#### Project #1 Report

EE 511: Spring 2020

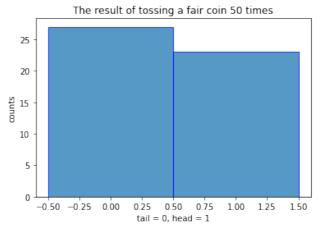
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Submission Date: Jan.21

### 1. Simulate tossing a fair coin (a Bernoulli trial) 50 times. Count the number of heads. Record the longest run of heads.

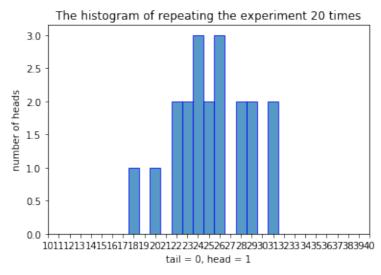
Number of heads is 23.

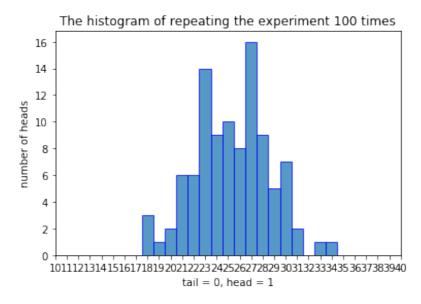
The longest run of heads is 6.

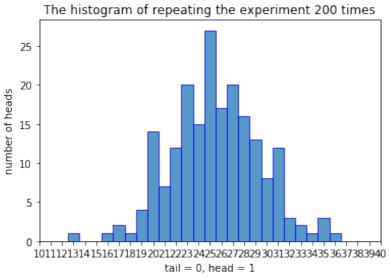


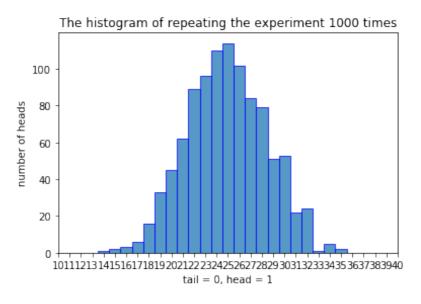
# a. Repeat the above experiment 20, 100, 200, and 1000 times. Generate a histogram for each showing the number of heads in 50 flips. Comment on the limit of the histogram.

The four plots are shown below. As the repetition increases, the limit of the distribution centers at 25. For Bernoulli random variables, the distribution has a mean  $\mu=np$  and a variance  $\sigma^2=npq$ , where n is the number of trails, p is the positive probability, q is the negative probability. Hence,  $\mu=50*0.5=25$ .







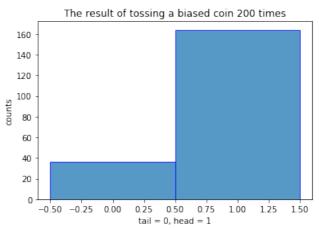


```
1. import numpy as np
2. import matplotlib.pyplot as plt
3.
4.
5. N flips = 50
6. N_heads = 0
7. history = np.empty([N_flips, 1])
8. longest_heads = 0
9.
10. # generate coin-flip sequence
11. for i in range(0, N_flips):
12.
        if np.random.random() >= 0.5:
                                             # fair coin
13.
            N_heads += 1
14.
            history[i] = 1
15.
16.
            history[i] = 0
17.
18.
19. # check the longest run of heads
20. temp = 0
21. for i in range(0, N_flips-1):
22.
        if history[i+1] == 1:
23.
            temp += 1
            if temp > longest_heads:
24.
25.
                longest heads = temp
26.
        else:
            temp = 0
27.
28.
29. # print results
30. print("Number of heads is {}".format(N_heads))
31. print("The longest run of heads is {}".format(longest_heads))
32.
33. # plot
34. plt.figure(1)
35. bins = np.arange(3) - 0.5
36. plt.hist(history, bins, edgecolor="b", alpha=0.75)
37. plt.title("The result of tossing a fair coin 50 times")
38. plt.xlabel("tail = 0, head = 1")
39. plt.ylabel("counts")
40. plt.show()
41.
42.
43. # repeat the experiment for 20 times
```

```
44. N_repeat = 20
                  # 20, 100, 200, 1000; switch the number to generate differe
   nt results
45. N_heads_hist = np.empty(N_repeat)
46.
47. for i in range(0, N_repeat):
48.
       N_heads = 0
49.
        for j in range(0, N_flips):
50.
            if np.random.random() >= 0.5:
                                                     # fair coin
51.
                N heads += 1
52.
                history[j] = 1
53.
            else:
54.
                history[j] = 0
55.
       N_heads_hist[i] = N_heads
56.
57. # plot
58. plt.figure(2)
59. bins = np.arange(N_flips+1) - 0.5
60. plt.hist(N_heads_hist, bins, edgecolor='b', alpha=0.75)
61. plt.xticks(range(51))
62. plt.xlim(10, 40)
63. plt.title("The histogram of repeating the experiment {} times".format(N_repe
   at))
64. plt.xlabel("tail = 0, head = 1")
65. plt.ylabel("number of heads")
66. plt.show()
```

2. Simulate tossing a biased coin 200 times where P(HEAD)=0.80. Count the number of heads. Record the longest run of heads. Generate a histogram for the Bernoulli outcomes.

Number of heads is 164. The longest run of heads is 16.



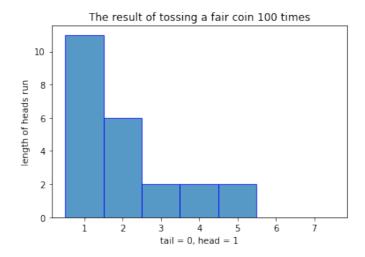
In this experiment, the mean  $\mu = np = 200 * 0.8 = 160$ .

```
    import numpy as np

2. import matplotlib.pyplot as plt
4.
5. N flips = 200
6. N_heads = 0
7. history = np.empty([N_flips, 1])
8. longest_heads = 0
9.
10. # generate coin-flip sequence
11. for i in range(0, N_flips):
        if np.random.random() >= 0.2:
12.
                                             # biased coin
13.
            N_heads += 1
            history[i] = 1
14.
15.
        else:
            history[i] = 0
17.
18. # check the longest run of heads
19. temp = 0
20. for i in range(0, N_flips-1):
21.
        if history[i+1] == 1:
22.
            temp += 1
23.
            if temp > longest_heads:
24.
                longest_heads = temp
25.
        else:
26.
            temp = 0
27.
28. # print results
29. print("Number of heads is {}".format(N_heads))
30. print("The longest run of heads is {}".format(longest_heads))
31.
32. # plot
33. plt.figure(1)
34. bins = np.arange(3) - 0.5
35. plt.hist(history, bins, edgecolor="b", alpha=0.75)
36. plt.title("The result of tossing a biased coin 200 times")
37. plt.xlabel("tail = 0, head = 1")
38. plt.ylabel("counts")
39. plt.show()
```

## 3. Simulate tossing a fair coin 100 times. Generate a histogram showing the heads run lengths.

The plot is shown as below.



```
1. import numpy as np
import matplotlib.pyplot as plt
3.
4.
5. N_flips = 100
6. N_heads = 0
7. history = np.empty([N_flips, 1])
8. longest_heads = 0
9. length_of_heads_run = []
10.
11. # generate coin-flip sequence
12. for i in range(0, N_flips):
        if np.random.random() >= 0.5:
                                             # fair coin
            N_heads += 1
14.
15.
            history[i] = 1
16.
        else:
17.
            history[i] = 0
18.
19. # record the length of heads run
20. temp = 0
21. for i in range(0, N_flips-1):
22.
        if history[i+1] == 1:
23.
            temp += 1
24.
25.
            length_of_heads_run.append(temp)
26.
            temp = 0
27.
28.
29. # plot
30. plt.figure(1)
31. bins = np.arange(8) + 0.5
32. plt.hist(length_of_heads_run, bins, edgecolor="b", alpha=0.75)
```

```
33. plt.title("The result of tossing a fair coin 100 times")
34. plt.xlabel("tail = 0, head = 1")
35. plt.ylabel("length of heads run")
36. plt.show()
```

# 4. Simulate tossing a fair coin and count the number of tosses until reaching a user-specified positive number of heads.

The left column is the number of heads (self-specified), and the right column is the number of flips needed to reach the number of heads.

Number of heads	Number of flips needed
100	211
200	382
500	989
1000	1990
10000	19850

```
    import numpy as np

2.
3.
4. N_heads_to_reach = 100
5. N_flips = 0
6. N_heads = 0
7.
8. # generate coin-flip sequence
9. while N_heads < N_heads_to_reach:</pre>
        if np.random.random() >= 0.5:
                                             # fair coin
10.
11.
            N_heads += 1
12.
            N_flips += 1
13.
        else:
14.
            N_flips += 1
15.
16. # print the tossing number needed
17. print(N_flips)
```