

Exercise 1

Question 1

```
In [36]: import matplotlib.pyplot as plt
import numpy as np
import string

# points a, b, c and d
a, b, c, d = (0, 1, 0), (1, 0, 1), (0, -1, 2), (-1, 0, 3)

# matrix with row vectors of points
A = np.array([a, b, c, d])

# 4 colors to represent 4 points
color_lut = 'rgbc'

# 3x3 Identity transformation matrix
I = np.eye(3) #float

def print_transform(t_matrix, override = False):
    fig = plt.figure()
    ax = plt.gca()
    xs = []
    ys = []

    for row in A:
        row = row.copy()
        # for translate matrix
        if override:
            row[2] = 1
        output_row = t_matrix @ row
        x, y, i = output_row
        xs.append(x)
        ys.append(y)

        i = int(i) # convert float to int for indexing
        c = color_lut[i]

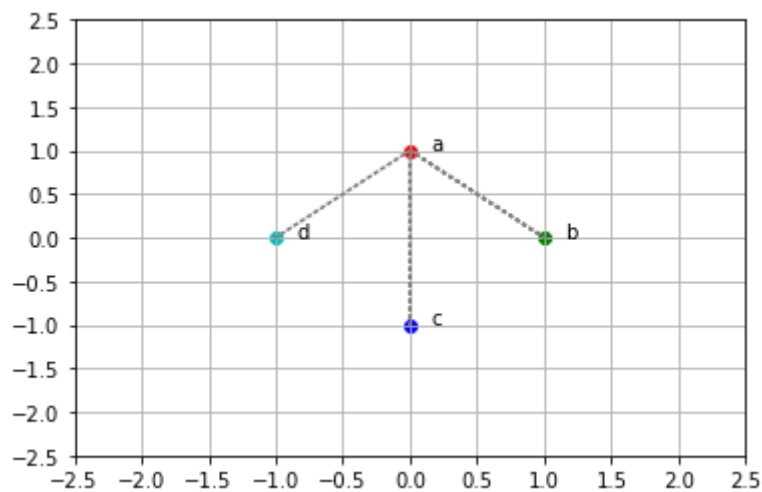
        plt.scatter(x, y, color=c)
        plt.text(x + 0.15, y, f"{string.ascii_letters[i]}")

        xs.append(xs[0])
        ys.append(ys[0])

    plt.plot(xs, ys, color="gray", linestyle='dotted')
    ax.set_xticks(np.arange(-2.5, 3, 0.5))
    ax.set_yticks(np.arange(-2.5, 3, 0.5))

    plt.grid()
    plt.show()

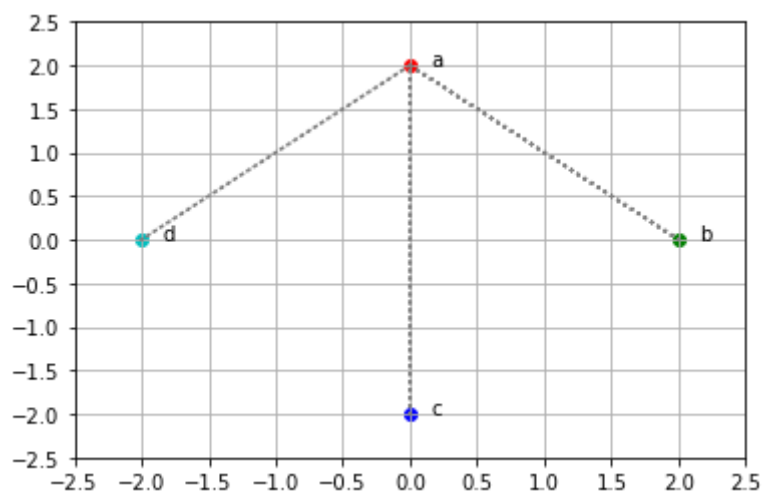
print_transform(I)
```



Question 2

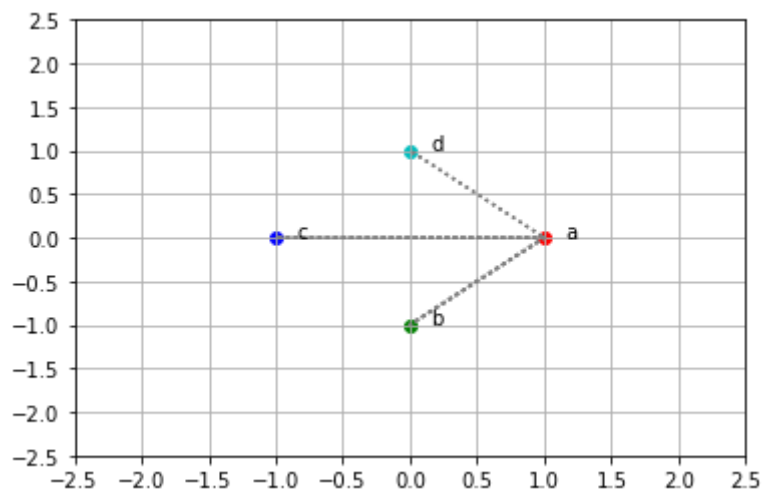
```
In [37]: # 3x3 2x scaling transformation matrix
S = np.array([[2,0,0],
              [0,2,0],
              [0,0,1]])

print_transform(S, False)
```



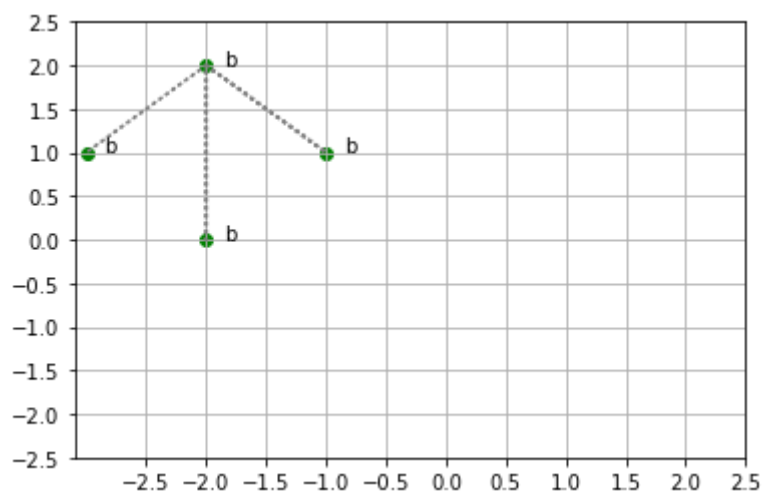
```
In [38]: # 3x3 90 degree rotation matrix
R = np.array([[0, 1,0],
              [-1,0,0],
              [0, 0,1]])

print_transform(R, False)
```



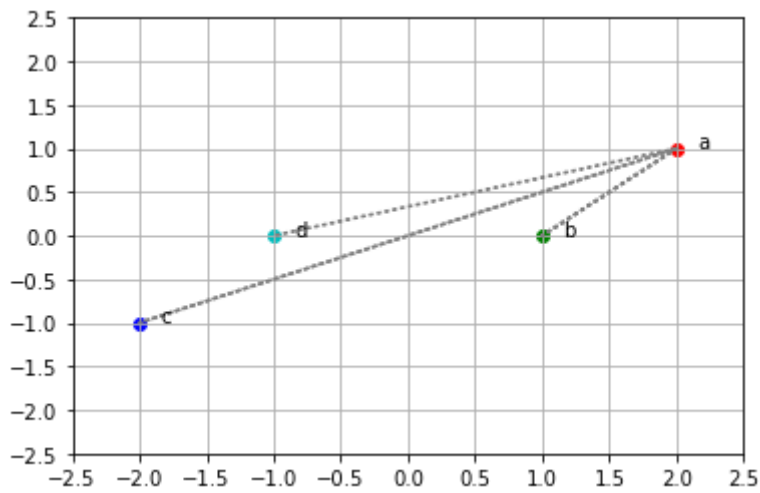
```
In [39]: # 3x3 translation matrix
# shifts x by -2, y by 1
T = np.array([[1,0,-2],
              [0,1, 1],
              [0,0, 1]])

# translations are affected by the last item of vector, added override argument
# all points are 'b' and green because all vectors end with '1'
print_transform(T, True)
```



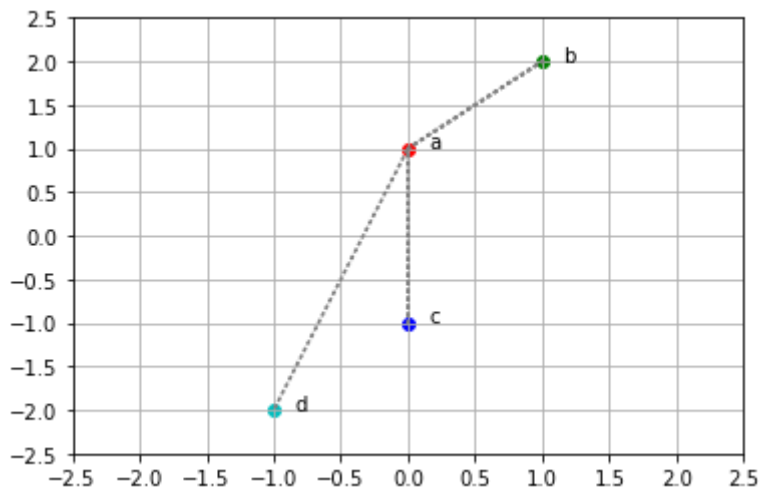
```
In [40]: # 3x3 horizontal shear matrix
HS = np.array([[1,2,0],
               [0,1,0],
               [0,0,1]])

print_transform(HS, False)
```



```
In [41]: # 3x3 vertical shear matrix
VS = np.array([[1,0,0],
               [2,1,0],
               [0,0,1]])

print_transform(VS)
```



Question 3

```
In [49]: def print_transforms(t_matrices):
fig = plt.figure()
ax = plt.gca()
xs = []
ys = []

# multiplies matrices from right->left until 1 is left
while len(t_matrices) > 1:
    t_matrices[-2] = np.matmul(t_matrices[-2], t_matrices[-1])
    del t_matrices[-1]

for row in A:
    output_row = t_matrices[0] @ row
    x, y, i = output_row
    xs.append(x)
    ys.append(y)

    i = int(i) # convert float to int for indexing
    c = color_lut[i]

    plt.scatter(x, y, color=c)
```

```

plt.text(x + 0.15, y, f"{string.ascii_letters[i]}")

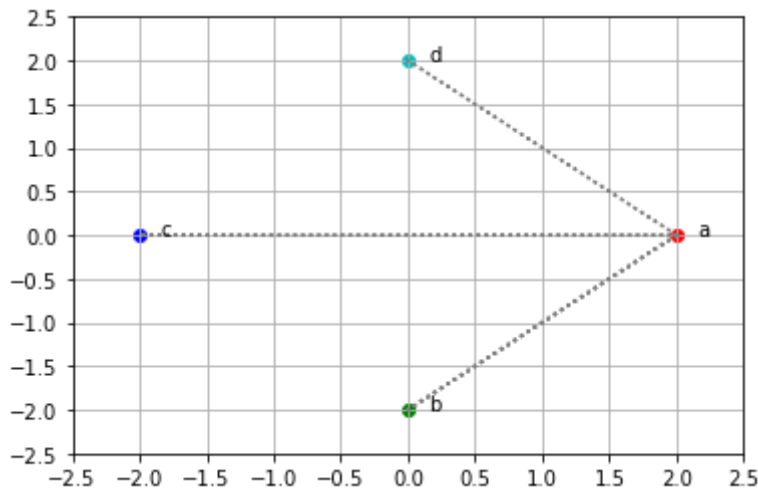
xs.append(xs[0])
ys.append(ys[0])

plt.plot(xs, ys, color="gray", linestyle='dotted')
ax.set_xticks(np.arange(-2.5, 3, 0.5))
ax.set_yticks(np.arange(-2.5, 3, 0.5))

plt.grid()
plt.show()

# rotate 90 degrees right followed by 2x scale up
ts = [S,R]
print_transforms(ts)

```



Exercise 2

Question 4

```

In [50]: '''Function to transform a matrix to reduced row echelon form'''

def rref(A):
    tol = 1e-16
    #A = B.copy()
    rows, cols = A.shape
    r = 0
    pivots_pos = []
    row_exchanges = np.arange(rows)
    for c in range(cols):
        ## Find the pivot row:
        pivot = np.argmax(np.abs(A[r:rows, c])) + r
        m = np.abs(A[pivot, c])
        if m <= tol:
            ## Skip column c, making sure the approximately zero terms are
            ## actually zero.
            A[r:rows, c] = np.zeros(rows-r)
        else:
            ## keep track of bound variables
            pivots_pos.append((r, c))

            if pivot != r:
                ## Swap current row and pivot row
                A[[pivot, r], c:cols] = A[[r, pivot], c:cols]

```

```

        row_exchanges[[pivot,r]] = row_exchanges[[r,pivot]]

    ## Normalize pivot row
    A[r, c:cols] = A[r, c:cols] / A[r, c];

    ## Eliminate the current column
    v = A[r, c:cols]
    ## Above (before row r):
    if r > 0:
        ridx_above = np.arange(r)
        A[ridx_above, c:cols] = A[ridx_above, c:cols] - np.outer(v, A[ridx_a
    ## Below (after row r):
    if r < rows-1:
        ridx_below = np.arange(r+1,rows)
        A[ridx_below, c:cols] = A[ridx_below, c:cols] - np.outer(v, A[ridx_b
        r += 1
    ## Check if done
    if r == rows:
        break;
    return A

```

```

In [51]: from numpy import linalg

# either x6 or decrease tol value in rref function
L = np.array([[ -1, 1/3, 1/3, 1/2, 0],
               [1/2, -1, 1/3, 0, 0],
               [1/2, 1/3, -1, 1/2, 0],
               [ 0, 1/3, 1/3, -1, 0]])

print("Reduced L:\n", rref(6*L))

```

```

Reduced L:
[[ 1.    0.    0.   -1.5   -0.   ]
 [ 0.    1.    0.  -1.3125 -0.   ]
 [ 0.    0.    1.  -1.6875 -0.   ]
 [ 0.    0.    0.    0.    0.   ]]

```

from the rref, we deduce that $r_a = 1.5rd$, $r_b = 1.3125rd$ and $r_c = 1.6875rd$
 popularity vector $r = [1.5, 1.3125, 1.6875, 1]$, setting $rd = 1$ as a free variable
 we can confirm this by computing $Lr = r$ and $(L-I)r = 0$ below

```

In [52]: L = np.array([[ 0, 1/3, 1/3, 1/2],
                       [1/2, 0, 1/3, 0],
                       [1/2, 1/3, 0, 1/2],
                       [ 0, 1/3, 1/3, 0]])
I = np.identity(4)
r = np.stack([1.5, 1.3125, 1.6875, 1])

calc_r = np.matmul(L, r)
print("Calculated Lr:\n", calc_r, "\n")

calc_r = np.matmul((L-I), r)
print("Calculated (L-I)r:\n", calc_r)

```

```

Calculated Lr:
[1.5    1.3125 1.6875 1.    ]

```

```

Calculated (L-I)r:
[0.  0.  0.  0.]

```

Question 5

```

In [53]: #
L = 12 * np.array([[ -1, 1/2, 1/4, 1, 1/3, 0], # ra = 1/2rb + 1/4rc + rd + 1/3re

```

```

[1/3, -1, 1/4, 0, 0, 0], # rb = 1/3ra + 1/4rc
[1/3, 1/2, -1, 0, 1/3, 0], # rc = 1/3ra + 1/2rb + 1/3re
[1/3, 0, 1/4, -1, 1/3, 0], # rd = 1/3ra + 1/4rc + 1/3re
[ 0, 0, 1/4, 0, -1, 0]]) # re = 1/4rc

```

```
rref_L = rref(L)
```

```
print("Reduced L:\n", rref_L)
```

Reduced L:

```

[[ 1.      0.      0.      0.      -6.33333333 -0.      ]
 [ 0.      1.      0.      0.      -3.11111111 -0.      ]
 [ 0.      0.      1.      0.      -4.      -0.      ]
 [ 0.      0.      0.      1.      -3.44444444 -0.      ]
 [ 0.      0.      0.      0.      0.      0.      ]]

```

from the rref, $ra = 19re/3$, $rb = 28re/9$, $rc = 4re$, $rd = 31re/9$

popularity vector $r = [19/3, 28/9, 4, 31/9, 1]$, setting $re = 1$ as a free variable

```

In [54]: '''
# multiply both sides by (L-I)^-1
L_I = L - np.identity(5)
L_I_inv = np.linalg.inv(L_I)
zero = np.stack([0,0,0,0,0])
x = np.matmul(L_I_inv, zero)
x
'''

L = L = 12 * np.array([[ -1, 1/2, 1/4, 1, 1/3],
                       [1/3, -1, 1/4, 0, 0],
                       [1/3, 1/2, -1, 0, 1/3],
                       [1/3, 0, 1/4, -1, 1/3],
                       [ 0, 0, 1/4, 0, -1]])

rref_L = rref(L)
rref_L_I = rref_L - np.identity(5)
rref_L_I

```

```

Out[54]: array([[ 0.      ,  0.      ,  0.      ,  0.      , -6.33333333],
                [ 0.      ,  0.      ,  0.      ,  0.      , -3.11111111],
                [ 0.      ,  0.      ,  0.      ,  0.      , -4.      ],
                [ 0.      ,  0.      ,  0.      ,  0.      , -3.44444444],
                [ 0.      ,  0.      ,  0.      ,  0.      , -1.      ]])

```

Exercise 3

Question 6

```

In [55]: # works with transpose x
x_t = np.array([0.75, 0.1, 0.1, 0.05]).T

#
#           daily change matrix
#           S,    I,    R,    D
P = np.array([[0.95, 0.04, 0, 0],
              [0.05, 0.85, 0, 0],
              [0, 0.10, 1, 0],
              [0, 0.01, 0, 1]])

# apply daily change to population
x_t1 = np.matmul(P, x_t)
print("Day after xt: ", x_t1)

```

Day after xt: [0.7165 0.1225 0.11 0.051]

Question 7

```
In [56]: # array containing arrays of x_n
# init with x0 and x1
x = [[1,0,0,0],[1,0,0,0]]

# days 2-200
for i in range(2, 201):
    # applies day change with previous day to get current day
    x_i = np.matmul(P, x[i-1])
    x.append(x_i)

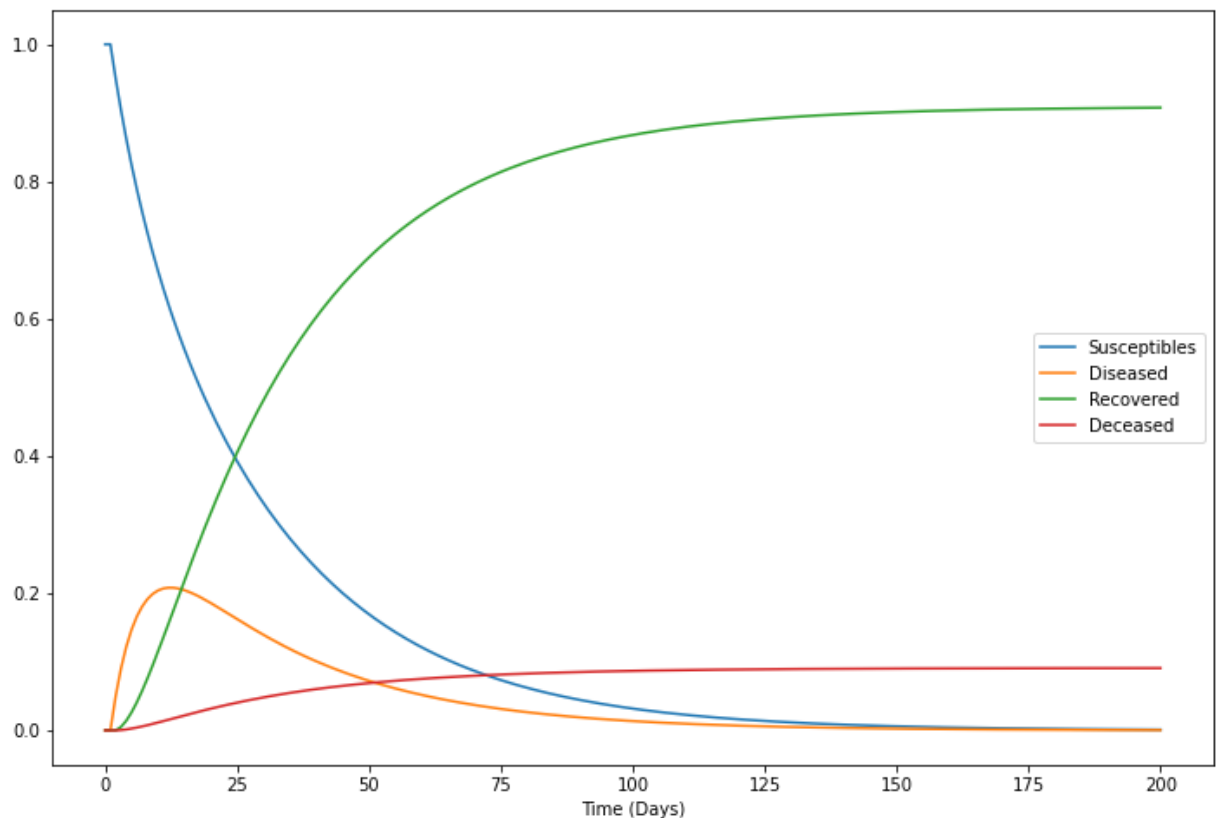
x = np.array(x)
print("Day 2: ", x[2], "\nDay 200: ", x[200])
```

```
Day 2: [0.95 0.05 0. 0. ]
Day 200: [1.11700273e-03 4.77017115e-04 9.07641800e-01 9.07641800e-02]
```

```
In [57]: f = plt.figure(figsize = (12, 8))

''' transpose so each row contains all values of each category
instead of data of 1 day '''
for line in x.T:
    plt.plot(line)

plt.legend(["Susceptibles", "Diseased", "Recovered", "Deceased"])
plt.xlabel("Time (Days)")
plt.show()
```



In []: