

```
In [144]: import numpy as np
          import pandas as pd
          import matplotlib.pyplot as plt
          import random
In [145]: from google.colab import drive
          drive.mount('/content/drive')
          Drive already mounted at /content/drive; to attempt to forcibly remount, call drive.mount("/content/drive", force_remount=Tru
          e).
In [146]: errors = pd.read_csv("/content/drive/My Drive/cm121/errors.tsv", sep='\t', header=None)
Out[146]:
                    0
            0.002000
            1 0.003996
            2 0.005988
            3 0.007976
            4 0.009960
           95 0.174852
           96 0.176502
           97 0.178149
           98 0.179793
           99 0.181433
          100 rows × 1 columns
In [147]: transitions = pd.read_csv("/content/drive/My Drive/cm121/transitions.tsv", sep='\t', header=None)
          # A C G T
          transitions
Out[147]:
               0 1 2 3
           0 0.0 0.2 0.2 0.6
           1 0.3 0.0 0.6 0.1
           2 0.2 0.7 0.0 0.1
           3 0.5 0.3 0.2 0.0
```

```
In [148]: ## part c
          aa_hist = []
          cc_hist = []
           ac_hist = []
           for i in range(1000):
            data = pd.DataFrame({"obs":[], "p_error":[]})
            n_error = 0
             # true genotype is AA
            N = 20
             for _ in range(N):
                obs = 'A'
                 rand_err = random.randint(0, 99)
                 e = errors.iloc[rand_err][0]
                 if random.random() < e:</pre>
                     n_error += 1
                     p_transition = random.randint(1,100)
                     if p_transition \leftarrow= 20:
                         obs = 'C'
                     elif p_transition <= 40:</pre>
                        obs = 'G'
                     else:
                         obs = 'T'
                data.loc[len(data.index)] = [obs, e]
             data['p_truth'] = 1 - data['p_error']
             AA = []
             for i in range(N):
               if data["obs"][i] == "A":
                AA.append(data["p_truth"][i])
                 AA.append(data["p_error"][i])
            CC = []
             for i in range(N):
               if data["obs"][i] == "C":
                CC.append(data["p_truth"][i])
               else:
                 CC.append(data["p_error"][i])
             AC = []
             for i in range(N):
              if data["obs"][i] == "A":
    AC.append(0.5 * data["p_truth"][i] + 0.5 * data["p_error"][i])
               elif data["obs"][i] == "C":
                AC.append(0.5 * data["p_truth"][i] + 0.5 * data["p_error"][i])
               else:
                 AC.append(data["p_error"][i])
             p_data_given_AA = np.prod(AA)
            p_data_given_CC = np.prod(CC)
             p_data_given_AC = np.prod(AC)
            p_AA = 0.95**2
            p_{CC} = 0.05**2
            p_AC = 1 - p_AA - p_CC
             p_data_and_AA = p_data_given_AA * p_AA
             p_data_and_CC = p_data_given_CC * p_CC
             p_data_and_AC = p_data_given_AC * p_AC
             p_data = p_data_and_AA + p_data_and_CC + p_data_and_AC
             aa_hist.append(p_data_and_AA / p_data)
             cc_hist.append(p_data_and_CC / p_data)
             ac_hist.append(p_data_and_AC / p_data)
```

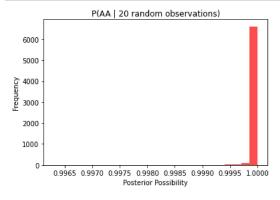
```
In [149]: plt.hist(aa_hist, 25, density = 1, color ='red', alpha = 0.7)
    plt.xlabel('Posterior Possibility')
    plt.title('P(AA | 20 random observations)')
    plt.show()

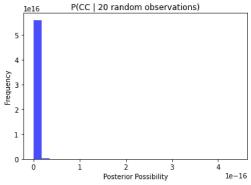
    plt.hist(cc_hist, 25, density = 1, color ='blue', alpha = 0.7)
    plt.xlabel('Posterior Possibility')
    plt.ylabel('Frequency')

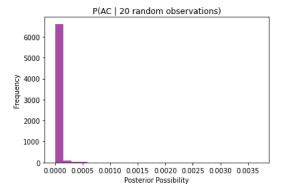
    plt.title('P(CC | 20 random observations)')
    plt.show()

    plt.hist(ac_hist, 25, density = 1, color ='purple', alpha = 0.7)
    plt.xlabel('Posterior Possibility')
    plt.ylabel('Frequency')

    plt.title('P(AC | 20 random observations)')
    plt.title('P(AC | 20 random observations)')
    print("P(AA | data):", np.mean(aa_hist))
    print("P(CC | data):", np.mean(ac_hist))
    print("P(CC | data):", np.mean(ac_hist))
    print("P(AC | data):", np.mean(ac_hist))
```







P(AA | data): 0.9999803716098639 P(CC | data): 1.4807538228830768e-18 P(AC | data): 1.9628390136120132e-05

```
In [150]: ## part d
          aa_hist = []
          cc_hist = []
          ac_hist = []
          for i in range(1000):
            new_data = pd.DataFrame({"obs":[], "p_error":[]})
            n_{error} = 0
            # true genotype is AA
            N = 20
            for _ in range(N):
                obs = 'A'
                rand_err = random.randint(0, 99)
                e = errors.iloc[rand_err][0]
                if random.random() < e: # if error</pre>
                   obs = 'C'
                new_data.loc[len(new_data.index)] = [obs, e]
            new_data['p_truth'] = 1 - data['p_error']
            AA = []
for i in range(N):
              if new_data["obs"][i] == "A":
                AA.append(new_data["p_truth"][i])
                AA.append(new_data["p_error"][i])
            CC = []
            for i in range(N):
              if new_data["obs"][i] == "C":
                CC.append(new_data["p_truth"][i])
                CC.append(new_data["p_error"][i])
            AC = []
            for i in range(N):
              if new_data["obs"][i] == "A":
                AC.append(0.5 * new_data["p_truth"][i] + 0.5 * new_data["p_error"][i])
              else:
                AC.append(0.5 * new_data["p_truth"][i] + 0.5 * new_data["p_error"][i])
            p_data_given_AA = np.prod(AA)
            p_data_given_CC = np.prod(CC)
            p_data_given_AC = np.prod(AC)
            p_AA = 0.95**2
            p_{CC} = 0.05**2
            p_AC = 1 - p_AA - p_CC
            p_data_and_AA = p_data_given_AA * p_AA
            p_data_and_CC = p_data_given_CC * p_CC
            p_data_and_AC = p_data_given_AC * p_AC
            p_data = p_data_and_AA + p_data_and_CC + p_data_and_AC
            aa_hist.append(p_data_and_AA / p_data)
            cc_hist.append(p_data_and_CC / p_data)
            ac_hist.append(p_data_and_AC / p_data)
```

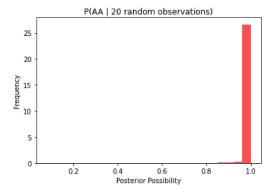
```
In [151]: plt.hist(aa_hist, 25, density = 1, color ='red', alpha = 0.7)
    plt.xlabel('Posterior Possibility')
    plt.title('P(AA | 20 random observations)')
    plt.show()

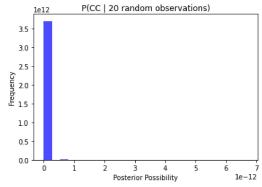
    plt.hist(cc_hist, 25, density = 1, color ='blue', alpha = 0.7)
    plt.xlabel('Posterior Possibility')
    plt.ylabel('Frequency')

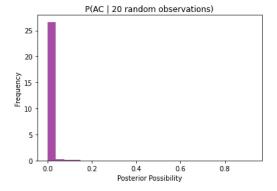
    plt.title('P(CC | 20 random observations)')
    plt.show()

    plt.hist(ac_hist, 25, density = 1, color ='purple', alpha = 0.7)
    plt.xlabel('Posterior Possibility')
    plt.ylabel('Frequency')

    plt.title('P(AC | 20 random observations)')
    plt.title('P(AC | 20 random observations)')
    print("P(AA | data):", np.mean(aa_hist))
    print("P(AC | data):", np.mean(ac_hist))
    print("P(AC | data):", np.mean(ac_hist))
```







```
P(AA | data): 0.9953283788191177
P(CC | data): 1.7010642411528735e-14
P(AC | data): 0.004671621180865315
```

In [151]: