```
In [ ]: import numpy as np
import scipy as sp
import matplotlib.pyplot as plt
```

## Problem 24.3

Let A be a  $10 \times 10$  random matrix with entries from the standard normal distrubtion, minus twice the identity. Write a program to plot  $\parallel e^{At} \parallel_2$  against t for  $0 \le t \le 20$  on a log scale, comparing the result to the straight line  $e^{t\alpha(A)}$ , where  $\alpha(A) = \max_j \operatorname{Re}(\lambda_j)$  is the  $spectral\ abscissa$  of A. Run the program for ten random matrices A and comment on the results. What property of a matrix leads to a  $\parallel e^{At} \parallel_2$  curve that remains oscillatory as  $t \to \infty$ ?

```
In [\ ]: A = np.random.normal(loc=0, scale=1, size=(10, 10)) - 2 * np.eye(10)
In [ ]: def norm2_mat_exp(A, t=np.linspace(0, 20, 80)):
            """Compute the matrix exponential of a matrix A over a discretized interval t
            return np.array([np.linalg.norm(sp.linalg.expm(A*i), ord=2) for i in t])
In [ ]: def ref_line_func(eig_val, t=np.linspace(0, 20, 80)):
            """Compute the points that will make the reference line using e^{t\alpha(A)}.
            return np.array([np.exp(eig_val*i) for i in t])
In [ ]: def max_eig(A):
            """Compute the max eigenvalue of A
            return np.max(np.linalg.eig(A)[0].real)
In [ ]: # Define ten standard normal random 10 x 10 matrices
        ten_rand_mats = [np.random.normal(loc=0, scale=1, size=(10, 10)) - 2 * np.eye(10) f
In [\ ]: # Compute the 2-norm of the matrix exponential for each random matrix for 0 <= t <=
        two_norm_mat_exp = [norm2_mat_exp(mat) for mat in ten_rand_mats]
In [ ]: # Compute the Spectral Abscissa for each random matrix
        spec abscis = [max eig(mat) for mat in ten rand mats]
In []: # Compute the straight line e^{t} for each random matrix
        ref_line = [ref_line_func(eig_val) for eig_val in spec_abscis]
```

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In [ ]: t = np.linspace(0, 20, 80)
             fig, axes = plt.subplots(5, 2, figsize=(10, 10))
             for i in range(5):
                   for j in range(2):
                          axes[i, j].plot(t, two_norm_mat_exp[i + j])
                          axes[i, j].plot(t, ref_line[i + j])
                          axes[i, j].set_yscale('log')
             for ax in axes.flat:
                   ax.set(xlabel='t', ylabel='||e^tA||_2')
             # for ax in axes.flat:
                      ax.label_outer()
             plt.show()
                 1011
                                                                                  1011
                                                                               ||e^tA||_2
                  10<sup>7</sup>
                 10^{3}
                                     5
                                                                          20
                                                                                                                               15
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                 1011
                                                                                   10<sup>5</sup>
                                                                                ||e^tA||_2
                  10<sup>7</sup>
                 10^{3}
                                                                                   10<sup>1</sup>
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                  10<sup>5</sup>
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              ||e^tA||_2
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                  10<sup>1</sup>
                                                                                   10<sup>8</sup>
                                                                                2 10°
10°
10°
10°
              ||e^tA||_2
                  10<sup>0</sup>
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                                                                                                       5
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                                                                          20
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                                                                                                                                            20
```

Considering the plots above, we see that the max real part of the eigenvalues of A controls the rate of growth of  $e^{tA}$  as  $t\to\infty$ . Oscillations in  $e^{tA}$ , on the other hand, are controlled by the complex part of the eigenvalues of A. This is because  $e^{at+ibt}=e^{at}+e^{ibt}=e^{at}+\cos bt+i\sin bt$ , by Euler's formula.

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