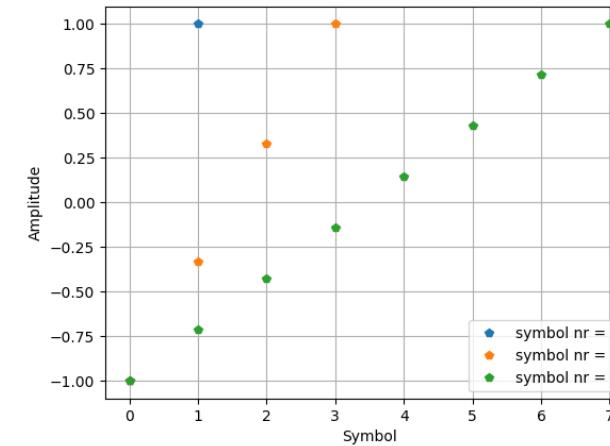
Symbol-Amplitude mapping: mapping functions verification : “symbol_to_amplitude” cont.

Complete below script to plot mapping from symbol to amplitude for transmission schemes with symbol number equals to 2, 4 and 8

```
for symbol_nr in 2,4,8:  
    symbols_l = range(...)  
    ampl_l = list()  
    for symbol in symbols_l:  
        ampl = symbol_to_ampl(symbol_nr,symbol)  
        ampl_l.append(ampl)  
    plt.plot(symbols_l,ampl_l,'p', label=...)  
  
plt.legend()  
plt.grid()  
plt.xlabel('Symbol')  
plt.ylabel('Amplitude')
```



```
1 import numpy as np  
2 import matplotlib.pyplot as plt  
3 from mapper_lib import symbol_to_ampl  
4  
5 for symbol_nr in 2,4,8:  
6     symbols_l = range(8)  
7     ampl_l = list()  
8     for symbol in symbols_l:  
9         ampl = symbol_to_ampl(symbol_nr,symbol)  
10        ampl_l.append(ampl)  
11    plt.plot(*args: symbols_l,ampl_l,'p', label=f'symbol nr = {symbol_nr}')  
12  
13 plt.legend()  
14 plt.grid()  
15 plt.xlabel('Symbol')  
16 plt.ylabel('Amplitude')  
17 plt.show()
```



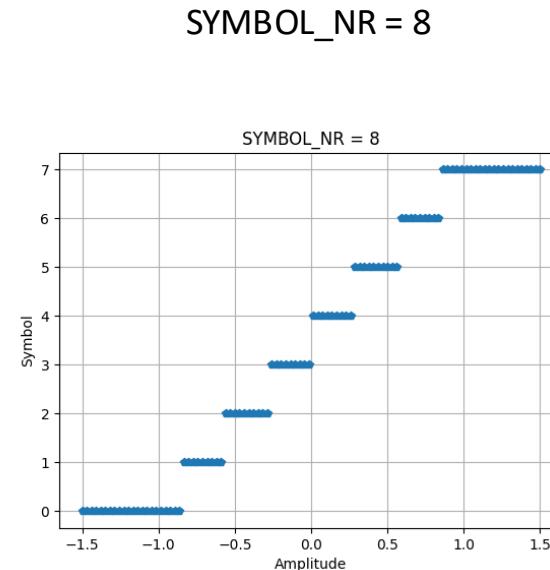
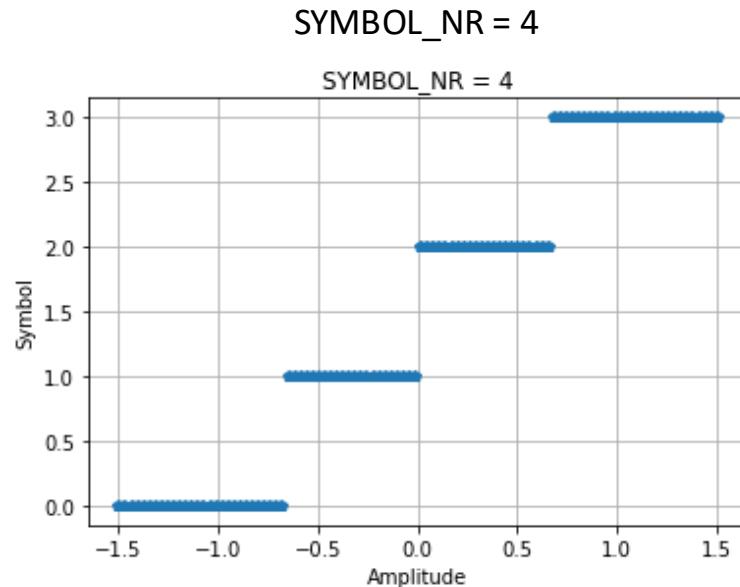
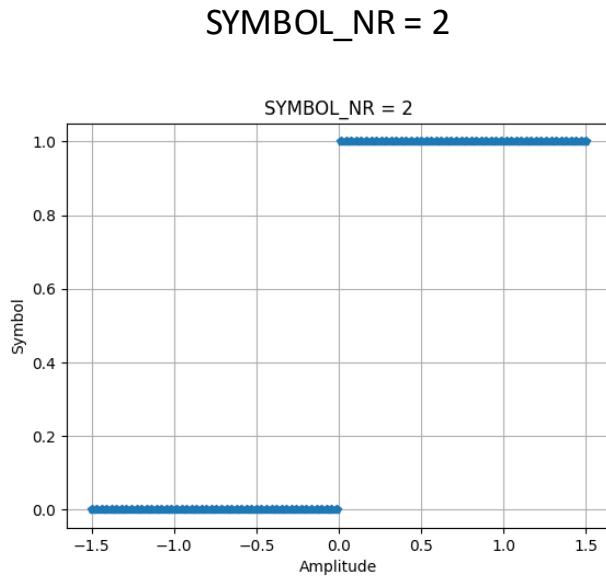
Symbol-Amplitude mapping: mapping functions verification : “amplitude_to_symbol”

Base one of the previous script write script for plotting mapping form amplitude to symbol.

Name the script **6.2.1_Maping_AmplToSymbol_Single.py**.

Parametrize transmission scheme: “SYMBOL_NR = ...” in the beginning of script.

Use the script to add missing figures.

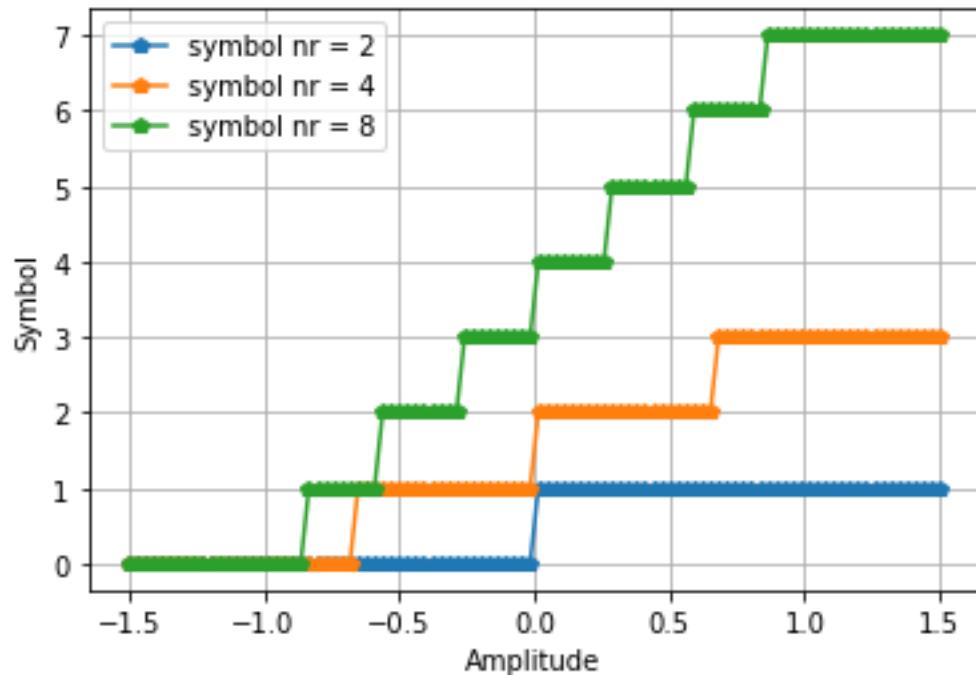


```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 from mapper import amplitude_to_symbol
4
5 SYMBOL_NR = 2
6
7 symbols_l = list(range(SYMBOL_NR))
8 ampl_l = np.linspace(-1.5, 1.5, 1000)
9 for ampl in ampl_l:
10     symbol = amplitude_to_symbol(ampl, SYMBOL_NR)
11     symbols_l.append(symbol)
12 symbols_l = np.array(symbols_l)
13
14 plt.plot(ampl_l, symbols_l, 'bo')
15 plt.grid()
16 plt.title(f'SYMBOL_NR = {SYMBOL_NR}')
17 plt.xlabel('Amplitude')
18 plt.ylabel('Symbol')
19 plt.show()
```

Symbol-Amplitude mapping: mapping functions verification : “amplitude_to_symbol” cont.

Base one of the previous script write script to plot figure as below.

Name the script `6.2.2_Mapling_AmplToSymbol_Multiple.py`.



```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 from mapper_lib import ampl_to_symbol
4
5 for symbol_nr in 2, 4, 8:
6     ampl_l = np.linspace(-1.5, 1.5, num=100)
7     symbols_l = list()
8     for ampl in ampl_l:
9         symbol = ampl_to_symbol(symbol_nr, ampl)
10        symbols_l.append(symbol)
11    plt.plot(*args: ampl_l, symbols_l, '-p', label=f'symbol nr = {symbol_nr}')
12
13 plt.legend()
14 plt.grid()
15 plt.xlabel('Symbol')
16 plt.ylabel('Amplitude')
17 plt.show()
```

Symbols transmission and reception

Complete below script to make given number of **transmissions\receptions** by using given number of **symbols** in the presence of given **noise distribution**

```
1  import numpy as np
2  from mapper_lib import symbol_to_ampl
3  from mapper_lib import ampl_to_symbol
4
5  # PARAMETERS
6  TIME_VECTOR_SIZE = 60
7  TRANSMISONS_NR = 10
8
9  NOISE_DEVIATION = 2.0
10 SYMBOL_NR = 4
11
12 t = np.linspace( start: 0, 2*np.pi,TIME_VECTOR_SIZE, endpoint=False)
13 Carrier = np.sin(t)
14 Ref = Carrier
15
16 # TRANSMISSION-RECEPTION
17 symbols_tx = np.random.randint( low: 0,SYMBOL_NR,TRANSMISONS_NR)
18 symbols_rx = list()
19 for symbol in symbols_tx:
20     # modulation
21     ampl = symbol_to_ampl(SYMBOL_NR,symbol)
22     Tx = ampl*Carrier
23     # real channel
24     Rx = Tx + np.random.normal( loc: 0,NOISE_DEVIATION,TIME_VECTOR_SIZE)
25     # demodulation
26     ampl = (np.dot(Rx,Ref)/TIME_VECTOR_SIZE)*2
27     symbol = ampl_to_symbol(SYMBOL_NR, |ampl|)
28
29     symbols_rx.append(symbol)
30
31 # PRESENTATION
32 symbols_rx = np.array(symbols_rx) # list to numpy array
33
34 # print('symbols_rx')
35 print('\n symbols_rx\n:', symbols_tx)
36 errors = symbols_rx != symbols_tx
37 print('\n errors:\n', errors)
38 print('\n errors nr:', sum(symbols_rx != symbols_tx))
```

Typical result

```
symbols_rx
: [3 2 2 1 0 0 2 3 2 1]

errors:
[False False False  True False False  True False  True False]

errors nr: 3
```

Observe results while changing NOISE_DEVIATION and SYMBOL_NR

Symbols transmission and reception, error number v.s. noise deviation

Save previous script as **7.2_ModDemodSymbols_ErrorRate_vs_Noise_Print.py**.

Modify it to evaluate transmission error for given range of noise deviation (see exemplary result below).

Set TRANSMISSIONS_NR to 1000

Use the script to add missing results below.

SYMBOL_NR = 2

```
noise dev : errors nr
0.00 : 0
0.22 : 0
0.44 : 0
0.67 : 0
0.89 : 0
1.11 : 0
1.33 : 0
1.56 : 0
1.78 : 0
2.00 : 4
```

SYMBOL_NR = 4

```
noise dev : errors nr
0.00: 0
0.22: 0
0.44: 0
0.67: 3
0.89: 36
1.11: 70
1.33: 141
1.56: 169
1.78: 238
2.00: 269
```

SYMBOL_NR = 8

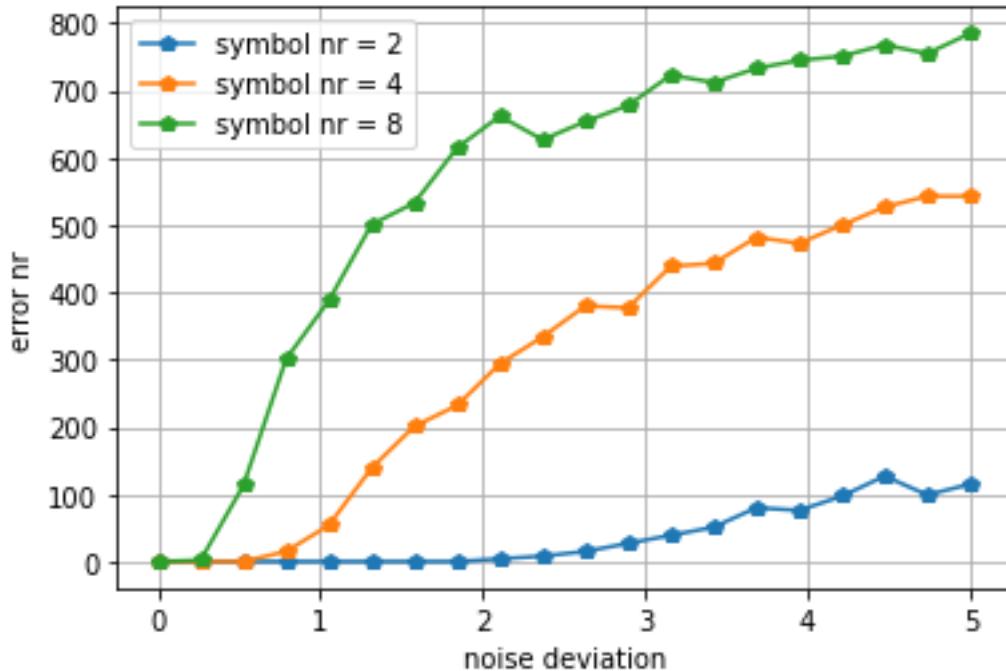
```
noise dev : errors nr
0.00 : 0
0.22 : 1
0.44 : 58
0.67 : 188
0.89 : 339
1.11 : 435
1.33 : 474
1.56 : 547
1.78 : 572
2.00 : 601
```

```
1 import numpy as np
2 from mapper_lib import symbol_to_ampl
3 from mapper_lib import ampl_to_symbol
4
5 # PARAMETERS
6 TIME_VECTOR_SIZE = 60
7 TRANSMISSIONS_NR = 1000
8 NOISE_DEVIATION = 2.0
9 SYMBOL_NR = 2
10 t = np.linspace(start=0, 2 * np.pi, TIME_VECTOR_SIZE, endpoint=False)
11 Carrier = np.sin(t)
12 Ref = Carrier
13 noise_dev_list = list()
14 # TRANSMISSION-RECEPTION
15 for noise_dev in np.linspace(0, NOISE_DEVIATION, 10):
16     symbols_tx = np.random.randint(low=0, SYMBOL_NR, TRANSMISSIONS_NR)
17     symbols_rx = list()
18     error_nr = 0
19     for symbol in symbols_tx:
20         symbol1 = symbol
21         # modulation
22         ampl = symbol_to_ampl(SYMBOL_NR, symbol)
23         Tx = ampl * Carrier
24         # real channel
25         Rx = Tx + np.random.normal(loc=0, noise_dev, TIME_VECTOR_SIZE)
26         # demodulation
27         ampl = (np.dot(Rx, Ref) / TIME_VECTOR_SIZE) * 2
28         symbol = ampl_to_symbol(SYMBOL_NR, ampl)
29         symbols_rx.append(symbol)
30
31         if symbol != symbol1:
32             error_nr += 1
33
34     noise_dev_list.append((noise_dev, error_nr))
35
36 # PRESENTATION
37 symbols_rx = np.array(symbols_rx) # list to numpy array
38
39 print('SYMBOL_NR:', SYMBOL_NR)
40 print('noise dev' + ' : ' + 'errors nr')
41 for noise_dev, error_nr in noise_dev_list:
42     print(f"{{noise_dev:.2f}} : {{error_nr}}")
```

Symbols transmission and reception, error number v.s. noise deviation, cont.

Save previous script as `7.3_ModDemodSymbols_ErrorRate_vs_Noise_Plot.py`.

Modify it to generate plots family as on the figure below



```
1 import matplotlib.pyplot as plt
2 import numpy as np
3 from mapper_lib import symbol_to_ampl
4 from mapper_lib import ampl_to_symbol
5
6 # PARAMETERS
7 TIME_VECTOR_SIZE = 60
8 TRANSMISSIONS_NR = 1000
9 NOISE_DEVIATION = 5
10 SYMBOL_NR = [2,4,8]
11 t = np.linspace(start=0, 2 * np.pi, TIME_VECTOR_SIZE, endpoint=False)
12 Carrier = np.sin(t)
13 Ref = Carrier
14 # TRANSMISSION-RECEPTION
15 for symbols in SYMBOL_NR:
16     noise_dev_list = list()
17     for noise_dev in np.linspace(0, NOISE_DEVIATION, 20):
18         symbols_tx = np.random.randint(low=0, symbols, TRANSMISSIONS_NR)
19         symbols_rx = list()
20         error_nr = 0
21         for symbol in symbols_tx:
22             symbol1 = symbol
23             # modulation
24             ampl = symbol_to_ampl(symbols,symbol)
25             Tx = ampl * Carrier
26             # real channel
27             Rx = Tx + np.random.normal(loc=0, noise_dev, TIME_VECTOR_SIZE)
28             # demodulation
29             ampl = (np.dot(Rx, Ref) / TIME_VECTOR_SIZE) * 2
30             symbol = ampl_to_symbol(symbols, ampl)
31             symbols_rx.append(symbol)
32             if symbol != symbol1:
33                 error_nr += 1
34     noise_dev_list.append((noise_dev, error_nr))
35 noise_dev_plot = [x[0] for x in noise_dev_list]
36 error_nr_plot = [x[1] for x in noise_dev_list]
37 plt.plot(*args: noise_dev_plot, error_nr_plot, '-p', label=f'symbol nr = {symbols}')
38 # PRESENTATION
39 symbols_rx = np.array(symbols_rx) # list to numpy array
40 plt.grid()
41 plt.legend()
42 plt.xlabel('noise deviation')
43 plt.ylabel('error nr')
44 plt.show()
```

Symbols transmission and reception, error number v.s. noise deviation, symbol nr selection

There are methods to discover and correct errors in received data, but they work correctly below certain error rate.

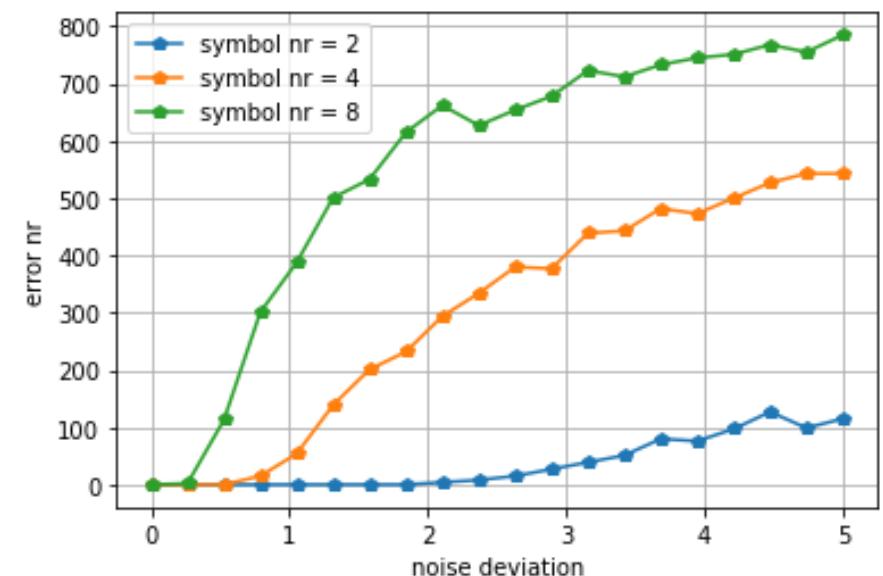
If error cannot be corrected data have to be retransmitted which is quiet time and power consuming.

Error rate depends on noise level which in turn depends on many factors like: distance to base station, weather conditions, buildings, and so on.

What's important, **noise level** (so error rate) can **change in time** so in order to guarantee **maximum transfer** rate at current conditions one has to use **symbol number** appropriate for current noise level.

If **symbol nr is too high** for current noise level (deviation) we get many errors and will have to make many retransmission which decrease effective transfer rate

If **symbol nr is too low** for current noise level (deviation) the number of errors will be low, but transfer will be also low so in practice we will be wasting possibilities given by channel.



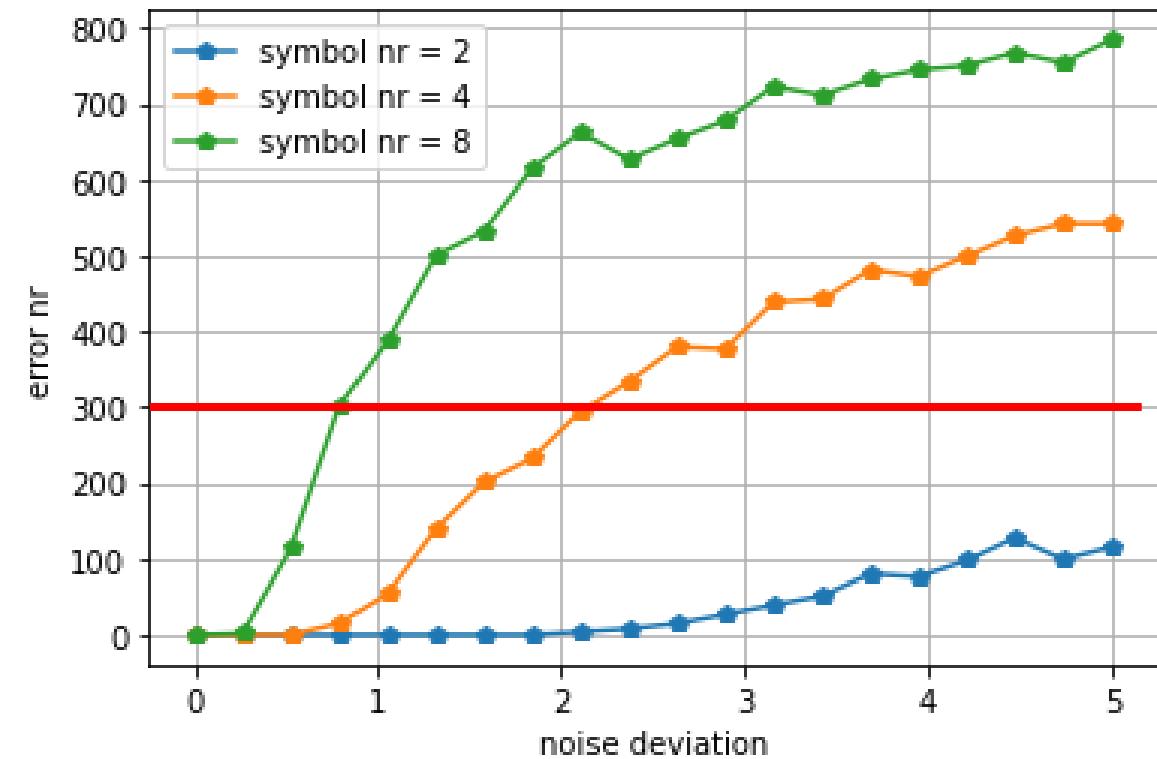
Symbols transmission and reception, error number v.s. noise deviation, **symbol nr selection - exercise**

As it was already said, to guarantee **maximum transfer rate** at current conditions one has to use **symbol number** appropriate for current noise level.

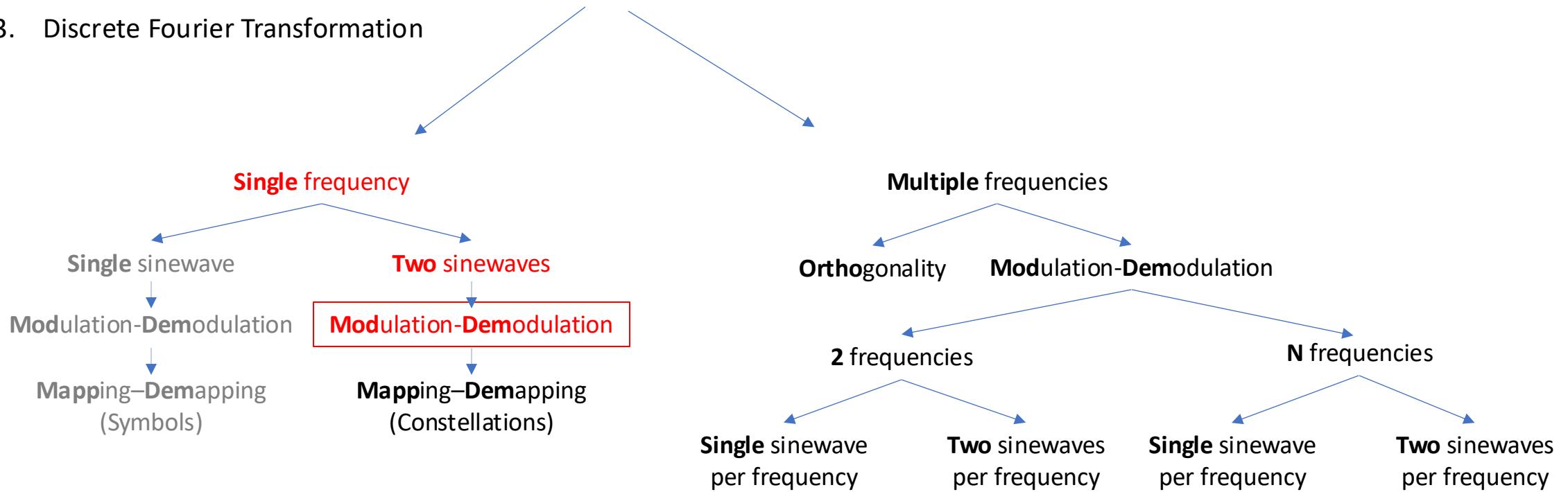
Base on figure below estimate acceptable and optimal symbol number for given:

- acceptable error number,
- noise deviation.

noise	acceptable symbol nr(s)	optimal symbol nr
3.0	2	2
2.0	2,4	4
0.5	2,4,8	8

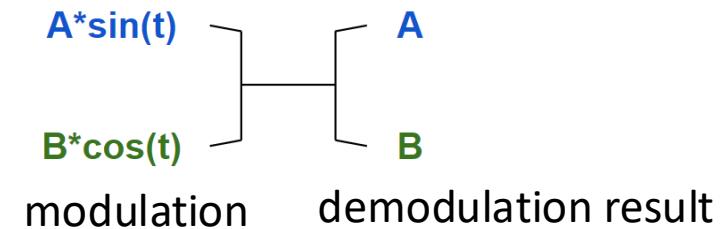
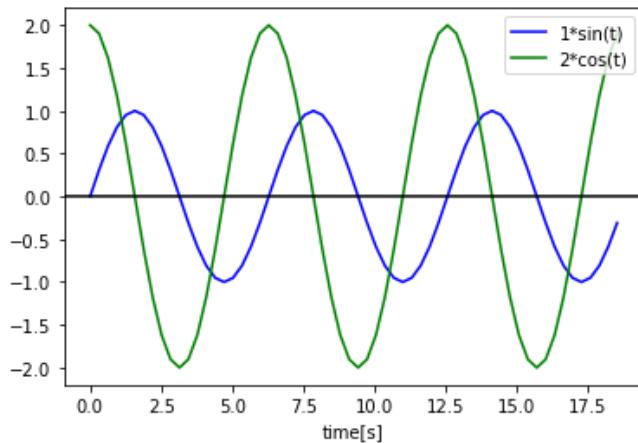


1. Sinewaves orthogonality
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation



Quadrature modulation: idea

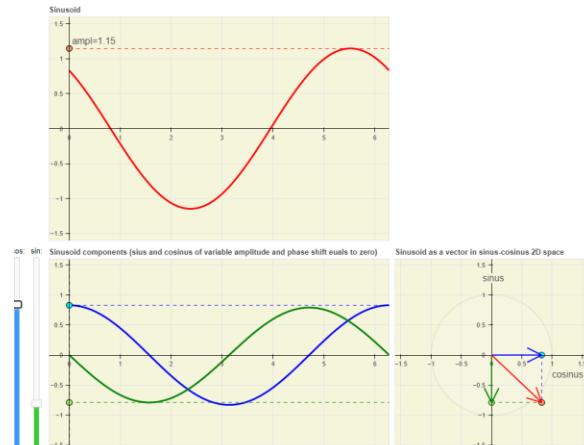
We know from previous slides that it is possible to transfer **two sinewaves** of the same frequency via **single channel (signal)** if sinewaves are **orthogonal**. It is the case for **$\pi/2$ shifted** sinewaves (**sine** and **cosines** for example)



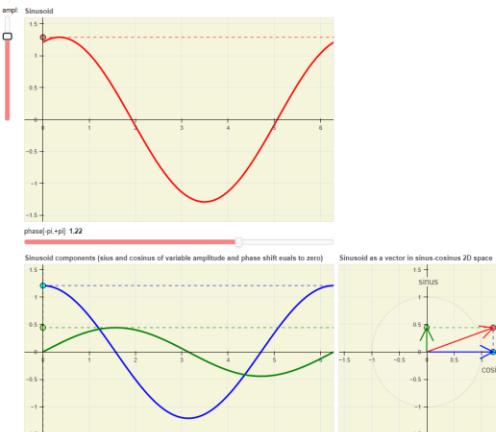
Such modulation of signal is called **quadrature modulation**. To see why please play with bellow interactive plots.

Do not hurry - take your time. 2_OrthogonalSinewavesAmplitudeModulation\1_SingleFrequency\2_TwoSineWaves\InteractivePresentations

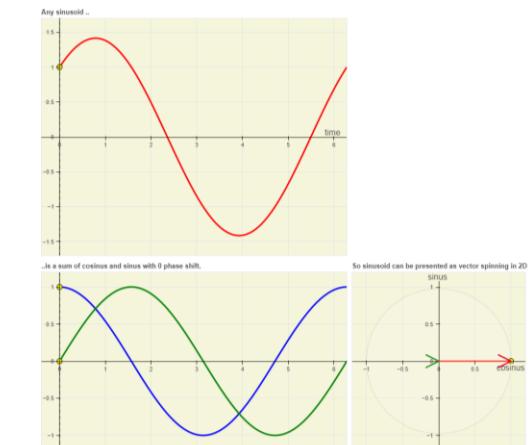
composition



decomposition



signal as a spinning vector



Quadrature modulation: idea

Use interactive plots from previous slide to answer following questions.

sinusoid_composition.html: find amplitude of sinus and cosinus to obtain sinusoid of amplitude 1.15 and phase 1.0

- ampl. sin: 0.97
- ampl. cos: 0.62

sinusoid_decomposition.html: find amplitude and phase of sinusoid of which is a sum of sinus of amplitude 0.5 and cosinus of amplitude 1.5

- sinusoid ampl.: 1.5811...
- sinusoid phase.: 1,249...

sinusoid_decomposition_spinning_vector.html: what are the vector angles at which sinus and cosinus have equal value

$\pi/4, 3\pi/4, 5\pi/4, 7\pi/4$

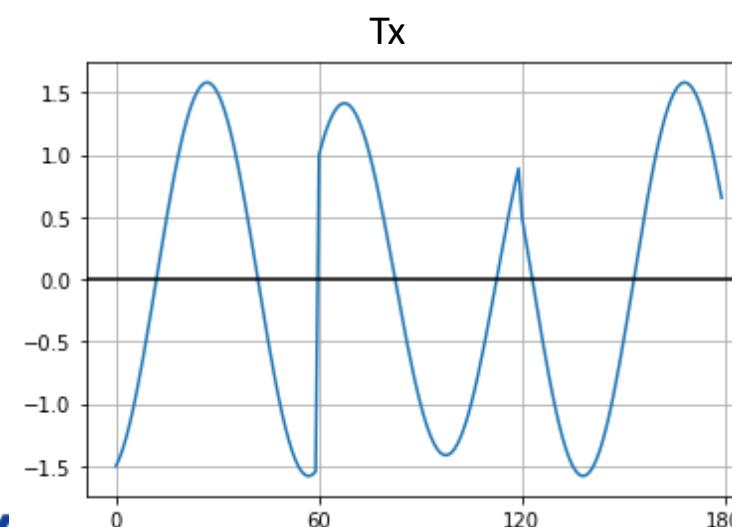
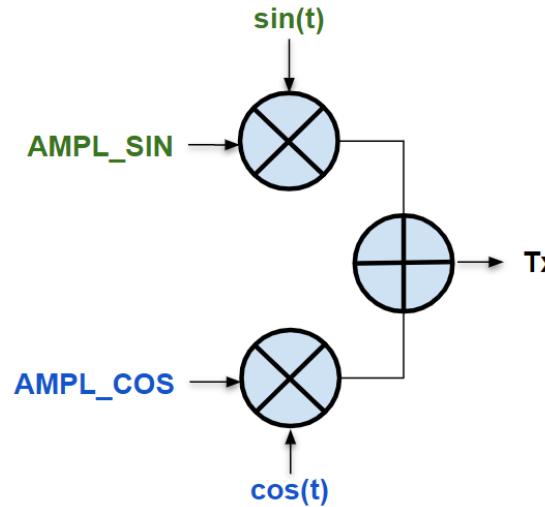
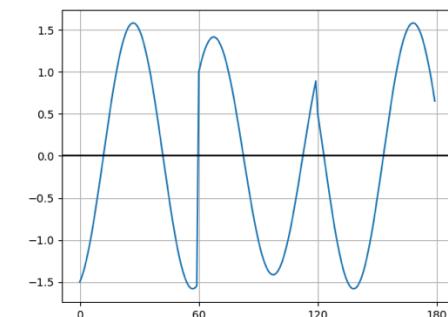
Quadrature modulation: implementation

Complete script to implement quadrature modulation. Result should look like on the waveform below.

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 pi = np.pi
4
5 # PARAMETERS
6 TIME_VECTOR_SIZE = 60
7
8 AMPL_VECTOR_SIN = ( 0.5, 1.0, -1.5)
9 AMPL_VECTOR_COS = (-1.5, 1.0, 0.5)
10
11 # CALCULATION
12 t = np.linspace( start: 0, 2*pi, TIME_VECTOR_SIZE, endpoint=False)
13
14 carrier_sin = np.sin(t)
15 carrier_cos = np.cos(t)
16
17 Tx = np.array([]) #empty time vector
18 for ampl_sin, ampl_cos in zip(AMPL_VECTOR_SIN, AMPL_VECTOR_COS):
19     TxSinglePeriod = ampl_sin * carrier_sin + ampl_cos * carrier_cos
20     Tx = np.append(Tx, TxSinglePeriod)
21
22 # PRESENTATION
23 plt.plot(Tx)
24 plt.axhline(y=0,color='black')
25 plt.xticks((0,1*60,2*60,3*60))
26 plt.grid()
27
28 plt.show()
29
30 # SAVING
31 np.save( file: 'TxSignal',Tx)
```

`t=False)`

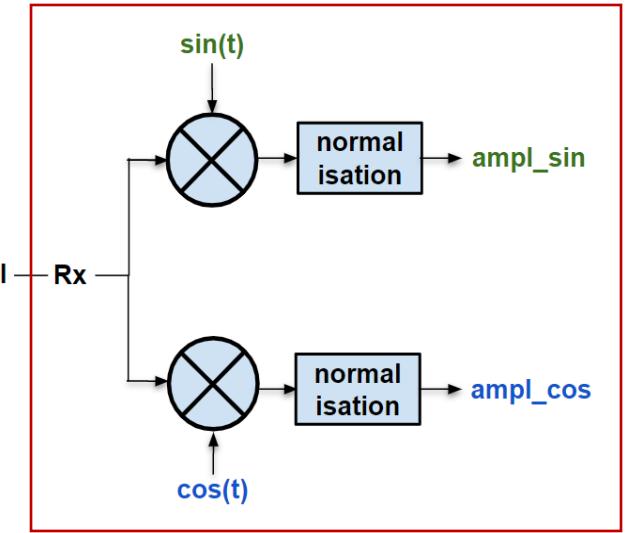
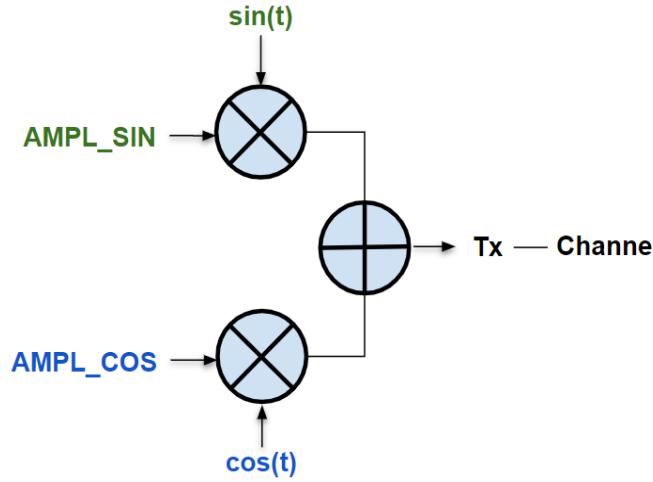
`PL_VECTOR_COS):`



Quadrature demodulation: implementation

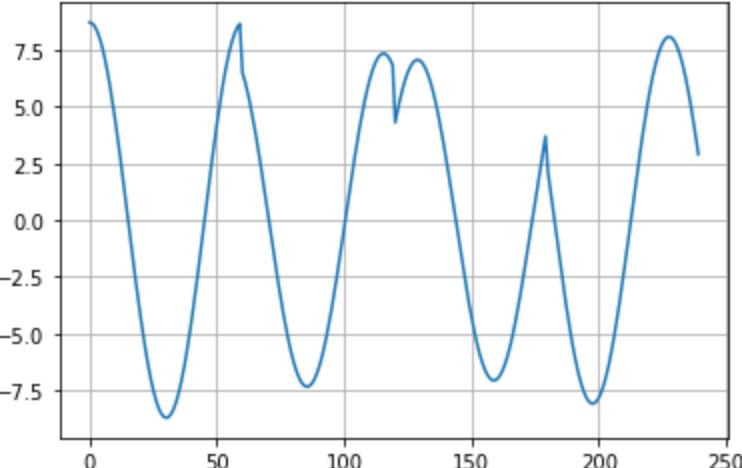
Complete script to demodulate signal from previous slide

```
1 > import ...
3 pi = np.pi
4
5 # parameters
6 PERIOD_VECTOR_SIZE = 60
7
8 # loading Rx vector from file and...
9 Rx = np.load('TxSignal.npy')
10
11 # ... plotting it
12 plt.plot(Rx)
13 plt.grid()
14 plt.show()
15
16 # splitting vector into time slots corresponding to single periods
17 # "-1" causes automatic evaluation array second dimension
18 RxPeriods = np.reshape(Rx, newshape: (-1,PERIOD_VECTOR_SIZE))
19
20 # lists for amplitudes
21 amplitudes_sin = []
22 amplitudes_cos = []
23
24 for RxPeriod in RxPeriods: # iterating periods
25     t = np.linspace( start: 0, 2*pi,PERIOD_VECTOR_SIZE, endpoint=False)
26     # sinus amplitude evaluation
27     ref = np.sin(t)
28     ampl = np.dot(RxPeriod,ref)/np.dot(ref,ref)
29     amplitudes_sin.append(ampl)
30     # cosinus amplitude evaluation
31     ref = np.cos(t)
32     ampl = np.dot(RxPeriod,ref)/np.dot(ref,ref)
33     amplitudes_cos.append(ampl)
34
35 # presentation
36 amplitudes_sin = np.array(amplitudes_sin) # convert list to numpy 1D array
37 amplitudes_cos = np.array(amplitudes_cos) # ...
38 np.set_printoptions(precision=2) # set numpy array print precision
39 print(f'amplitudes_sin = {amplitudes_sin}')
40 print(f'amplitudes_cos = {amplitudes_cos}'')
```

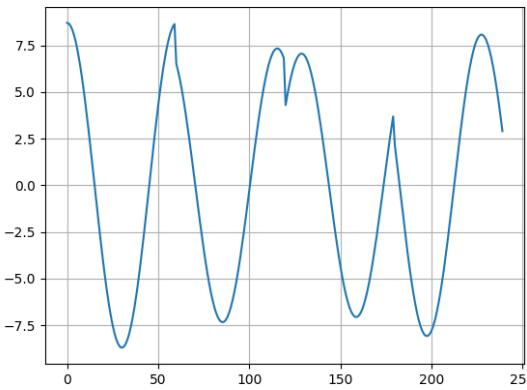


Quadrature demodulation: implementation cont.

Use previous script to decode signal from “Tx_Signal_Exercise.npy” file.
Result should look as follow.



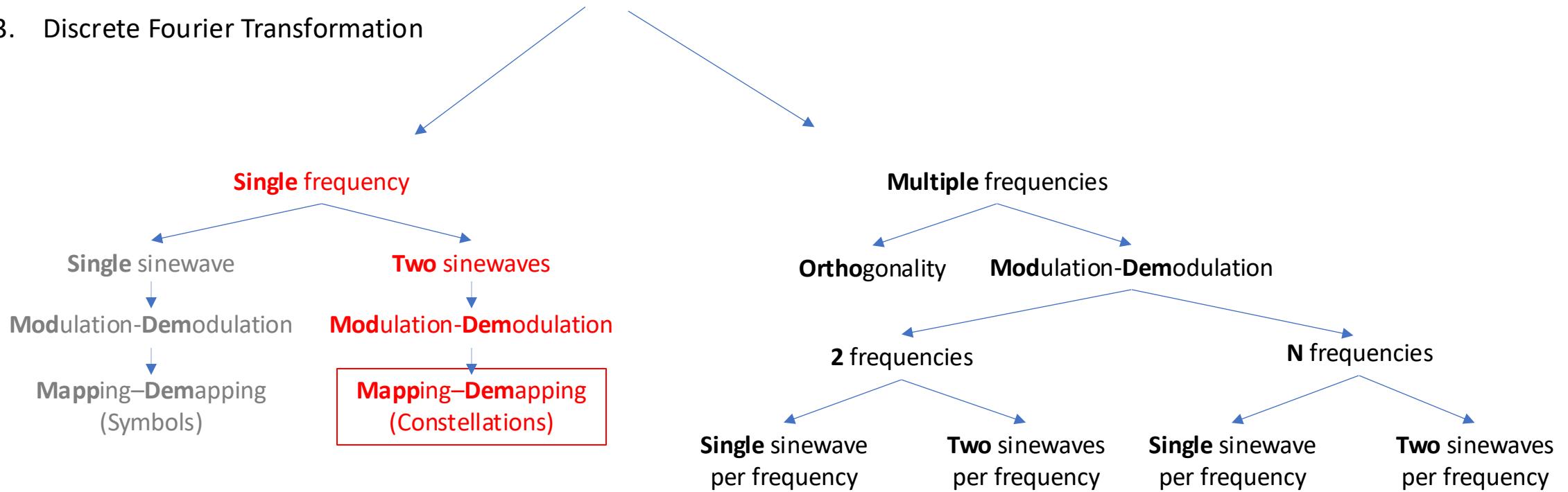
```
amplitudes_sin = [ 0.12 -3.4  5.6 -7.8 ]
amplitudes_cos = [8.7 6.5 4.3 2.1]
```



```
amplitudes_sin = [ 0.12 -3.4  5.6 -7.8 ]
amplitudes_cos = [8.7 6.5 4.3 2.1]
```

```
1  > import ...
2  pi = np.pi
3
4
5  # parameters
6  PERIOD_VECTOR_SIZE = 64
7
8  # loading Rx vector from file and...
9  Rx = np.load('TxSignal_exerc.npy')
10
11 # .. plotting it
12 plt.plot(Rx)
13 plt.grid()
14 plt.show()
15
16 # splitting vector into time slots corresponding to single periods
17 # "-1" causes automatic evaluation array second dimension
18 RxPeriods = np.reshape(Rx, newshape: (-1,PERIOD_VECTOR_SIZE))
19
20 # lists for amplitudes
21 amplitudes_sin = []
22 amplitudes_cos = []
23
24 for RxPeriod in RxPeriods: # iterating periods
25     t = np.linspace( start: 0, 2*pi, PERIOD_VECTOR_SIZE, endpoint=False)
26     # sinus amplitude evaluation
27     ref = np.sin(t)
28     ampl = np.dot(RxPeriod,ref)/np.dot(ref,ref)
29     amplitudes_sin.append(ampl)
30     # cosinus amplitude evaluation
31     ref = np.cos(t)
32     ampl = np.dot(RxPeriod,ref)/np.dot(ref,ref)
33     amplitudes_cos.append(ampl)
34
35 # presentation
36 amplitudes_sin = np.array(amplitudes_sin) # convert list to numpy 1D array
37 amplitudes_cos = np.array(amplitudes_cos) # ...
38 np.set_printoptions(precision=2)           # set numpy array print precision
39 print(f'amplitudes_sin = {amplitudes_sin}')
40 print(f'amplitudes_cos = {amplitudes_cos}')
```

1. Sinewaves orthogonality
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation



Maping-Demaping: Preparations : copying\renaming\verifying

Copy scripts 2_AmplitudeModulation\1_SingleFrequency\2_TwoSineWaves:

- 1_Modulation.py
- 2_Demodulation.py

to: subfolder 3_MapingDemaping

Rename them as below:

- 1.1_Modulation.py
- 1.2_Demodulation.py

Run 1.1_Modulation.py **and than** 1.2_Demodulation.py.

Check whether 1.2_Demodulation.py prints amplitude vector from 1.1_Modulation.py

```
AMPL_VECTOR_SIN = ( 0.12, -3.4, 5.6, -7.8)
AMPL_VECTOR_COS = ( 8.7,   6.5, 4.3,  2.1)
```

Maping-Demaping: Preparations : merging

Completing script on the right to **Merge** `1.1_Modulation.py` and `1.2_Demodulation.py` into single `2.1_ModDemod.py`

Channel between modulation and demodulation should be ideal.

Amplitude vectors printed by the script (demodulation) should equal to amplitude vectors defined on the beginning of the script () .

```
1  > import ...
3  pi = np.pi
4
5  # PARAMETERS
6  TIME_VECTOR_SIZE = 60
7
8  AMPL_VECTOR_SIN = ( 0.12, -3.4, 5.6, -7.8)
9  AMPL_VECTOR_COS = ( 8.7,   6.5, 4.3,  2.1)
10
11 # CALCULATION
12 t = np.linspace( start= 0, 2*pi,TIME_VECTOR_SIZE, endpoint=False)
13
14 carrier_sin = ref_sin = np.sin(t)
15 carrier_cos = ref_cos = np.cos(t)
16
17 amplitudes_sin = list()
18 amplitudes_cos = list()
19
20 for ampl_sin, ampl_cos in zip(AMPL_VECTOR_SIN, AMPL_VECTOR_COS):
21
22     # modulation
23     Tx = ampl_sin * carrier_sin + ampl_cos * carrier_cos
24
25     # channel
26     Rx = Tx # ideal
27
28     # demodulation
29     ampl = np.dot(Rx, ampl_sin)/TIME_VECTOR_SIZE*2
30     amplitudes_sin.append(ampl)
31
32     ampl = np.dot(Rx, ampl_cos)/TIME_VECTOR_SIZE*2
33     amplitudes_cos.append(ampl)
34
35 # PRESENTATION
36 # presentation
37 amplitudes_sin = np.array(amplitudes_sin) # convert list to numpy 1D array
38 amplitudes_cos = np.array(amplitudes_cos) # ...
39 np.set_printoptions(precision=2)           # set numpy array print precision
40
41 print(f'amplitudes_sin = {amplitudes_sin}')
42 print(f'amplitudes_cos = {amplitudes_cos}')
```

o numpy 1D array
y print precision

real channel : errors

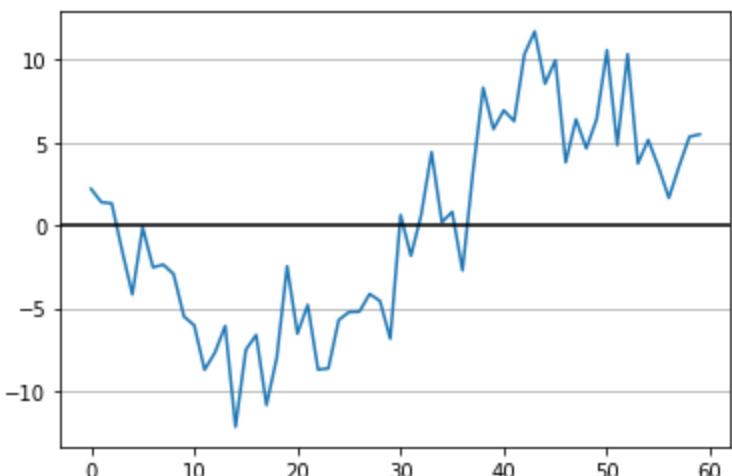
Copy 2.1_ModDemod.py to 2.2_ModDemod_RealChannel.py

1. Add normal distribution noise to channel (numpy.random.normal)

Set distribution center location at 0, deviation to 2 and size accordingly to Tx length

Plot Rx corresponding to last transmitted number (plot Rx after loop)

2. Add error calculation and printing.



```
amplitudes_sin = [ 0.19 -3.32  4.75 -7.81]
errors sin     : [-0.07 -0.08  0.85  0.01]

amplitudes_cos = [8.18 6.61 4.42 1.78]
errors cos     : [ 0.52 -0.11 -0.12  0.32]
```

```
amplitudes_sin = [ 0.62 -3.41  5.75 -8.57]
errors sin     : [ 0.5  -0.01  0.15 -0.77]

amplitudes_cos = [8.08 6.94 4.55 2.16]
errors cos     : [-0.62  0.44  0.25  0.06]
```



```
1  > import ...
2  from networkx.algorithms.bipartite.basic import color
3
4
5  pi = np.pi
6
7  # PARAMETERS
8  TIME_VECTOR_SIZE = 60
9  AMPL_VECTOR_SIN = ( 0.12, -3.4, 5.6, -7.8)
10 AMPL_VECTOR_COS = ( 8.7, 6.5, 4.3, 2.1)
11
12 # CALCULATION
13 t = np.linspace( start=0, 2*pi, TIME_VECTOR_SIZE, endpoint=False)
14 carrier_sin = ref_sin = np.sin(t)
15 carrier_cos = ref_cos = np.cos(t)
16 amplitudes_sin = list()
17 amplitudes_cos = list()
18
19 for ampl_sin, ampl_cos in zip(AMPL_VECTOR_SIN, AMPL_VECTOR_COS):
20
21     # modulation
22     Tx = (ampl_sin*carrier_sin) + (ampl_cos*carrier_cos)
23
24     # real channel
25     Rx = Tx + np.random.normal( loc=0, scale=2, len(Tx))
26
27     # demodulation
28     ampl = (np.dot(Rx,ref_sin)/TIME_VECTOR_SIZE)*2
29     amplitudes_sin.append(ampl)
30
31     ampl = (np.dot(Rx,ref_cos)/TIME_VECTOR_SIZE)*2
32     amplitudes_cos.append(ampl)
33
34 # PRESENTATION
35 # PRESENTATION
36 # Rx plot
37 plt.plot(*args: t, Rx)
38 plt.grid(axis='y')
39 plt.axhline(y=0,color='black')
40 plt.show()
41 # amplitudes
42 amplitudes_sin = np.array(amplitudes_sin) # convert list to numpy 1D array
43 amplitudes_cos = np.array(amplitudes_cos) # ...
44 np.set_printoptions(precision=2)           # set numpy array print precision
45 print(f'amplitudes_sin = {amplitudes_sin}')
46 errors_sin = amplitudes_sin - AMPL_VECTOR_SIN
47 print(f'errors sin : {errors_sin}')
48 print()
```

Constellations

1. Copy 2.2_ModDemod_RealChannel.py to 2.3_ModDemod_RealChannel_Constellations.py

2. Add parameter NOISE_DEVIATION to define “scale” argument of the “normal” function.

3. Set amplitudes to transmit as below

AMPL_VECTOR_SIN = (1,-1,1,-1)

AMPL_VECTOR_COS = (1, 1,-1,-1)

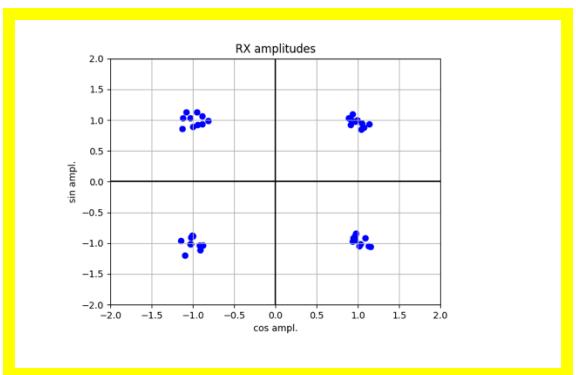
4. Add parameter TRANSMISSION_NR=10 and add loop to repeat transmission TRANSMISSION_NR times

```
for i in range(TRANSMISSION_NR):  
    for ampl_sin, ampl_cos in zip(AMPL_VECTOR_SIN, AMPL_VECTOR_COS):
```

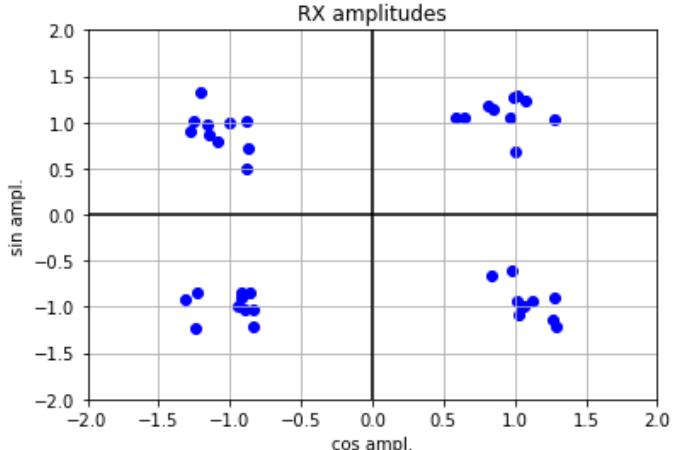
5. Use plt.scatter function to make plot as below. Do not forget about figure and axes titles, fixed x and y axis ranges, and horizontal and vertical lines at x and y equal 0 (black cross in the middle)

6. Generate missing figures (see below)

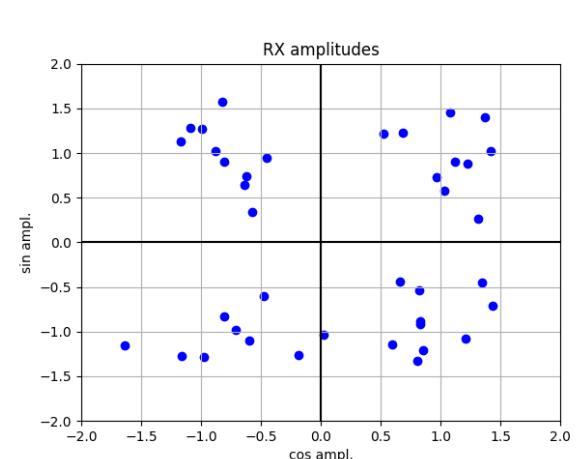
dev=0.5



dev=1



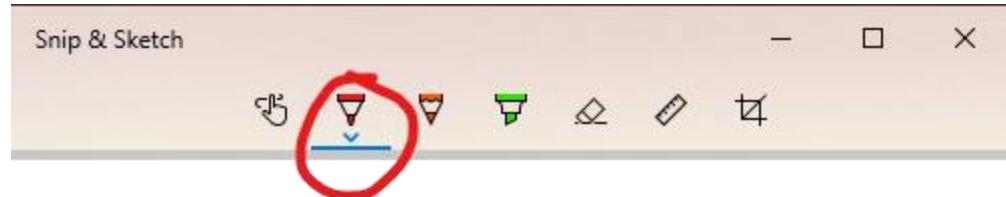
dev=2



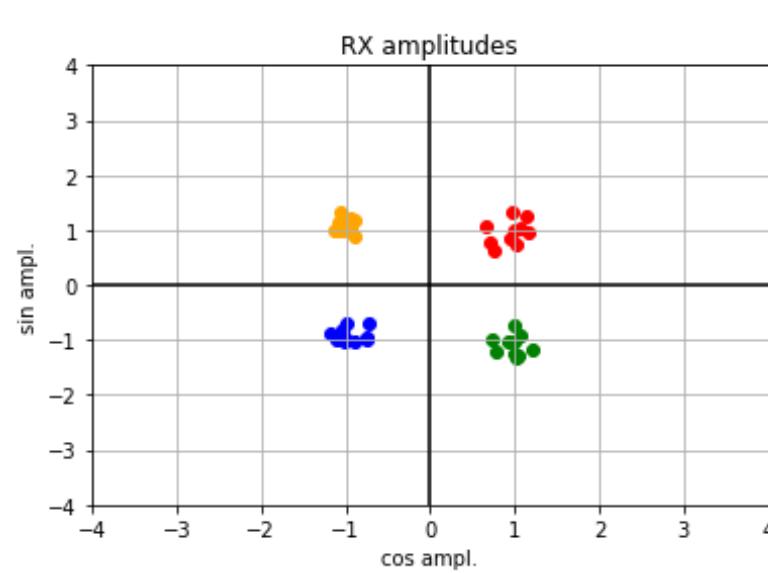
```
1 > import ...  
4 pi = np.pi  
5 # PARAMETERS  
6 TIME_VECTOR_SIZE  
7 AMPL_VECTOR_SIN  
8 AMPL_VECTOR_COS  
9 # CALCULATION  
10 t = np.linspace(0, 1, TIME_VECTOR_SIZE)  
11 carrier_sin = np.sin(2 * pi * t)  
12 carrier_cos = np.cos(2 * pi * t)  
13 amplitudes_sin = np.array([0.5, 1.0, 1.5, 2.0])  
14 amplitudes_cos = np.array([0.5, 1.0, 1.5, 2.0])  
15 NOISE_DEVIATION = 0.1  
16 TRANSMISSION_NR = 10  
17 for i in range(TRANSMISSION_NR):  
18     for ampl_sin, ampl_cos in zip(AMPL_VECTOR_SIN, AMPL_VECTOR_COS):  
19         # modulation  
20         Tx = (ampl_sin * carrier_sin) + (ampl_cos * carrier_cos)  
21         # real channel  
22         Rx = Tx + np.random.normal(0, NOISE_DEVIATION)  
23         # demodulation  
24         ampl = Rx * np.conj(Tx)  
25         amplitudes_sin[i] = np.abs(ampl) * np.sin(np.angle(ampl))  
26         amplitudes_cos[i] = np.abs(ampl) * np.cos(np.angle(ampl))  
27 # PRESENTATION  
28 # Rx plot  
29 plt.scatter(amplitudes_sin, amplitudes_cos)  
30 plt.axhline(y=0, color='black', linewidth=1)  
31 plt.axvline(x=0, color='black', linewidth=1)  
32 plt.title("RX amplitudes")  
33 plt.xlabel("cos ampl.")  
34 plt.ylabel("sin ampl.")  
35 plt.xlim(-2.0, 2.0)  
36 plt.ylim(-2.0, 2.0)  
37 plt.grid()  
38 plt.show()
```

Constellations : colors

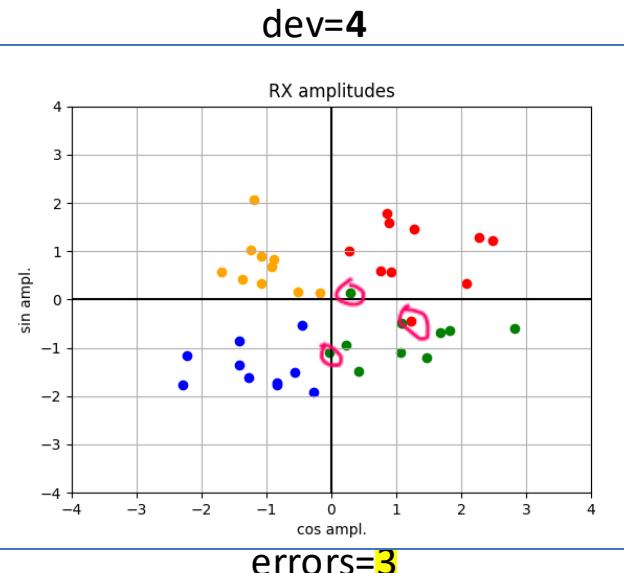
1. Copy 2.3_ModDemod_RealChannel_Constelations.py to 2.4_ModDemod_RealChannel_Constelations_Colors.py
2. Modify script to plot each amplitude with unique color (Hint: `plt.scatter(ampl_sin, ampl_cos, color=('red','orange','green','blue')[j%4])`)
3. Generate missing figures (see below) and count errors expected during Rx decoding. (use plots for counting), mark and caunt error symbols with windows screenshot tool (“shift-windows-s”)



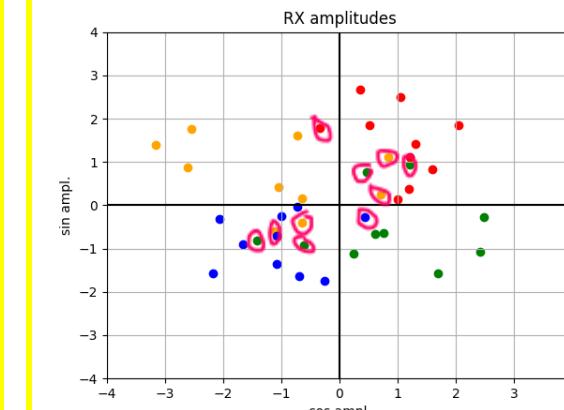
dev=1



errors=0



Errors = 10



```

1 > import ...
6 pi = np.pi
7 # PARAMETERS
8 TIME_VECTOR_SIZE = 60
9 AMPL_VECTOR_SIN = (1,-1,1,-1)
10 AMPL_VECTOR_COS = (1,1,-1,-1)
11 # CALCULATION
12 t = np.linspace( start: 0, 2*pi,TIME_VECTOR_SIZE)
13 carrier_sin = ref_sin = np.sin(t)
14 carrier_cos = ref_cos = np.cos(t)
15 amplitudes_sin = list()
16 amplitudes_cos = list()
17 NOISE_DEVIATION = 6
18 TRANSMISSION_NR = 10
19 for i in range(TRANSMISSION_NR):
20     for ampl_sin, ampl_cos in zip(AMPL_VECTOR_SIN, AMPL_VECTOR_COS):
21         # modulation
22         Tx = (ampl_sin*carrier_sin) +
23             # real channel
24             Rx = Tx + np.random.normal(0, NOISE_DEVIATION)
25             # demodulation
26             ampl1 = (np.dot(Rx,ref_sin)/T)
27             amplitudes_sin.append(ampl1)
28             ampl2 = (np.dot(Rx,ref_cos)/T)
29             amplitudes_cos.append(ampl2)
30 # PRESENTATION
31 # Rx plot
32 for j in range(len(amplitudes_sin)):
33     plt.scatter(amplitudes_sin[j], amplitudes_cos[j], color=('red','orange','green','blue')[j%4])
34     plt.axhline(y=0, color='black')
35     plt.axvline(x=0, color='black')
36     plt.title("RX amplitudes")
37     plt.xlabel("cos ampl.")
38     plt.ylabel("sin ampl.")
39     plt.xlim( *args: -4,4)
40     plt.ylim( *args: -4,4)
41     plt.grid()

```

Constellation : transmission and reception

Complete below script to make given number of **transmissions\receptions** by using given number of **symbols** in the presence of given **noise** distribution. Use amplitude mapping\demapping functions from `mapper_lib.py`.

```
1  > import ...
4
5  # PARAMETERS
6  TIME_VECTOR_SIZE = 60
7  TRANSMISSIONS_NR = 10
8
9  NOISE_DEVIATION = 2.0
10 SYMBOL_NR = 4
11
12 t = np.linspace( start=0, 2*np.pi,TIME_VECTOR_SIZE, endpoint=False)
13 carrier_sin = ref_sin = np.sin(t)
14 carrier_cos = ref_cos = np.cos(t)
15
16 # TRANSMISSION-RECEPTION
17 symbols_tx_sin = np.random.randint(0,SYMBOL_NR,TRANSMISSIONS_NR)
18 symbols_tx_cos = np.random.randint(0,SYMBOL_NR,TRANSMISSIONS_NR)
19
20 symbols_rx_sin = list()
21 symbols_rx_cos = list()
22
23 for symbol_sin, symbol_cos in zip(symbols_tx_sin,symbols_tx_cos):
24     # modulation
25     ampl_sin = symbol_to_ampl(SYMBOL_NR, symbol_sin)
26     ampl_cos = symbol_to_ampl(SYMBOL_NR, symbol_cos)
27     Tx = ampl_sin*carrier_sin+ampl_cos*carrier_cos
28
29     # real channel
30     Rx = Tx + np.random.normal(loc=0, scale=NOISE_DEVIATION, size=len(Tx))
31
32     # demodulation
33     ampl_sin = np.dot(ref_sin, Rx)/TIME_VECTOR_SIZE*2
34     ampl_cos = np.dot(ref_cos, Rx)/TIME_VECTOR_SIZE*2
35
36     symbol_sin = ampl_to_symbol(SYMBOL_NR, ampl_sin)
37     symbol_cos = ampl_to_symbol(SYMBOL_NR, ampl_cos)
38
39     symbols_rx_sin.append(symbol_sin)
40     symbols_rx_cos.append(symbol_cos)
```

False)

SIONS_NR
SIONS_NR

ls_tx_cos):

```
40 # PRESENTATION
41 symbols_rx_sin = np.array(symbols_rx_sin) # list to numpy array
42 symbols_rx_cos = np.array(symbols_rx_cos)
43
44 print('SIN')
45 print('symbols_rx:', symbols_tx_sin)
46 errors = symbols_rx_sin != symbols_tx_sin
47 print('match:', ~errors)
48 print('errors nr:', sum(errors))
49
50 print('COS')
51 print('symbols_rx:', symbols_tx_cos)
52 errors = symbols_rx_cos != symbols_tx_cos
53 print('match:', ~errors)
54 print('errors nr:', sum(errors))
```

Typical result

```
SIN
symbols_rx: [1 3 1 2 2 1 3 3 3 2]
match: [False  True  True  True False  True  True  True False  True]
errors nr: 3
COS
symbols_rx: [2 2 2 3 2 1 0 0 2 2]
match: [False  True  True  True  True  True  True  True False  True]
errors nr: 2
```

True True]

True True]

Constellation: error number v.s. noise deviation

Save previous script as `7.2_ModDemodSymbols_ErrorRate_vs_Noise_Print.py`.

Modify it to evaluate transmission error for given range of noise deviation (see exemplary result below).

Set `TRANSMISONS_NR` to 1000

Use the script to add complete results below.

```
SYMBOL_NR: 2
DEV: SIN, COS
0.00 : 0, 0
0.22 : 0, 0
0.44 : 0, 0
0.67 : 0, 0
0.89 : 0, 0
1.11 : 0, 0
1.33 : 0, 0
1.56 : 0, 1
1.78 : 2, 1
2.00 : 6, 0
```

```
SYMBOL_NR: 4
DEV: SIN, COS
0.00: 0, 0
0.22: 0, 0
0.44: 0, 0
0.67: 4, 2
0.89: 32, 29
1.11: 72, 66
1.33: 107, 130
1.56: 173, 169
1.78: 230, 204
2.00: 282, 267
```

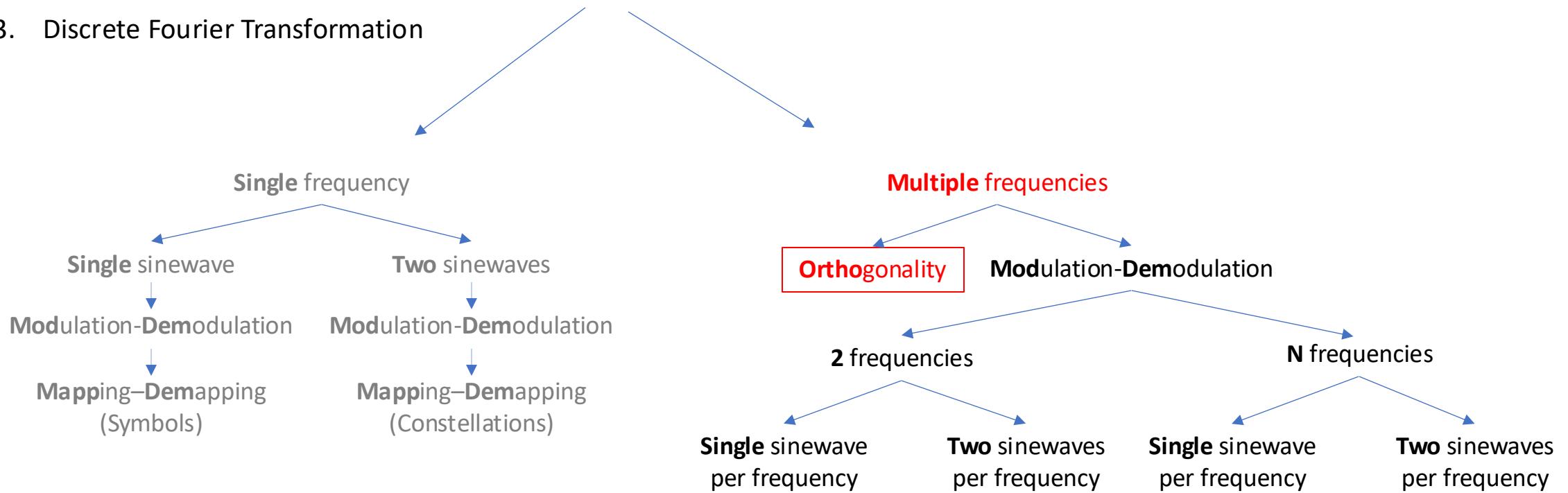
```
SYMBOL_NR: 8
DEV: SIN, COS
0.00 : 0, 0
0.22 : 1, 0
0.44 : 73, 76
0.67 : 235, 205
0.89 : 340, 339
1.11 : 415, 404
1.33 : 487, 510
1.56 : 531, 536
1.78 : 575, 585
2.00 : 604, 614
```

```
1  > import ...
2  # PARAMETERS
3  TIME_VECTOR_SIZE = 60
4  TRANSMISONS_NR = 1000
5  NOISE_DEVIATION = 2.0
6  SYMBOL_NR = 4
7
8  t = np.linspace( start=0, 2 * np.pi, TIME_VECTOR_SIZE, endpoint=False)
9  carrier_sin = ref_sin = np.sin(t)
10 carrier_cos = ref_cos = np.cos(t)
11 # TRANSMISSION-RECEPTION
12 symbols_tx_sin = np.random.randint(0, SYMBOL_NR, TRANSMISONS_NR)
13 symbols_tx_cos = np.random.randint(0, SYMBOL_NR, TRANSMISONS_NR)
14 noise_dev_list = list()
15 for noise_dev in np.linspace(0, NOISE_DEVIATION, 10):
16     symbols_rx_sin = list()
17     symbols_rx_cos = list()
18     for symbol_sin, symbol_cos in zip(symbols_tx_sin, symbols_tx_cos):
19         # modulation
20         ampl_sin = symbol_to_ampl(SYMBOL_NR, symbol_sin)
21         ampl_cos = symbol_to_ampl(SYMBOL_NR, symbol_cos)
22         Tx = ampl_sin * carrier_sin + ampl_cos * carrier_cos
23         # real channel
24         Rx = Tx + np.random.normal(loc=0, scale=noise_dev, size=len(Tx))
25         # demodulation
26         ampl_sin = np.dot(ref_sin, Rx) / TIME_VECTOR_SIZE * 2
27         ampl_cos = np.dot(ref_cos, Rx) / TIME_VECTOR_SIZE * 2
28         symbol_sin = ampl_to_symbol(SYMBOL_NR, ampl_sin)
29         symbol_cos = ampl_to_symbol(SYMBOL_NR, ampl_cos)
30         symbols_rx_sin.append(symbol_sin)
31         symbols_rx_cos.append(symbol_cos)
32
33 symbols_rx_sin = np.array(symbols_rx_sin)
34 symbols_rx_cos = np.array(symbols_rx_cos)
35 errors_sin = sum(symbols_rx_sin != symbols_tx_sin)
36 errors_cos = sum(symbols_rx_cos != symbols_tx_cos)
37 noise_dev_list.append(((noise_dev, errors_sin, errors_cos)))
38 # PRESENTATION
39
40 print(f'SYMBOL_NR: {SYMBOL_NR}')
41
42 print(f'DEV: SIN, COS')
43 for noise_dev, errors_sin, errors_cos in noise_dev_list:
44     print(f'{noise_dev:.2f} : {errors_sin}, {errors_cos}')
```

Assuming noise dev = 1.11 and acceptable error number = 300 what is an optimal symbol nr ?

: 4

1. Sinewaves orthogonality
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation



Summary

In the last exercise we made data transmission we used two orthogonal sinewaves of the same frequency.

Amount of transmitted data was proportional to number of time slots (two number per slot, one for cosines second for sinus).

One time slot corresponded to single period of sinewave.

Observation

Above transition scheme based on observation that if two same frequency sinewaves are shifted of $\pi/2$ they are orthogonal and in practice they do not interfere when placed in a single signal.

Motivation

To send more data via the same signal (channel)

Hypothesis

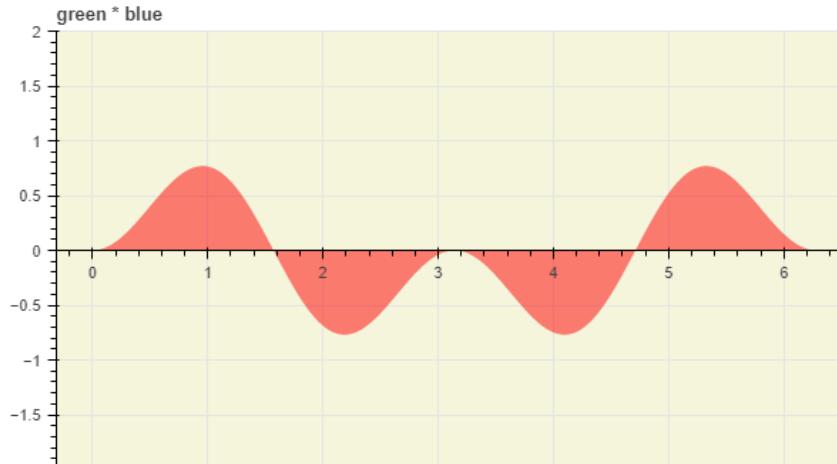
It is possible to transfer two or more sinewaves of different frequency via single signal in the way that they do not interfere.

Experiments

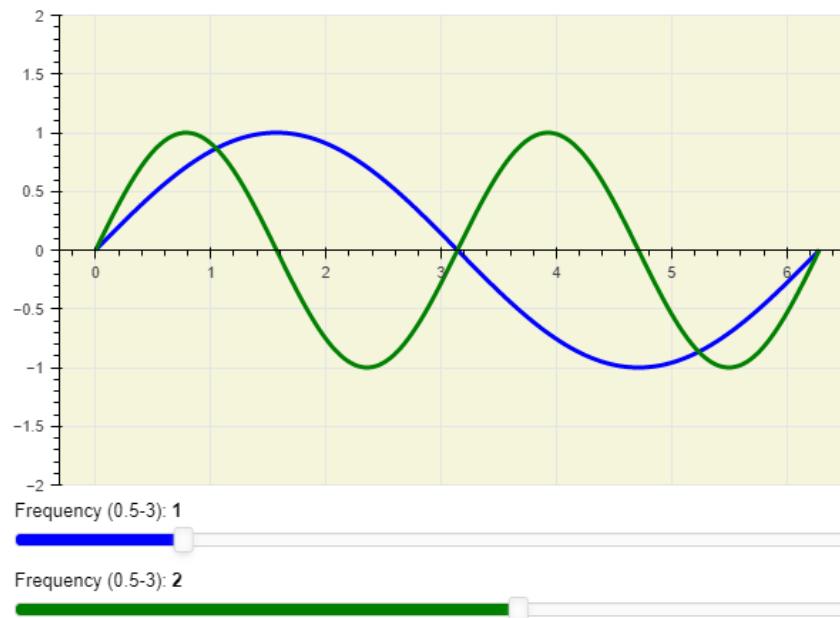
Let's examine orthogonality (dot product) of sinewaves of different frequencies

Frequencies orthogonality : sinus

Use interactive presentation to find frequencies orthogonal to $\sin(1*t)$. (Fill the table)

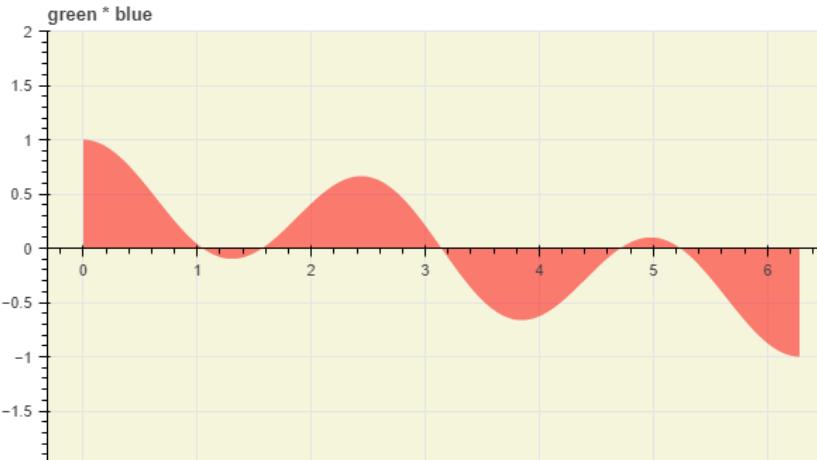


Blue frequency = 1.0
Green frequency at which
$\text{dot_product(blue, green)}==0$
0.5
1.5
2.0
2.5
3.0

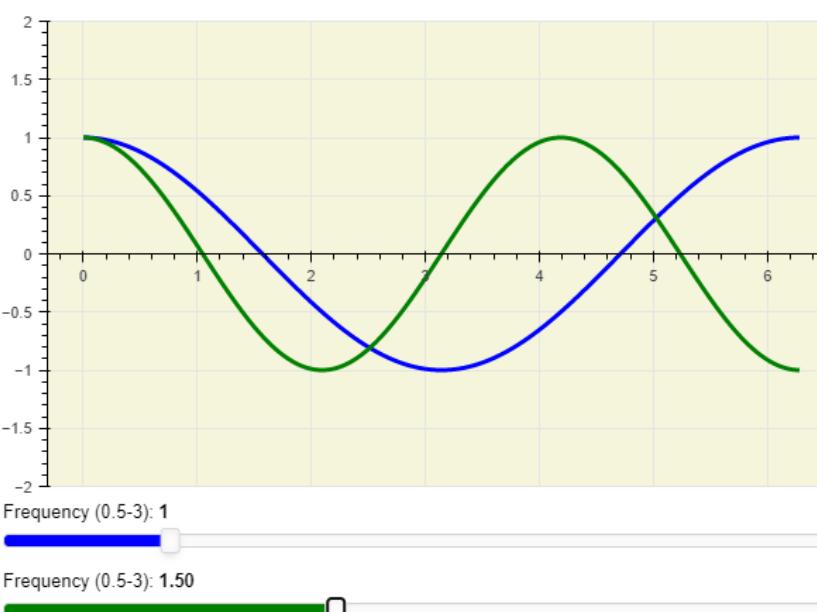


Frequencies orthogonality : cosinus

Do the same for cosines



Blue frequency = 1.0
Green frequency at which
dot_product(blue, green)==0
0.5
1.5
2.0
2.5
3.0

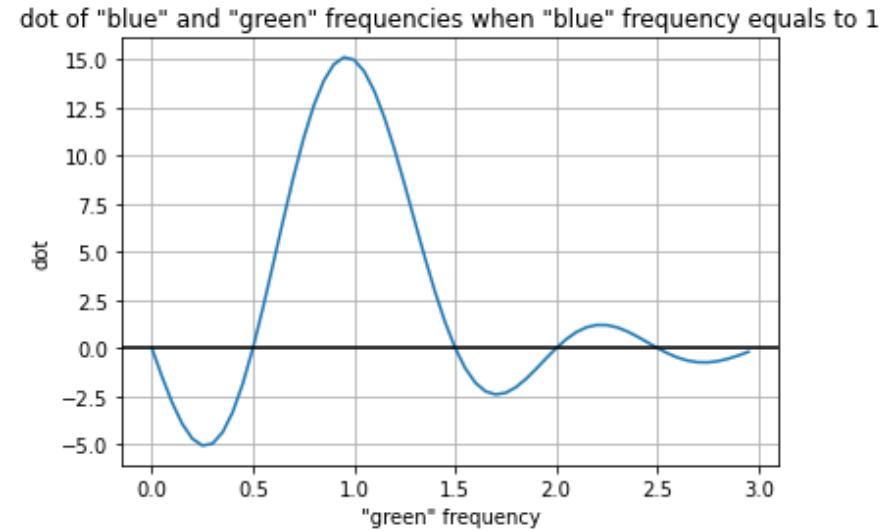


Orthogonal frequencies: estimation for sine waves, scripting

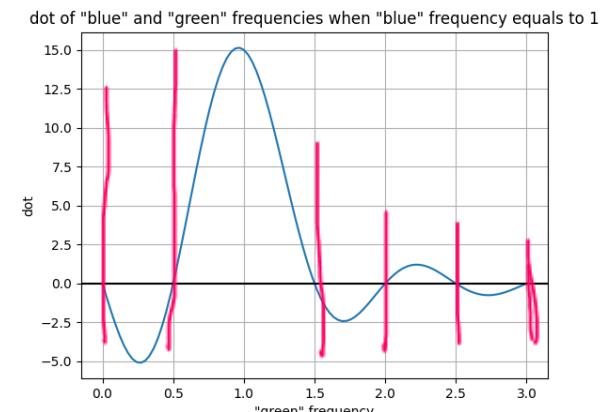
1. Complete script to plot relationship between frequency ratio of two sinusoids and dot product.

```
1 > import ...
3
4 t = np.linspace( start: 0, 2*np.pi, num: 30, endpoint=False)
5 sin_blue = np.sin(t)
6
7 dot_l = list()
8 freq_l = np.linspace( start: 0, stop: 3, num: 100)
9 for freq in freq_l:
10     sin_green = np.sin(freq*t)
11     dot_l.append(np.dot(sin_green, sin_blue))
12
13 plt.plot( *args: freq_l, dot_l)
14 plt.axhline(y=0,color='black')
15 plt.title('dot of "blue" and "green" frequencies when "blue" frequency equals to 1')
16 plt.xlabel('"green" frequency')
17 plt.ylabel('dot')
18 plt.grid()
19 plt.show()
```

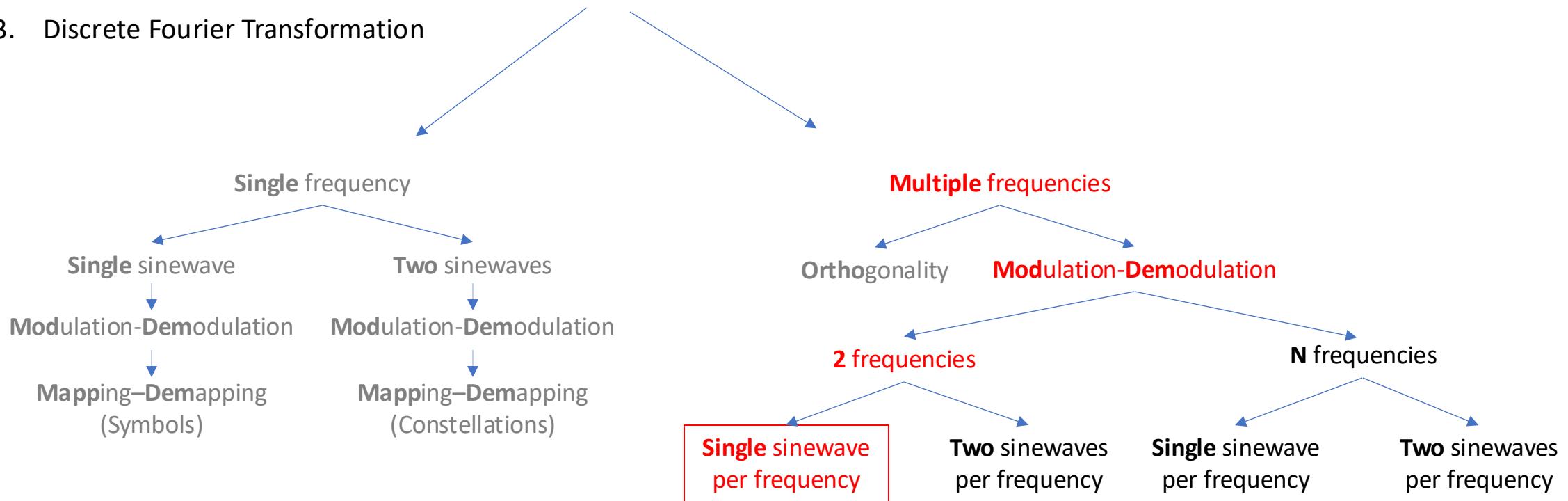
Refence plot



2. Mark orthogonal frequencies on x axis of the plot
Do it manually in PowerPoint by drawing red vertical lines on the plot



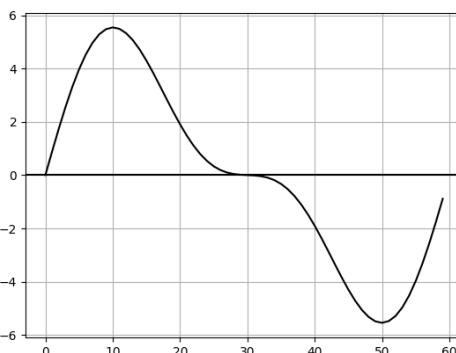
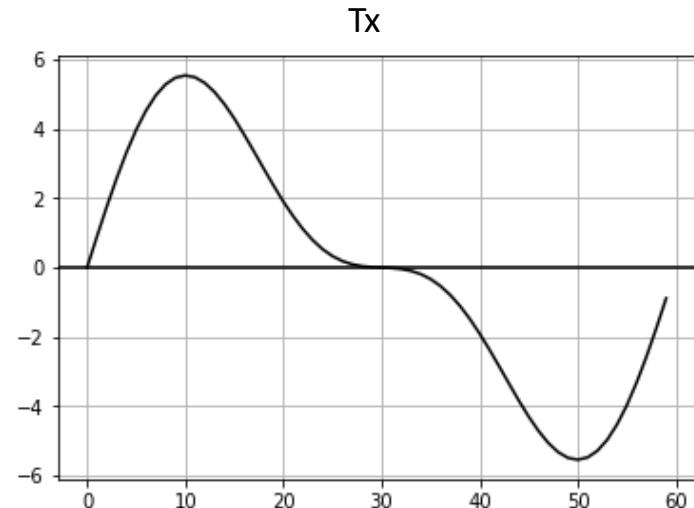
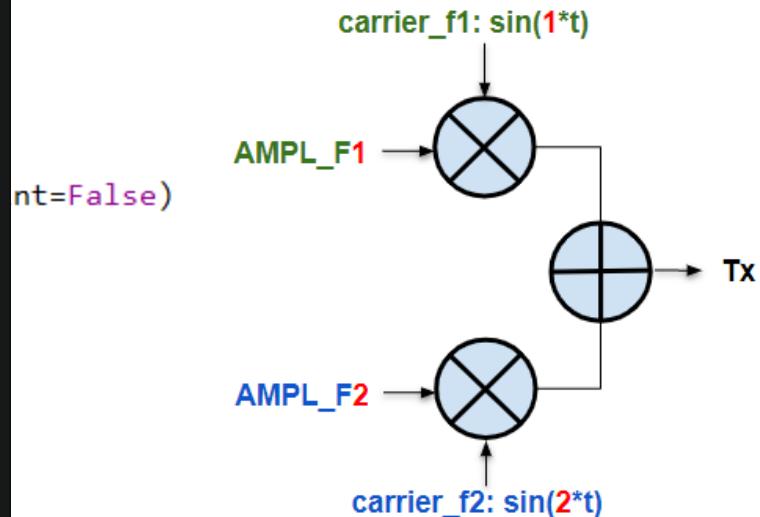
1. Sinewaves orthogonality
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation



Two frequencies : Single sinewave per frequency : modulation

Complete script to obtain Tx signal composed of two modulated sinusoids of orthogonal frequencies

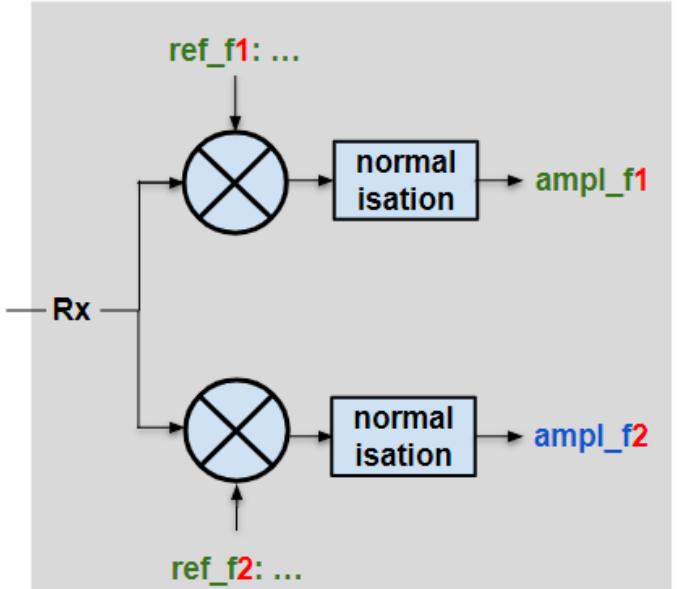
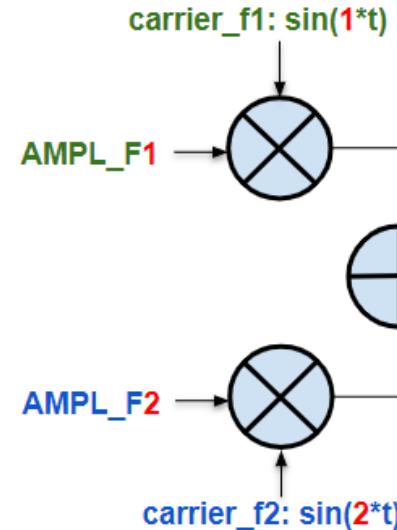
```
1  > import ...
3  pi = np.pi
4
5  # PARAMETERS
6  TIME_VECTOR_SIZE = 60
7
8  AMPL_F1 = 4.3
9  AMPL_F2 = 2.1
10
11 # CALCULATION
12 t = np.linspace( start: 0, 2*pi,TIME_VECTOR_SIZE, endpoint=False)
13
14 carrier_f1 = np.sin(1*t)
15 carrier_f2 = np.sin(2*t)
16
17 tx_f1 = AMPL_F1 * carrier_f1
18 tx_f2 = AMPL_F2 * carrier_f2
19
20 Tx = tx_f1 + tx_f2
21
22 # PRESENTATION
23 plt.plot(*args: Tx, color='black')
24 plt.axhline(y=0,color='black')
25 plt.grid()
26 plt.show()
27
28 # SAVING
29 np.save( file: 'TxSignal',Tx)
```



Two frequencies : Single sinewave per frequency : Demodulation

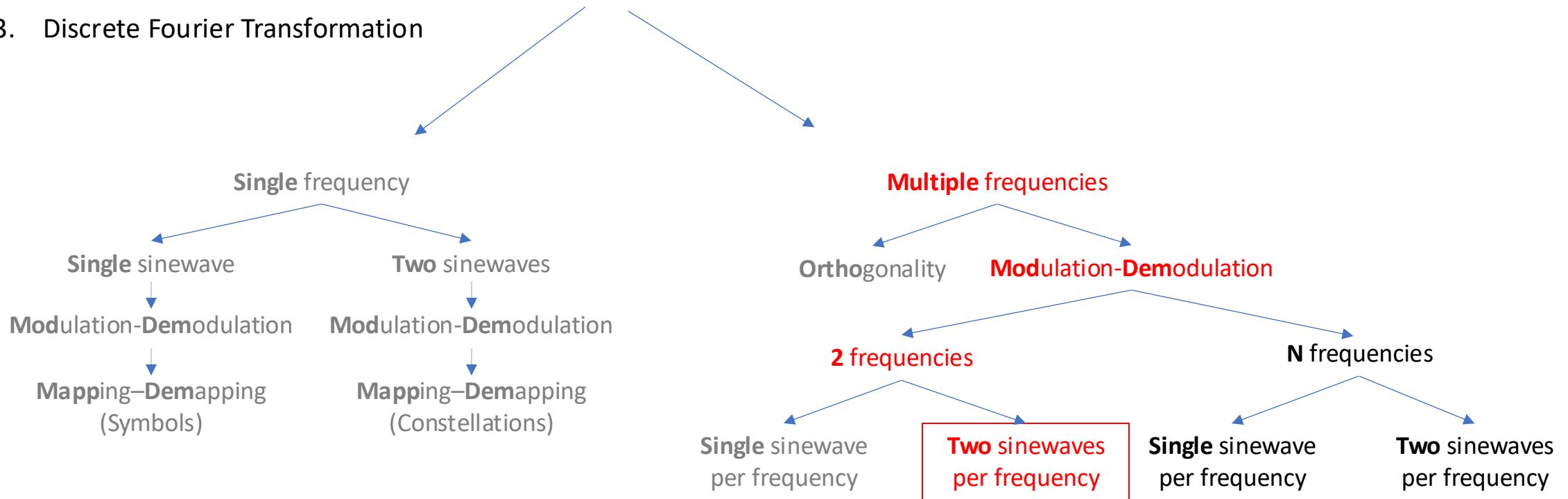
Complete script to decode amplitudes of sinusoids from Rx signal

```
1  > import ...
3  pi = np.pi
4
5  # parameters
6  PERIOD_VECTOR_SIZE = 60
7
8  # loading Rx vector from file and...
9  Rx = np.load('TxSignal.npy')
10
11 # ... plotting it
12 plt.plot(Rx)
13 plt.axhline(y=0,color='black')
14 plt.grid()
15 plt.show()
16
17 # calculation
18 t = np.linspace(start= 0, 2*pi,PERIOD_VECTOR_SIZE, endpoint=False)
19
20 ref_f1 = np.sin(1*t)
21 ref_f2 = np.sin(2*t)
22
23 dot_f1 = np.dot(Rx,ref_f1)
24 dot_f2 = np.dot(Rx,ref_f2)
25
26 ampl_f1 = dot_f1/np.dot(ref_f1,ref_f1)
27 ampl_f2 = dot_f2/np.dot(ref_f2,ref_f2)
28
29 # presentation
30 print(f'ampl_f1 = {ampl_f1:0.2f}, ampl_f2 = {ampl_f2:0.2f}')
```



ampl_f1 = 4.30, ampl_f2 = 2.10

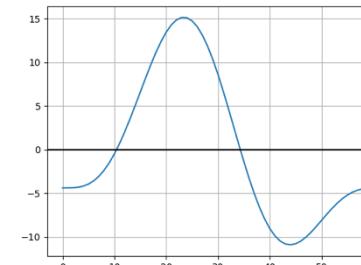
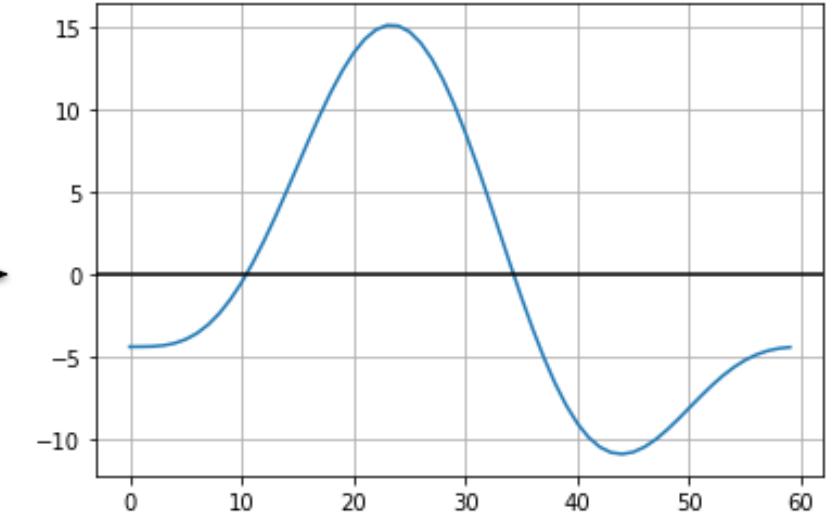
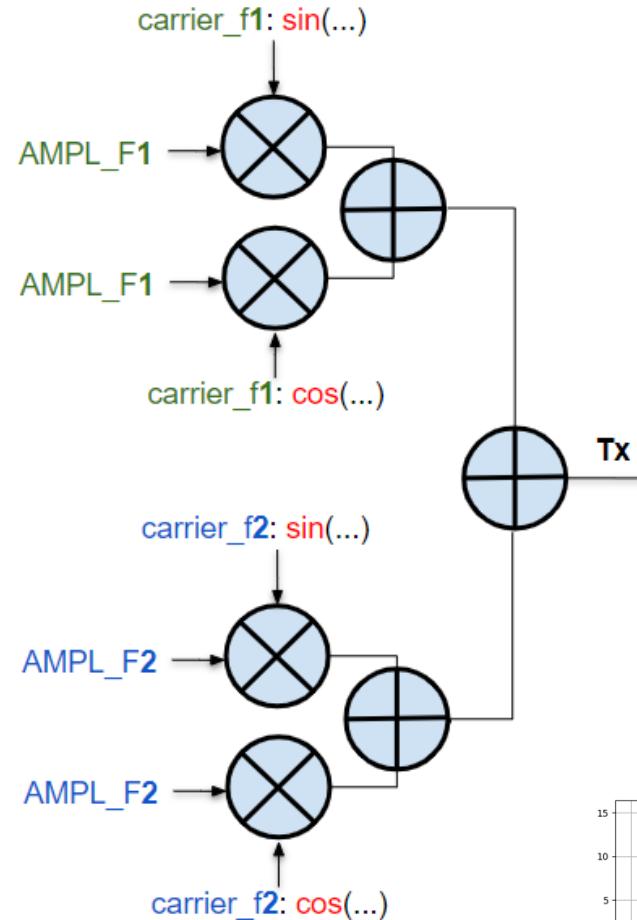
1. Sinewaves orthogonality
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation



Two frequencies : Two sinewaves per frequency : Modulation

Complete script to make quadrature modulation of two orthogonal frequencies, i.e. 1 and 2

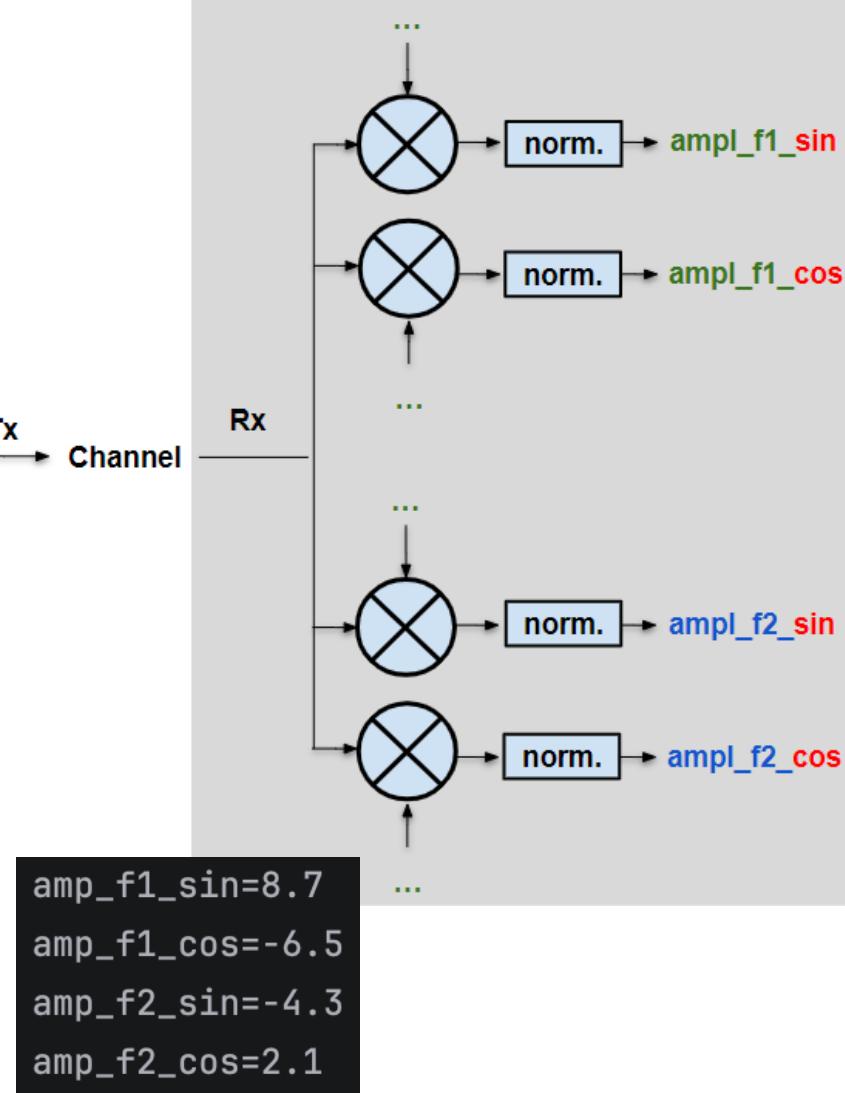
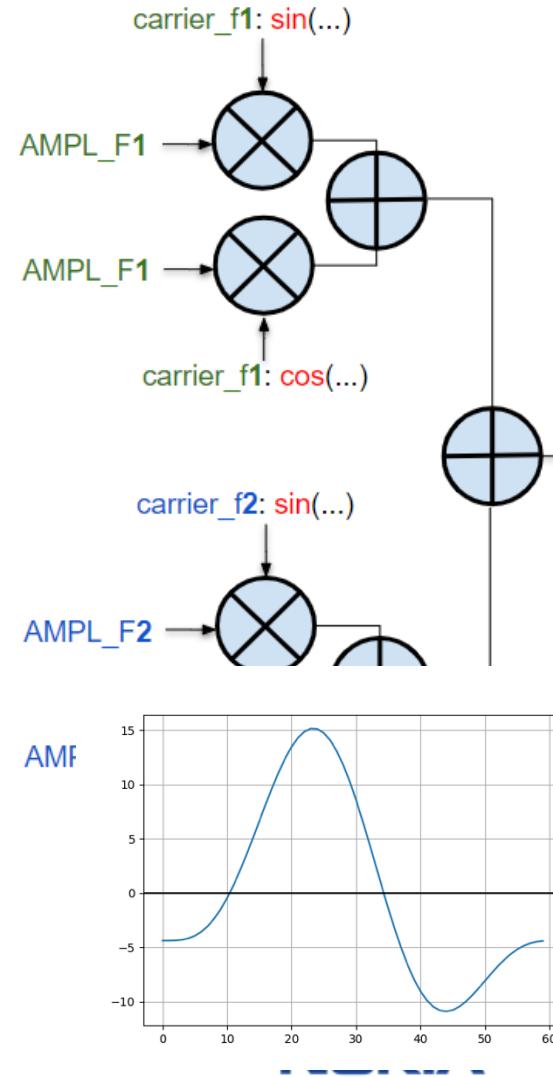
```
1 > import ...
3 pi = np.pi
4
5 # PARAMETERS
6 TIME_VECTOR_SIZE = 60
7
8 AMPL_F1_SIN =  8.7
9 AMPL_F1_COS = -6.5
10
11 AMPL_F2_SIN = -4.3
12 AMPL_F2_COS =  2.1
13
14 # CALCULATION
15 t = np.linspace( start: 0, 2*pi,TIME_VECTOR_SIZE, endpoint=False)
16
17 carrier_f1_sin = np.sin(1*t)
18 carrier_f1_cos = np.cos(1*t)
19
20 carrier_f2_sin = np.sin(2*t)
21 carrier_f2_cos = np.cos(2*t)
22
23 tx_f1_sin = AMPL_F1_SIN*carrier_f1_sin
24 tx_f1_cos = AMPL_F1_COS*carrier_f1_cos
25
26 tx_f2_sin = AMPL_F2_SIN*carrier_f2_sin
27 tx_f2_cos = AMPL_F2_COS*carrier_f2_cos
28
29 Tx = tx_f1_sin+tx_f1_cos+tx_f2_sin+tx_f2_cos
30
31 # PRESENTATION
32 plt.plot(Tx)
33 plt.axhline(y=0,color='black')
34 plt.grid()
35 plt.show()
36
37 # SAVING
38 np.save( file: 'TxSignal',Tx)
```



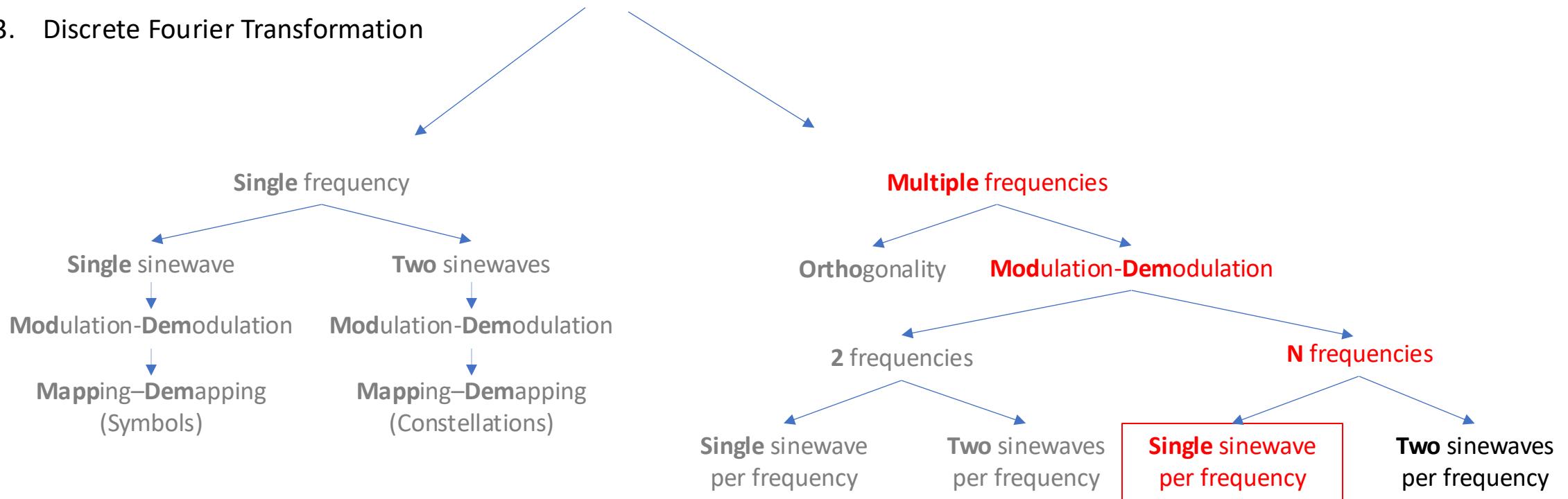
Two frequencies : Two sinewaves per frequency : Demodulation

Complete script to demodulate signal which consists of two orthogonal quadrature modulated frequencies

```
1  > import ...
2  pi = np.pi
3
4  # parameters
5  PERIOD_VECTOR_SIZE = 60
6
7  # loading Rx vector from file and...
8  Rx = np.load('TxSignal.npy')
9
10 # .. plotting it
11 plt.plot(Rx)
12 plt.axhline(y=0,color='black')
13 plt.grid()
14 plt.show()
15
16
17 # CALCULATION
18 t = np.linspace(start= 0, 2*pi,PERIOD_VECTOR_SIZE, endpoint=False)
19
20 # references
21 ref_f1_sin = np.sin(1*t)
22 ref_f1_cos = np.cos(1*t)
23 ref_f2_sin = np.sin(2*t)
24 ref_f2_cos = np.cos(2*t)
25
26 # dot products
27 dot_f1_sin = np.dot(Rx, ref_f1_sin)
28 dot_f1_cos = np.dot(Rx, ref_f1_cos)
29 dot_f2_sin = np.dot(Rx, ref_f2_sin)
30 dot_f2_cos = np.dot(Rx, ref_f2_cos)
31
32 # amplitudes
33 amp_f1_sin = dot_f1_sin/np.dot(ref_f1_sin,ref_f1_sin)
34 amp_f1_cos = dot_f1_cos/np.dot(ref_f1_cos,ref_f1_cos)
35 amp_f2_sin = dot_f2_sin/np.dot(ref_f2_sin,ref_f2_sin)
36 amp_f2_cos = dot_f2_cos/np.dot(ref_f2_cos,ref_f2_cos)
37
38 # PRESENTATION
39 print(f'amp_f1_sin={amp_f1_sin:0.1f}')
40 print(f'amp_f1_cos={amp_f1_cos:0.1f}')
41 print(f'amp_f2_sin={amp_f2_sin:0.1f}')
42 print(f'amp_f2_cos={amp_f2_cos:0.1f}')
43
44 print(f'amp_f1_sin={amp_f1_sin:0.1f}')
```



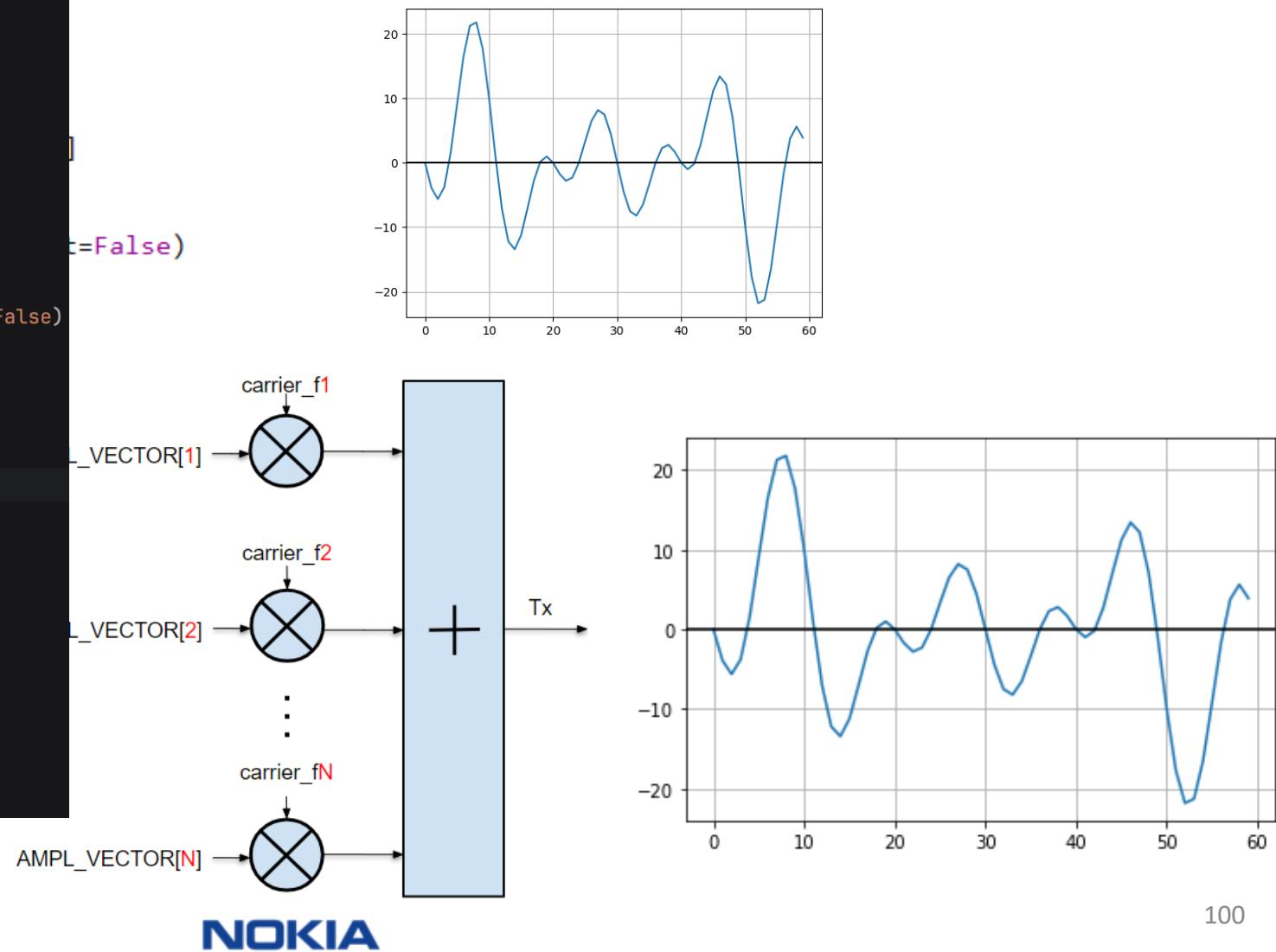
1. Sinewaves orthogonality
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation



N frequencies : Single sinewave per frequency : Modulation

Complete script to obtain Tx signal composed of N amplitude modulated sinusoids of orthogonal frequencies

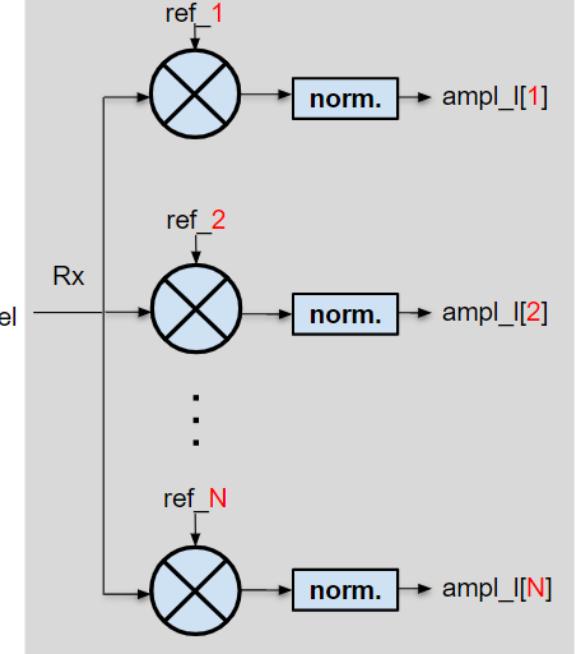
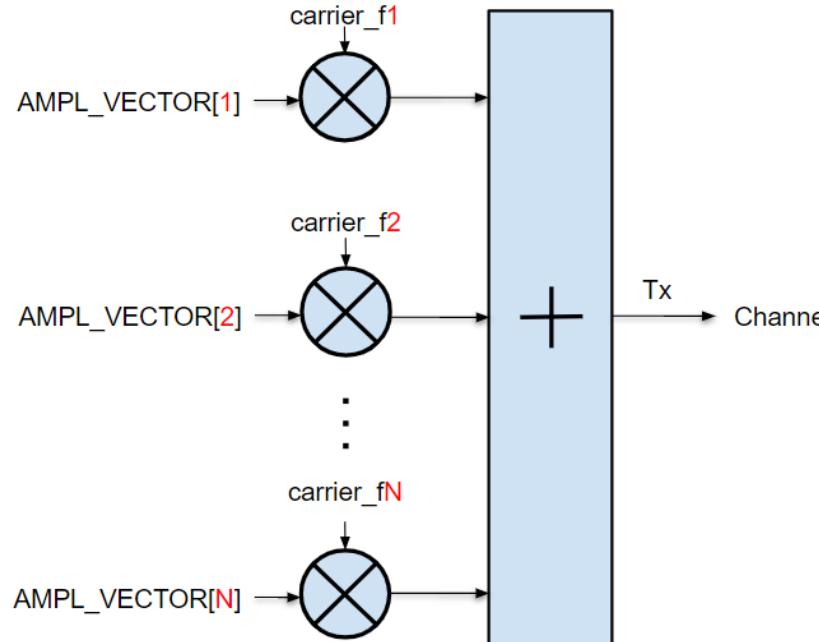
```
1  > import ...
3  pi = np.pi
4
5  # PARAMETERS
6  TIME_VECTOR_SIZE = 60
7  # amplitudes for frequencies [1,2,3,4,5,6]
8  AMPL_VECTOR = [1.23,4.56, 7.89,-1.23,-4.56, -7.89]
9
10 # CALCULATION
11 t = np.linspace( start: 0, 2*pi,TIME_VECTOR_SIZE, endpoint=False)
12
13 Tx = np.zeros(len(t))
14 for i, amp in enumerate(AMPL_VECTOR):
15     f = i + 1
16     Tx += amp*np.sin(f*t)
17
18 # PRESENTATION
19 plt.plot(Tx)
20 plt.axhline(y=0,color='black')
21 plt.grid()
22 plt.show()
23
24 # SAVING
25 np.save( file: 'TxSignal',Tx)
```



N frequencies : Single sinewave per frequency : Demodulation

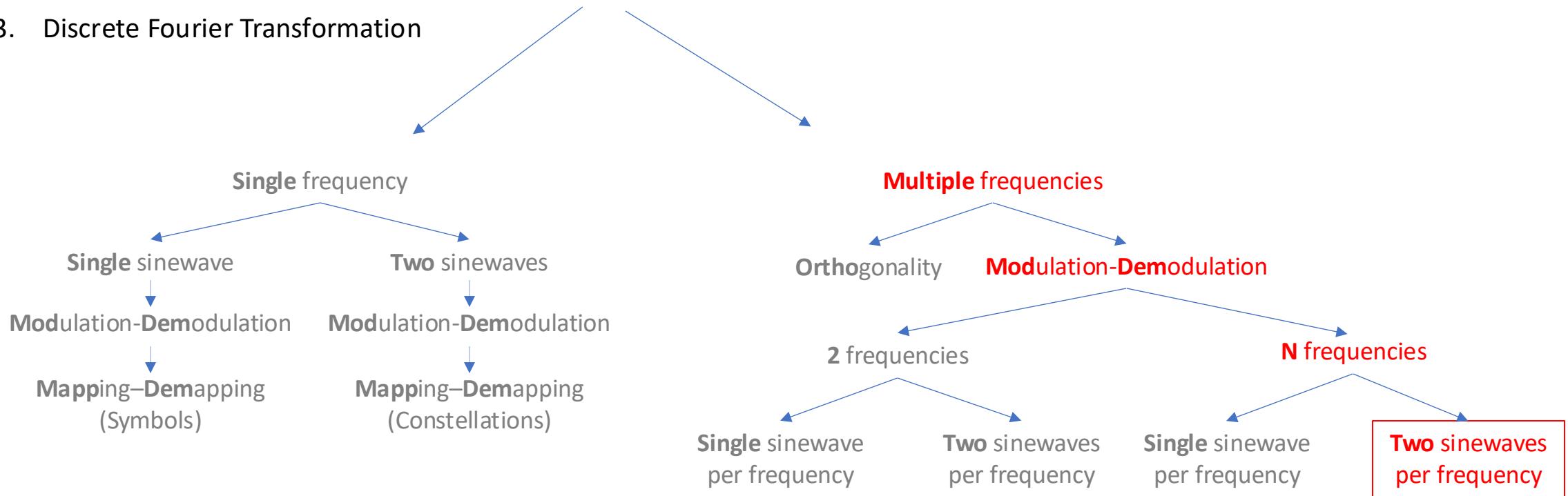
Complete script to **demodulate** signal which consists of N amplitude modulated sinusoids of orthogonal frequencies

```
1  > import ...
3  pi = np.pi
4
5  # loading Rx vector from file and...
6  Rx = np.load('TxSignal.npy')
7
8  # .. plotting it
9  plt.plot(Rx)
10 plt.axhline(y=0,color='black')
11 plt.grid()
12 plt.show()
13
14 # PARAMETERS
15 TIME_VECTOR_SIZE = 60
16 CARRIER_NR = 6
17
18 # CALCULATION
19 t = np.linspace( start= 0, 2*pi,TIME_VECTOR_SIZE, endpoint=False)
20
21 ampl_l = list()
22 for i in range(0, CARRIER_NR):
23     f = i + 1
24     dot = np.dot(Rx, np.sin(f*t))
25     ampl = dot/np.dot(np.sin(f*t), np.sin(f*t))
26     ampl_l.append(ampl)
27
28 # PRESENTATION
29 for a in ampl_l:
30     print(f'{a:0.2f}', end=' ')
```



1.23, 4.56, 7.89, -1.23, -4.56, -7.89,

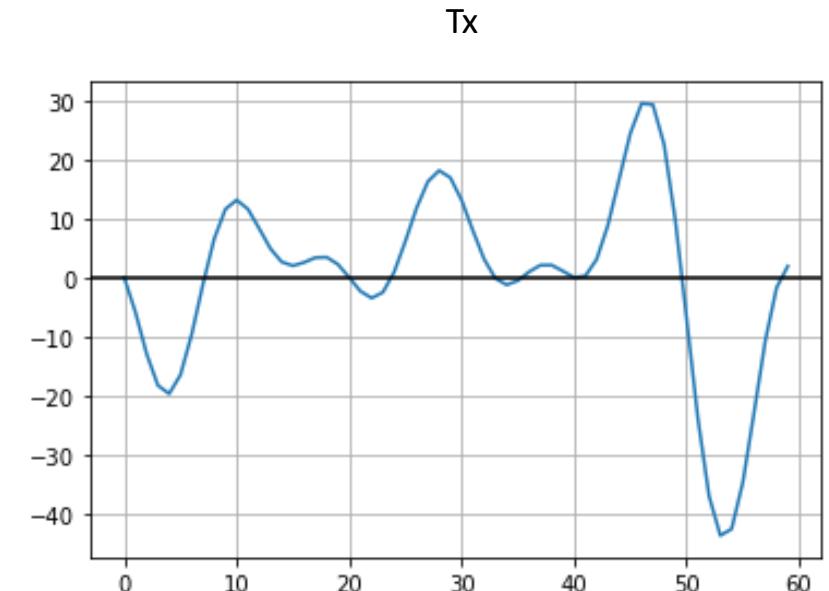
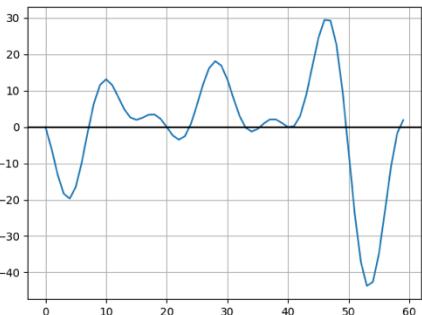
1. Sinewaves orthogonality
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation



N frequencies : Two sinewaves per frequency : Modulation

Complete script to make **quadrature modulation** of N orthogonal frequencies

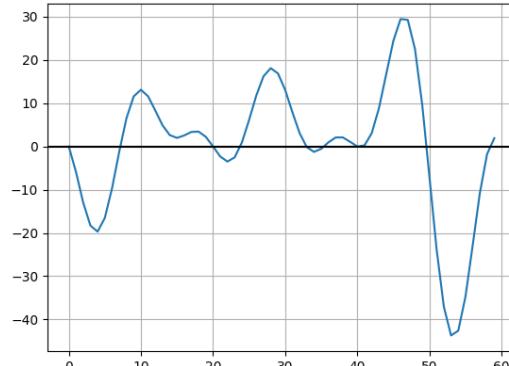
```
1  > import ...
3  pi = np.pi
4
5  # PARAMETERS
6  TIME_VECTOR_SIZE = 60
7
8  # amplitudes for frequency [1,2,3,4,5,6]
9  AMPL_VECTOR_SIN = [ 1.23,  4.56,  7.89, -1.23, -4.56, -7.89]
10 AMPL_VECTOR_COS = [-9.87, -6.54, -3.21,  9.87,  6.54,  3.21]
11
12 # CALCULATION
13 t = np.linspace( start: 0, 2*pi, TIME_VECTOR_SIZE, endpoint=False)
14
15 Tx = np.zeros(TIME_VECTOR_SIZE)
16 for i, (amp_sin,amp_cos) in enumerate(zip(AMPL_VECTOR_SIN,AMPL_VECTOR_COS)):
17     f = i + 1
18     Tx += amp_sin * np.sin(f*t) + amp_cos * np.cos(f*t)
19
20 # PRESENTATION
21 plt.plot(Tx)
22 plt.axhline(y=0,color='black')
23 plt.grid()
24 plt.show()
25
26 # SAVING
27 np.save( file: 'TxSignal',Tx)
28 np.save('TxSignal',Tx)
```



N frequencies : Two sinewaves per frequency : Demodulation

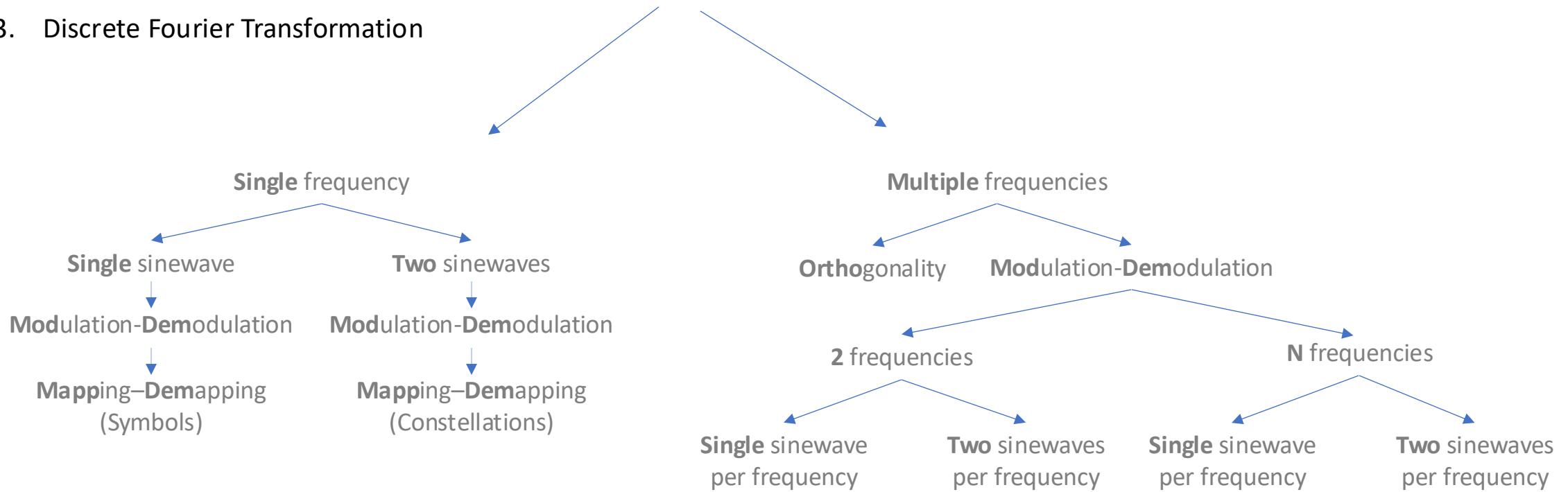
Complete script to **demodulate** signal which consists of **N quadrature modulated** frequencies

```
1  > import ...
3  pi = np.pi
4
5  Rx = np.load('TxSignal.npy')
6
7  plt.plot(Rx)
8  plt.axhline(y=0,color='black')
9  plt.grid()
10 plt.show()
11
12 # PARAMETERS
13 TIME_VECTOR_SIZE = 60
14
15 # CALCULATION
16 t = np.linspace( start=0, 2*pi,TIME_VECTOR_SIZE, endpoint=False)
17
18 ampl_sin_l = list()
19 ampl_cos_l = list()
20
21 for f in range(1,7):
22     dot_sin = np.dot(Rx, np.sin(f*t))
23     dot_cos = np.dot(Rx, np.cos(f*t))
24
25     ampl_sin = dot_sin/np.dot(np.sin(f*t), np.sin(f*t))
26     ampl_cos = dot_cos/np.dot(np.cos(f*t), np.cos(f*t))
27
28     ampl_sin_l.append(ampl_sin)
29     ampl_cos_l.append(ampl_cos)
30
31 for a in ampl_sin_l:
32     print(f'{a:0.2f}',end=' ')
33 print()
34 for a in ampl_cos_l:
35     print(f'{a:0.2f}',end=' ')
```



```
1.23, 4.56, 7.89, -1.23, -4.56, -7.89,
-9.87, -6.54, -3.21, 9.87, 6.54, 3.21,
```

1. Sinewaves orthogonality
2. Orthogonal sinewaves amplitude modulation - **DONE**
3. Discrete Fourier Transformation



Discrete Fourier Transformation by Jack Schaedler

1. Sinewaves orthogonality
2. Orthogonal sinewaves amplitude modulation
3. Discrete Fourier Transformation (DFT)

Familiar with below web page up to and including chapter “Digging deeper”.

<https://jackschaedler.github.io/circles-sines-signals/index.html>

(It is the best introduction to DFT known to tutor. It should take 3h)

The screenshot shows the homepage of the website 'SEEING CIRCLES, SINES, AND SIGNALS'. The title is at the top in large, bold, multi-colored letters. Below it is a subtitle 'A COMPACT PRIMER ON DIGITAL SIGNAL PROCESSING' and social media icons for Twitter and GitHub. The page is organized into four main columns: 'INTRO, SIGNALS AND SOUND', 'SINES AND SAMPLING', 'TRANSFORMS AND NOTATION', and 'INSIDE THE DFT'. Each column contains several links to sub-topics. A green button at the bottom right of the page says 'DIGGING DEEPER'.

INTRO, SIGNALS AND SOUND	SINES AND SAMPLING	TRANSFORMS AND NOTATION	INSIDE THE DFT
INTRODUCTION	SINE & COSINE	REPRESENTATIONS & TRANSFORMS	THE DOT PRODUCT
SIGNALS	TRIGONOMETRY REVIEW	THE FOURIER TRANSFORM	CORRELATION
DISCRETE SIGNALS	THE SAMPLING THEOREM	NOTATION	CORRELATION WITH SINE
SAMPLING & ALIASING	NYQUIST FREQUENCY	COMPLEX NUMBERS	CORRELATION WITH SINE AND COSINE
SOUND WAVES	WAGON WHEEL EFFECT	EULER'S FORMULA	DISCRETE FOURIER TRANSFORM EXAMPLE
TIMBRE	SINE WAVE ALIASING		

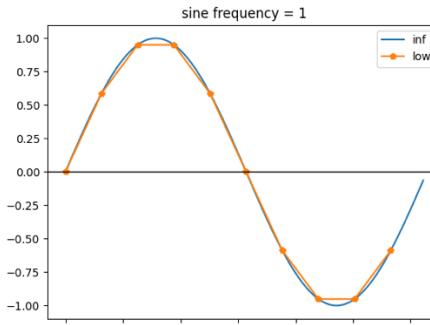
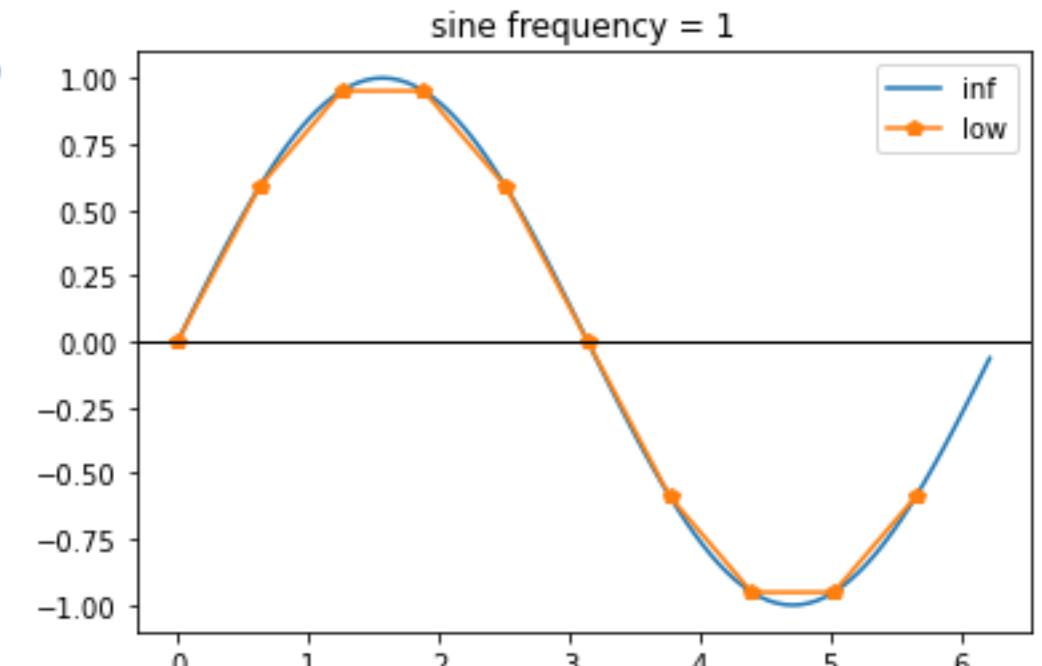
DIGGING DEEPER

DFT, Aliasing (ambiguity)

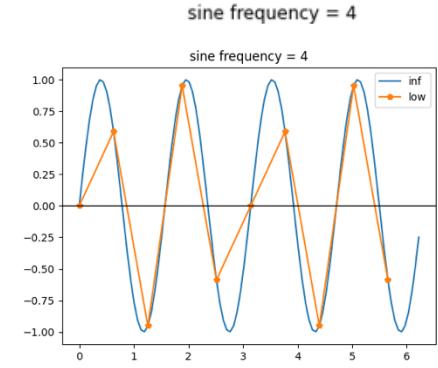
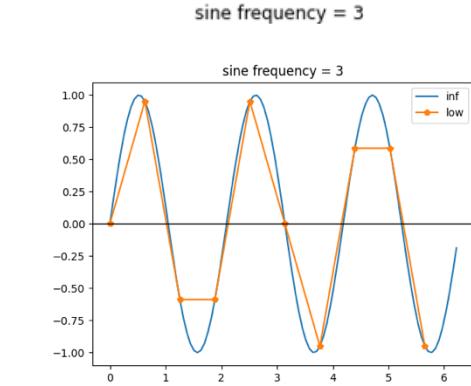
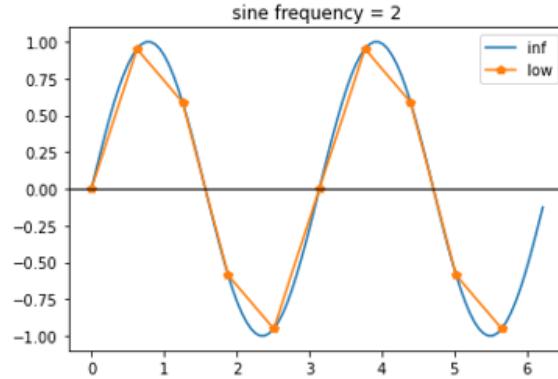
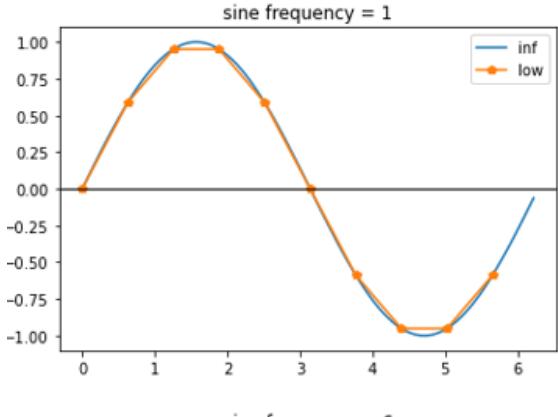
Complete script to obtain given plot.

```
1  > import ...
3    from matplotlib.pyplot import legend
4
5  INFINITE_SAMPLE_RATE = 100 # infinity sample rate imitation (analog signal)
6  FINITE_SAMPLE_RATE = 10    # real (finite) sample rate
7
8  SIN_FREQ = 1
9
10 t_ideal    = np.linspace( start: 0, 2*np.pi, INFINITE_SAMPLE_RATE, endpoint=False)
11 t_sampled  = np.linspace( start: 0, 2*np.pi, FINITE_SAMPLE_RATE, endpoint=False)
12
13 sin_ideal   = np.sin(SIN_FREQ*t_ideal)
14 sin_sampled = np.sin(SIN_FREQ*t_sampled)
15
16 plt.plot( *args: t_ideal, sin_ideal, label='inf')
17 plt.plot( *args: t_sampled, sin_sampled, 'p-', label='low')
18 plt.axhline( y: 0,color='black', linewidth=1)
19 plt.title(f'sine frequency = {SIN_FREQ}')
20 plt.legend()
21 plt.show()
```

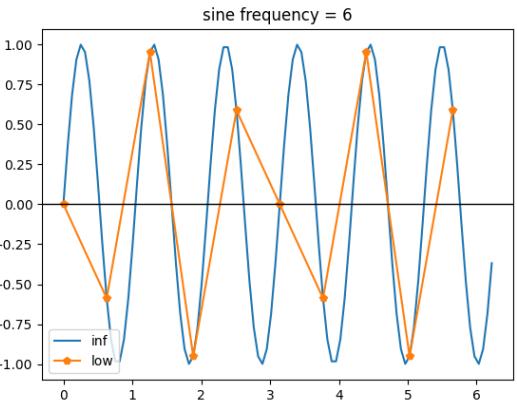
analog signal)



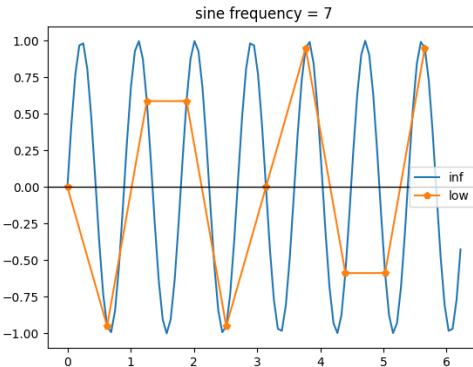
Use the script to complete missing plots



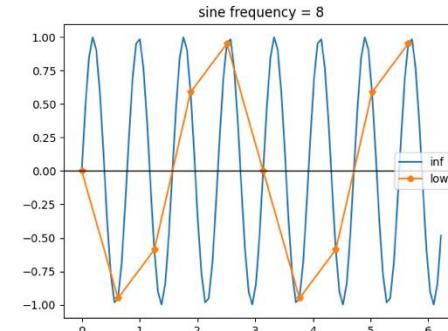
sine frequency = 6



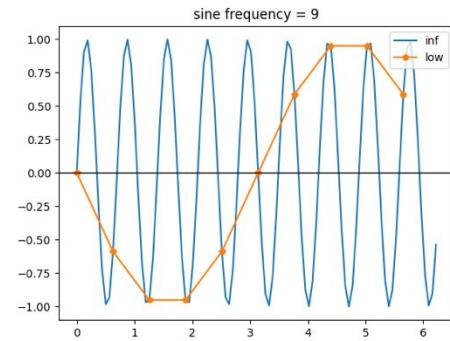
sine frequency = 7



sine frequency = 8

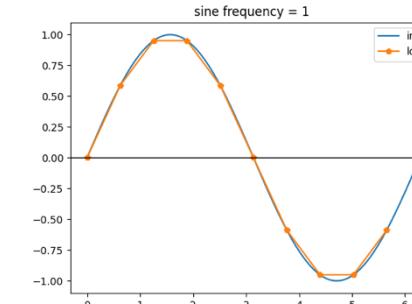
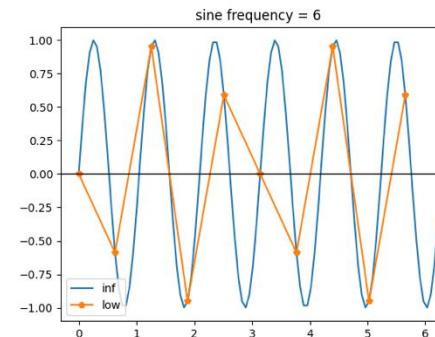
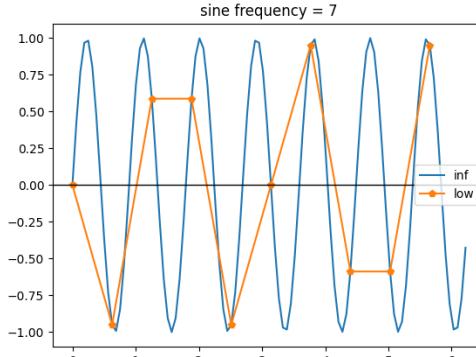
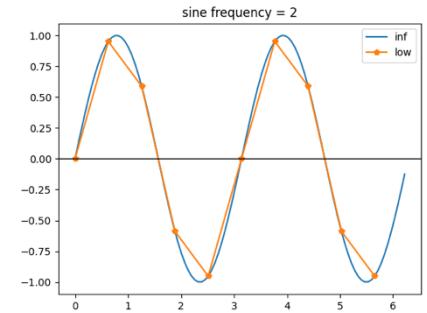
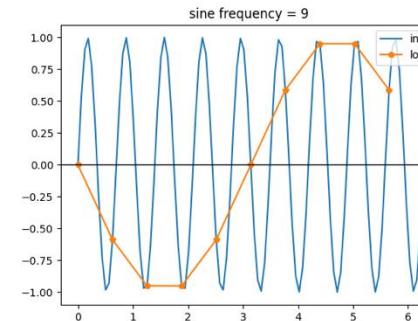
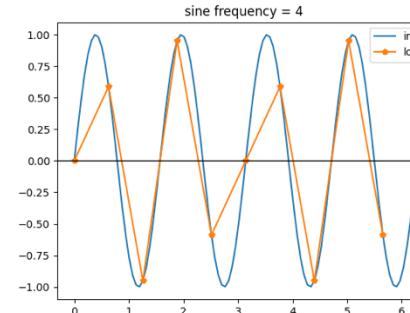
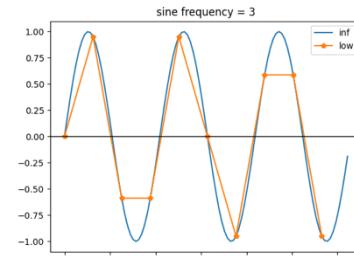
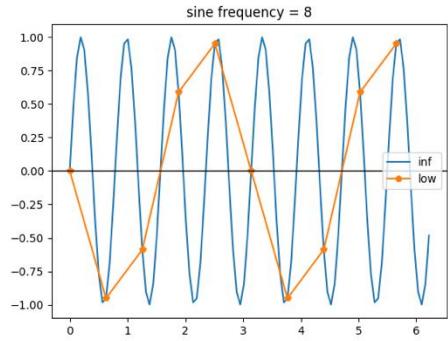


sine frequency = 9



Copy all plots from previous slide to this slide **but**
put the plots in lower row below similar (or “antisimilar”) plots from upper row.

1. Which frequency is “axis of symmetry”? 5
2. What is relation between it and sampling frequency?
It’s half of real sample rate
3. Which sine is similar to $\sin(\text{freq}=3)$? 7



1. Use given script to complete plots

“f” is a “SIN_FREQ” parameter from script

2. Move function “my_stem_plot” to library “mylib” and make script to run again

```
def my_stem_plot(y,title,y_range=None):
    x = np.arange(len(y))
    plt.stem(x,y, '-p')

    plt.xticks(x)

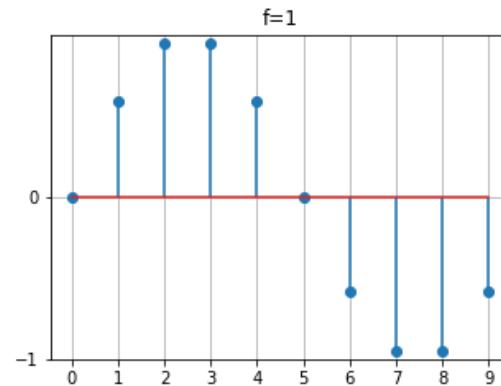
    if y_range:
        plt.ylim(y_range)
        plt.yticks(np.arange(*y_range))

    plt.grid()
    plt.title(title)
    fig = plt.gcf()
    fig.set_size_inches(4, 3.6)
    plt.show()

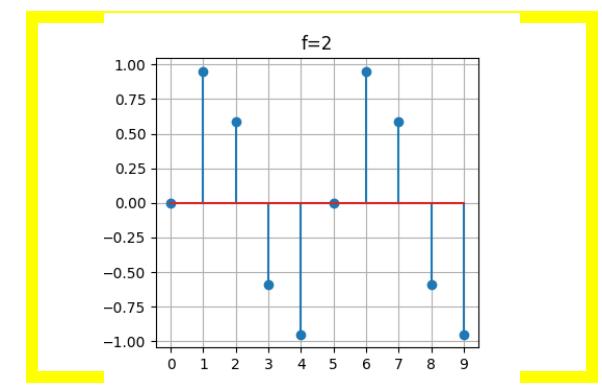
#-----
SAMPLE_NR = 10
FREQ = 1

t = np.linspace(0, 2*np.pi, SAMPLE_NR, endpoint=False)

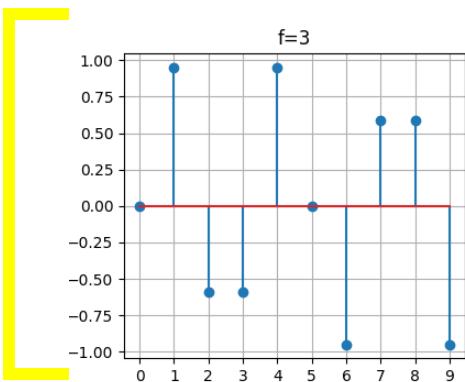
samples = np.sin(t*FREQ)
my_stem_plot(samples,f'f={FREQ}')
```



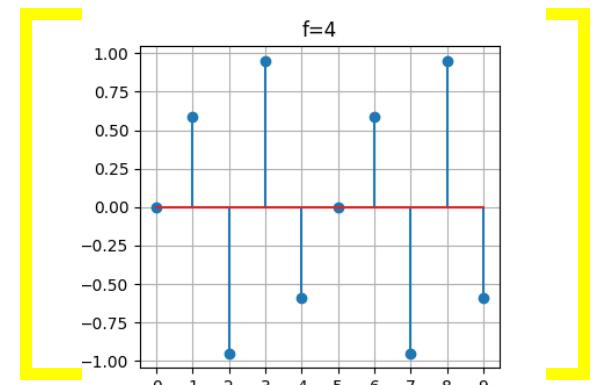
f=2



f=3



f=4



Complete script to get given plot set:

- import “my_stem_plot”
- modify “my_stem_plot” to get plots figures in the shape of square

```

1  import numpy as np
2  import matplotlib.pyplot as plt
3  from mylib import my_stem_plot

4

5  SAMPLE_NR = 10
6  FREQ = 3

7

8  t = np.linspace( start: 0, 2*np.pi, SAMPLE_NR, endpoint=False)

9

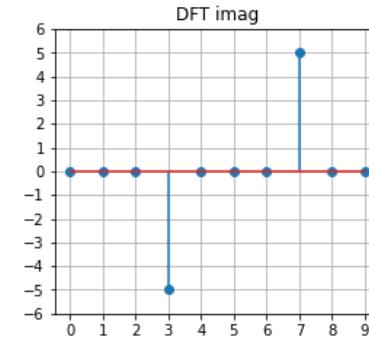
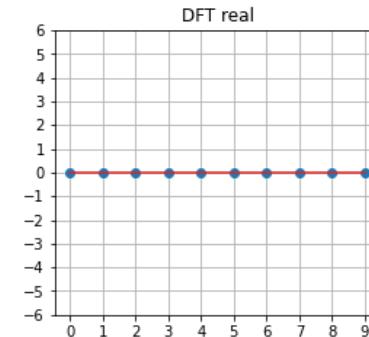
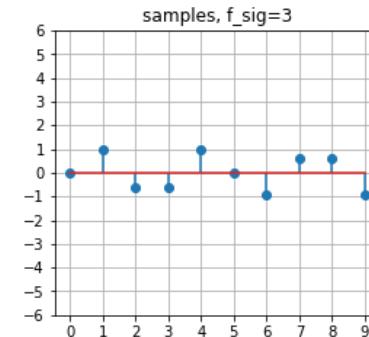
10 samples = np.sin(t*FREQ) #+ np.cos(t)
11 my_stem_plot(samples, title: f'samples, sin_f={FREQ}', y_range=(-6,7))

12

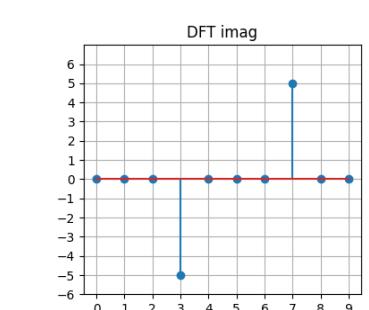
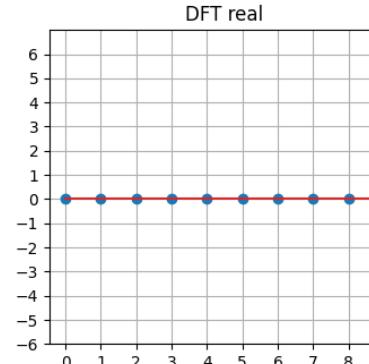
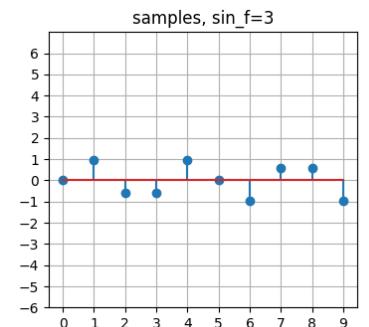
13 fft = np.fft.fft(samples)
14 my_stem_plot(fft.real, title: 'DFT real', y_range=(-6,7))
15 my_stem_plot(fft.imag, title: 'DFT imag', y_range=(-6,7))

```

Reference plots

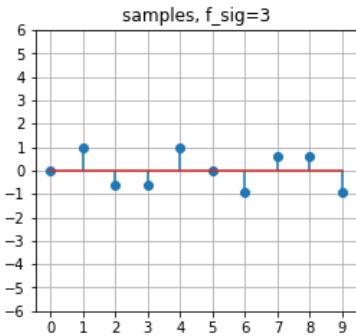
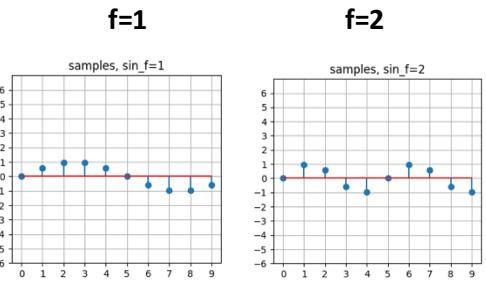


Your plots

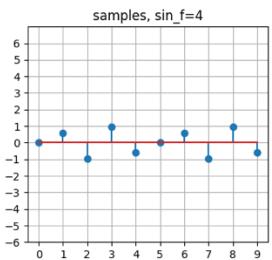


DFT, numpy implementation (FFT)

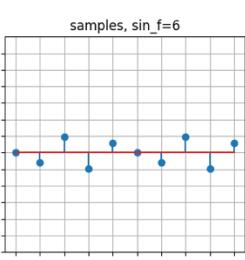
Complete given plot set



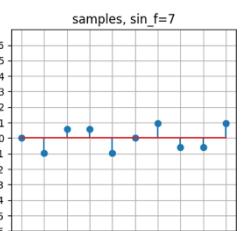
f=4



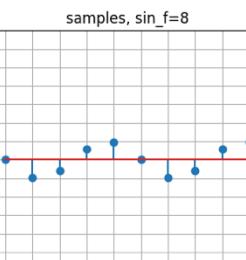
f=6



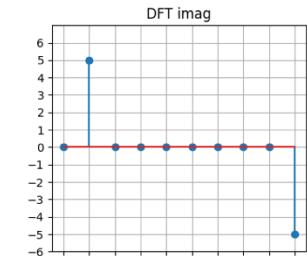
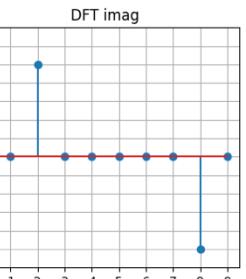
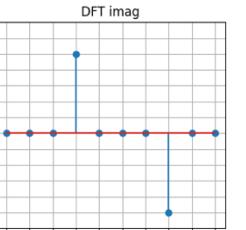
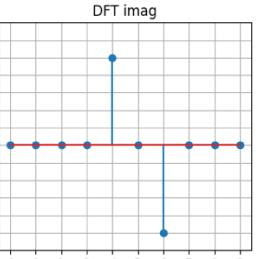
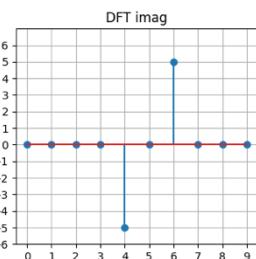
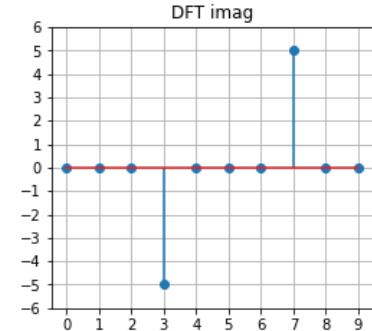
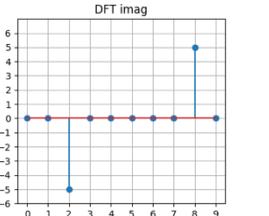
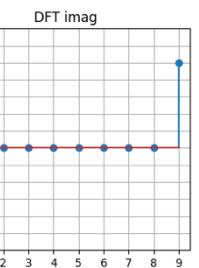
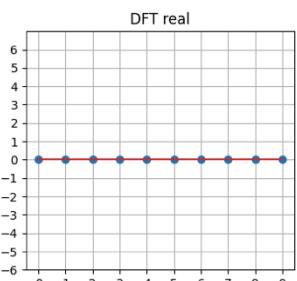
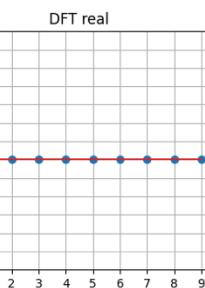
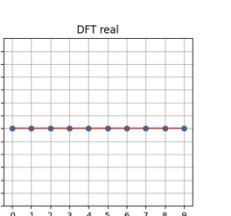
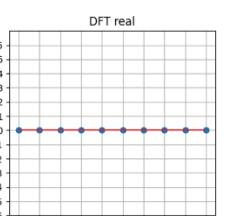
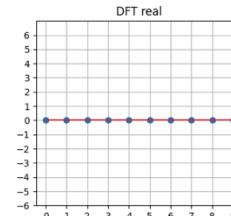
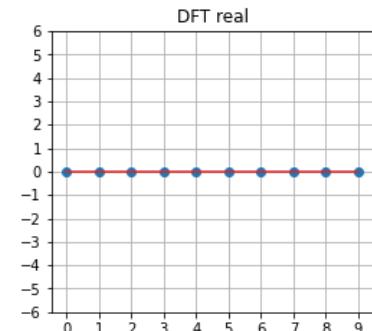
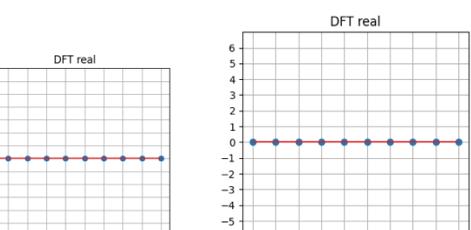
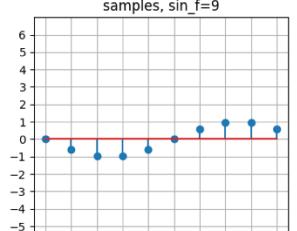
f=7



f=8

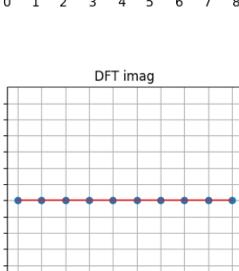
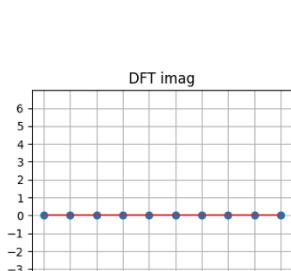
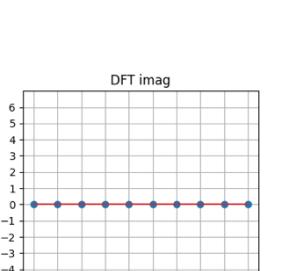
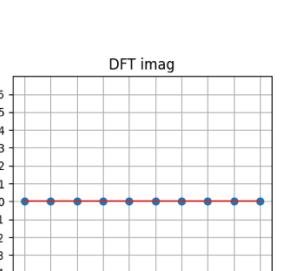
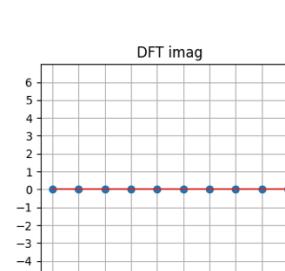
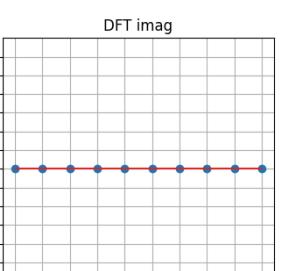
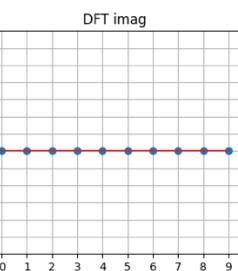
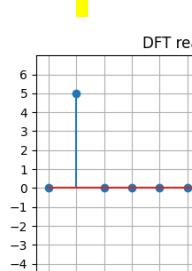
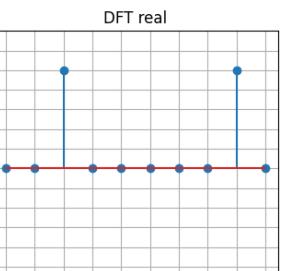
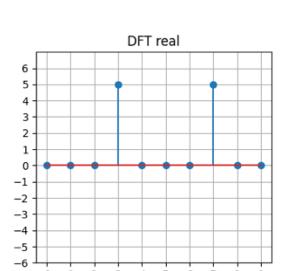
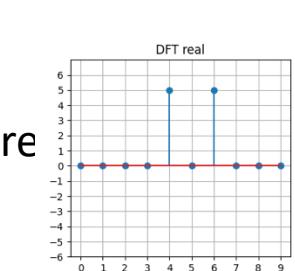
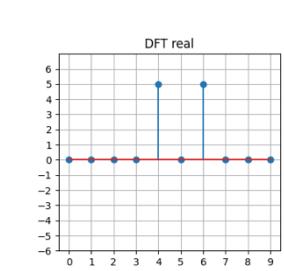
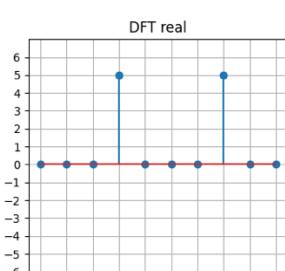
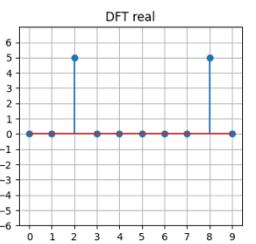
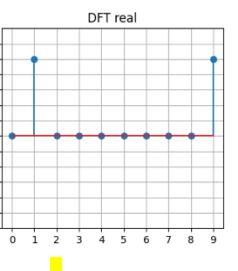
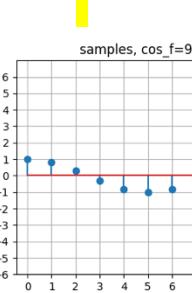
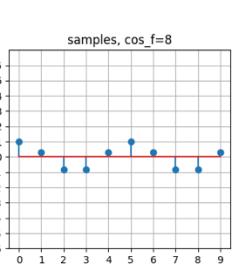
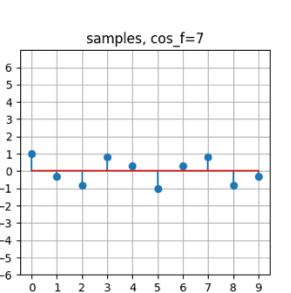
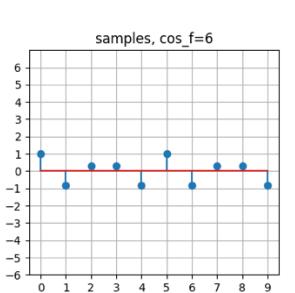
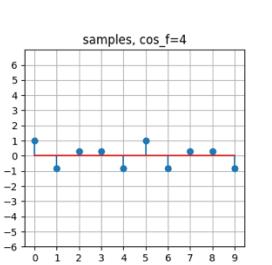
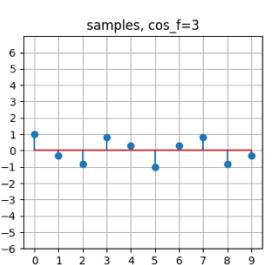
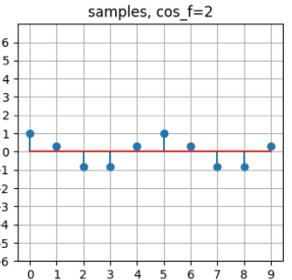
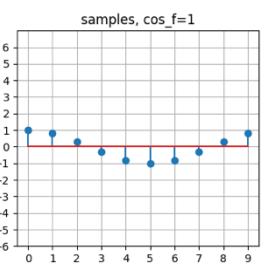


f=9



DFT: real component

Repeat previous slide for cosine

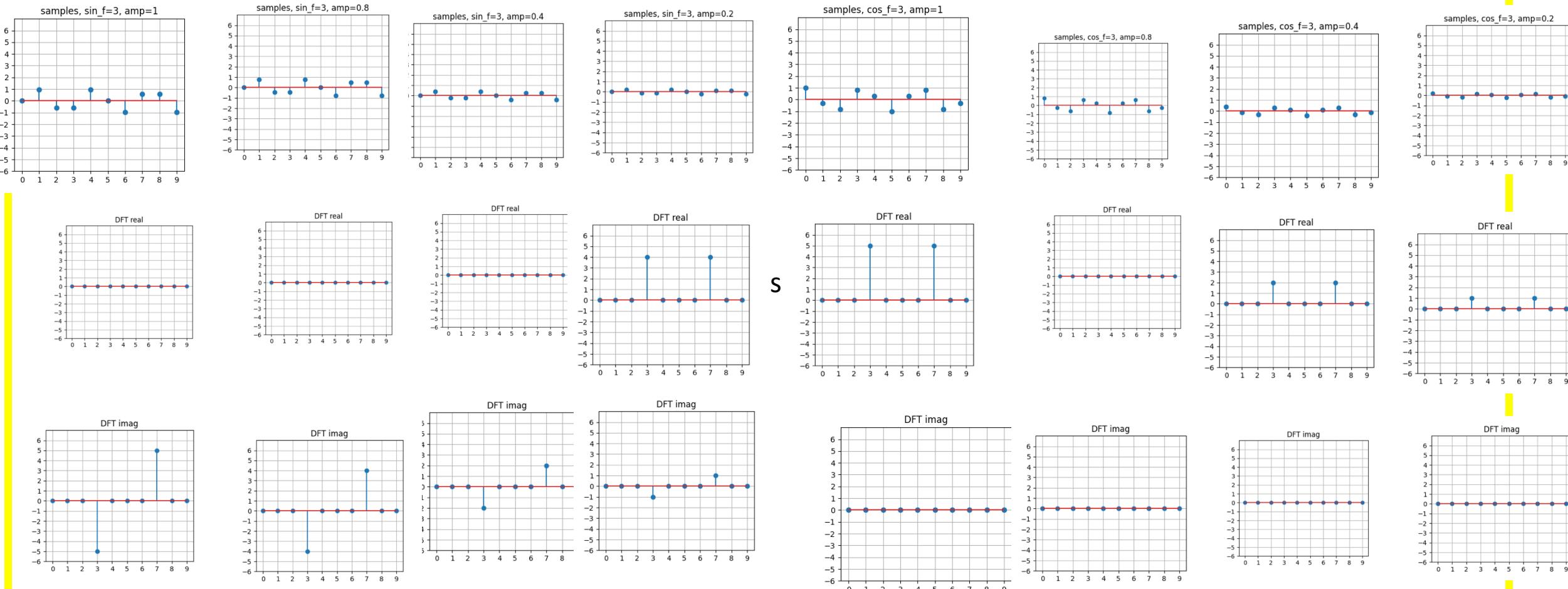


DFT, amplitude

Generate plot set from previous slide for sinus and csinus f=3 and signal amplitudes: 1, 4/5, 2/5, 1/5

Base on plots analizys write formula for DFT amplitude:

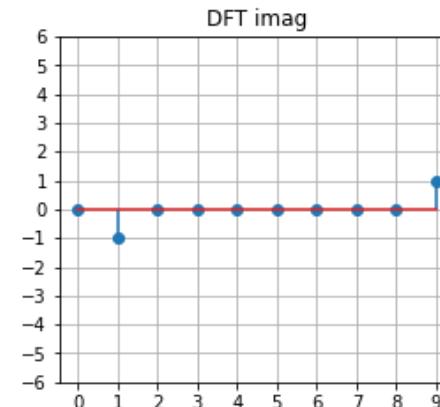
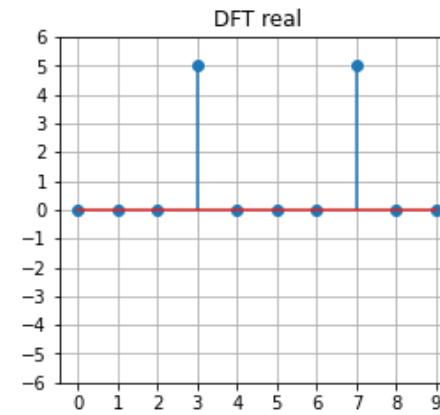
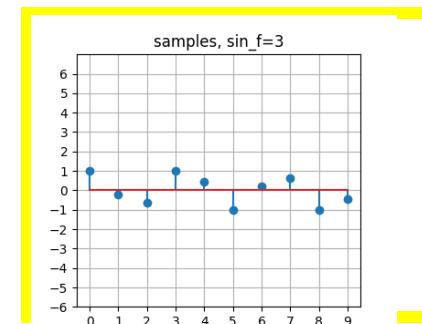
- $\text{RealAmp}(\cos_amp, \text{SAMPLE_NR}) = \cos_amp * \text{SAMPLE_NR}/2$
- $\text{ImagAmp}(\sin_amp, \text{SAMPLE_NR}) = \sin_amp * \text{SAMPLE_NR}/2$



Find formula for signal which gives presented DFT

```
samples = 0.2*np.sin(t*FREQ/3) + np.cos(t*FREQ)
```

Place on the slide corresponding samples plot



Complete the part of the script evaluating real part of DFT.

(Recall from previous chapters how to measure amplitude of sinus or cosinus in signal)

```

1 import numpy as np
2 import matplotlib.pyplot as plt
3 from mylib import my_stem_plot

4

5 SAMPLE_NR = 10
6 SIN_FREQ = 3

7

8 t = np.linspace( start: 0, 2*np.pi, SAMPLE_NR, endpoint=False)

9

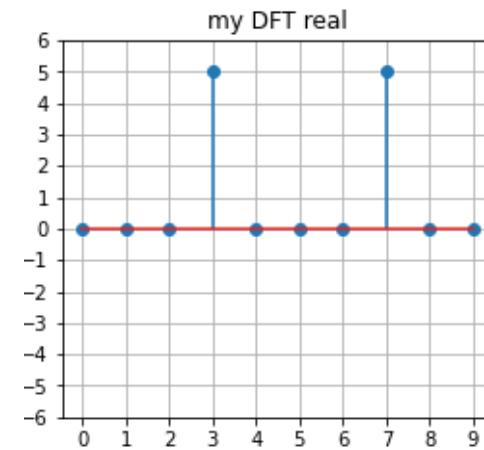
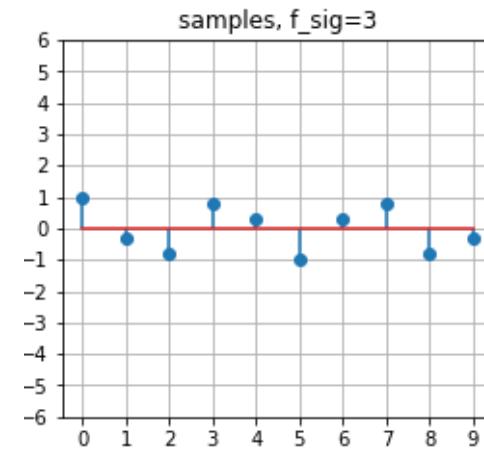
10 samples = np.cos(t*SIN_FREQ)
11 my_stem_plot(samples, title: f'samples, f_sig={SIN_FREQ}')

12 real = list()
13 for f in range(SAMPLE_NR):
14     real.append(np.dot(samples,np.cos(t*f)))
15

16 my_stem_plot(real, title: 'my DFT real', y_range=(-6,7))
17

```

Plots for SIN_FREQ =3 should look as following



1. Complete previous script with evaluation of imaginary part

2. Encapsulate DFT related code into “myDFT” function which should:

- receive `ne` argument (`samples`)
- not use `SAMPLE_NUMER` const.
- use `ne` loop only
- “return `real, image`”

3. Move the function to `mylib` and make the main script work

```

1 import numpy as np
2 import matplotlib.pyplot as plt
3 from mylib import my_stem_plot
4 from mylib import myDFT
5
6 SAMPLE_NR = 10
7 SIN_FREQ = 3
8
9 t = np.linspace( start: 0, 2*np.pi, SAMPLE_NR, endpoint=False)
10
11 samples = np.cos(t*SIN_FREQ)
12 my_stem_plot(samples, title: f'samples, f_sig={SIN_FREQ}')
13
14 real, imag = myDFT(samples)
15
16 my_stem_plot(real, title: 'my DFT real', y_range=(-6,7))
17 my_stem_plot(imag, title: 'my DFT imag', y_range=(-6,7))
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33 def myDFT(samples): 2 usages
34     N = len(samples)
35     real = list()
36     imag = list()
37     t = np.linspace(0, 2 * np.pi, N, endpoint=False)
38
39     for f in range(N):
40         real.append(np.dot(samples, np.cos(t * f)))
41         imag.append(np.dot(samples, np.sin(t * f)))
42
43     return real, imag

```

1. Check myDFT by using following script. It should generate plots as below.

```

SAMPLE_NR = 10

t = np.linspace(0, 2*np.pi, SAMPLE_NR, endpoint=False)

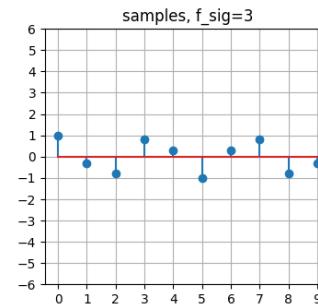
samples = np.cos(t*1)*2/5+np.sin(t*4)*4/5
my_stem_plot(samples,f'samples')

real, imag = myDFT(samples)
my_stem_plot(real,'myDFT real')
my_stem_plot(imag,'myDFT imag')

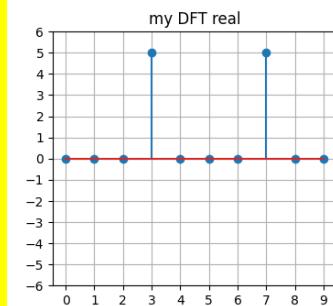
fft = np.fft.fft(samples)
my_stem_plot(fft.real,'FFT real',y_range=(-6,7))
my_stem_plot(fft.imag,'FFT imag',y_range=(-6,7))

```

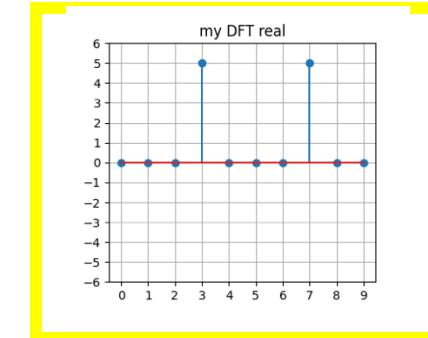
samples



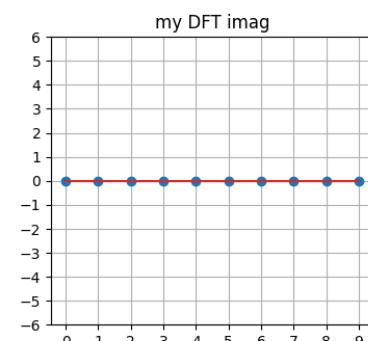
FFT real



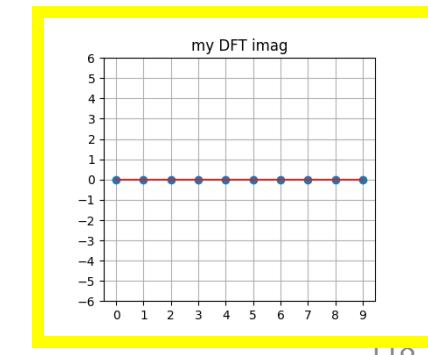
myDFT real



FFT imag



myDFT imag



“myDFT–numpy DFT” comparison by using DTMF signal

Use following script for “myDFT–numpy DFT” comparison by using exemplary DTMF signal. (Read comments carefully)

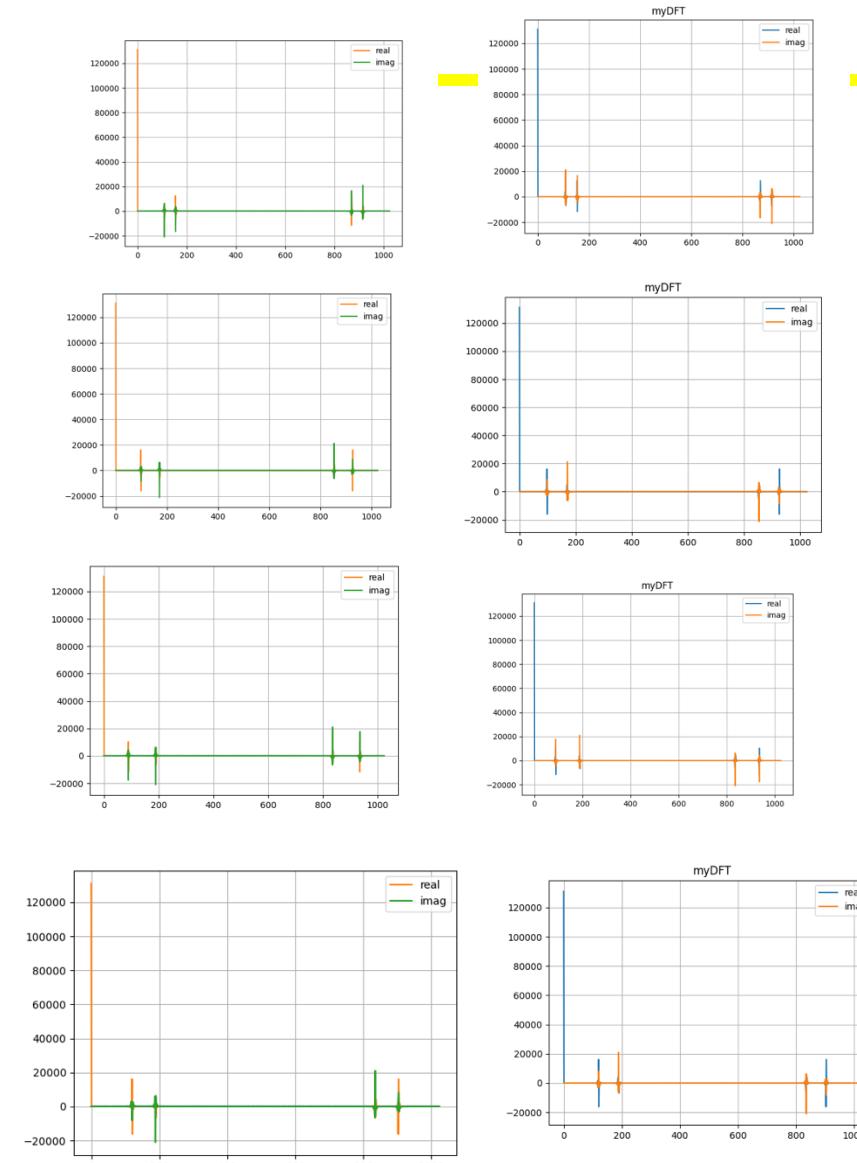
```
import numpy as np
import matplotlib.pyplot as plt
from scipy.io.wavfile import read

# Loads samples from .wav file with exemplary DTMF signal
# adapt file path
samples = read(r'wav\a.wav')  https://www.audiocheck.net/audiocheck_dtmf.php
samplig_freq = samples[0]
samples = samples[1]
samples = samples[:1024]
plt.plot(samples)

# use commenst to switch between myDFT and numpy DFT (FFT)
fft = np.fft.fft(samples)
real = fft.real
imag = fft.imag
# real, imag = myDFT(samples)

plt.plot(real,label='real')
plt.plot(imag,label='imag')
plt.grid()
plt.legend()

#could be usefool for zooming
# plt.xlim(0,100)
# plt.ylim(-20_000,2_0000)
```



Decoding DTMF signal by using DFT

Use following script from previous slide to decode following samples of DTMF signal (see Wikipedia).

Replace question mark with key.

a.wav: 7

b.wav: 5

c.wav: 3

d.wav: #

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 from scipy.io.wavfile import read
4 from mylib import myDFT, my_stem_plot
5 # loads samples from .wav file with exemplary DTMF signal
6 # adapt file path
7 samples = read(r'wav/d.wav')
8 samplig_freq = samples[0]
9 samples = samples[1]
10 samples = samples[:1024]
11 plt.plot(samples)
12 plt.show()
13 # use comment to switch between myDFT and numpy DFT (FFT)
14 #fft = np.fft.fft(samples)
15 #real = fft.real
16 #imag = fft.imag
17 real, imag = myDFT(samples)
18 |
19 plt.title("myDFT")
20 plt.plot(*args: real, label='real')
21 plt.plot(*args: imag, label='imag')
22 plt.grid()
23 plt.legend()
24 plt.show()
25 #frequencies on x
26 plt.plot(*args: np.linspace(start: 0, samplig_freq, len(samples)), real, label='real')
27 plt.plot(*args: np.linspace(start: 0, samplig_freq, len(samples)), imag, label='imag')
28 plt.grid()
29 plt.show()
30 #could be useful for zooming
31 plt.xlim(*args: 0,100)
32 plt.ylim(*args: -20_000,20_000)
```

