

## Question 1

1. A coin is tossed infinitely many times. For every  $n = 2, 3, 4, \dots$ , let  $A_n$  be the event “a block of heads of length  $n$  starting from toss  $n$ ” (that is heads at tosses  $n, \dots, 2n - 1$ , tails at tosses  $n - 1$  and  $2n$ ).

- a. Find the probability of  $A_n$

*Solution.*

Let  $H_i$  (resp.  $T_i$ ) denote “head (resp. tail) at toss  $i$ .” Then

$$A_n = T_{n-1} \cap \left( \bigcap_{i=n}^{2n-1} H_i \right) \cap T_{2n}.$$

By independence of coin tosses,

$$\mathbb{P}(A_n) = \mathbb{P}(T_{n-1}) \cdot \prod_{i=n}^{2n-1} \mathbb{P}(H_i) \cdot \mathbb{P}(T_{2n}) = \left(\frac{1}{2}\right) \cdot \left(\frac{1}{2}\right)^n \cdot \left(\frac{1}{2}\right) = 2^{-(n+2)}.$$

□

- b. Is  $A_n$  an increasing sequence?

*Solution.*

**No.** For an increasing sequence we would need  $A_n \subseteq A_{n+1}$  for all  $n$ . But  $A_n$  requires  $T_{2n}$  while  $A_{n+1}$  requires  $H_{2n}$ , so  $A_n \cap A_{n+1} = \emptyset$ . Hence  $A_n \not\subseteq A_{n+1}$ .

□

- c. Is  $A_n$  a decreasing sequence?

*Solution.*

**No.** A decreasing sequence would satisfy  $A_{n+1} \subseteq A_n$  for all  $n$ , which again fails since  $A_n \cap A_{n+1} = \emptyset$  and both events are nonempty.

□

- d. Is  $A_n$  a convergent sequence?

*Solution.*

Recall that  $\liminf_n A_n = \bigcup_m \bigcap_{n \geq m} A_n$  (“ $A_n$  ultimately”) and  $\limsup_n A_n = \bigcap_m \bigcup_{n \geq m} A_n$  (“ $A_n$  infinitely often”). Because  $A_n \cap A_{n+1} = \emptyset$ , it is impossible that  $A_n$  occurs for all sufficiently large  $n$ , so  $\liminf_n A_n = \emptyset$ .

On the other hand, one can construct sequences where  $A_n$  occurs for infinitely many  $n$  (e.g. arrange disjoint blocks  $TH^nT$  spaced far apart), so  $\limsup_n A_n \neq \emptyset$ .

Thus  $\liminf_n A_n \neq \limsup_n A_n$  and  $(A_n)$  does not converge.

□

- e. What is the probability that  $A_n$  occurs infinitely often?

*Solution.*

We have

$$\sum_{n=2}^{\infty} \mathbb{P}(A_n) = \sum_{n=2}^{\infty} 2^{-(n+2)} = \frac{1}{8} < \infty.$$

By the First Borel–Cantelli lemma,  $\mathbb{P}(A_n \text{ i.o.}) = 0$ .

□

- f. What is the probability that  $A_n$  occurs ultimately?

*Solution.*

Since  $\mathbb{P}(A_n) = 2^{-(n+2)} \rightarrow 0$  and  $\mathbb{P}(\liminf_n A_n) \leq \liminf_{n \rightarrow \infty} \mathbb{P}(A_n)$ , we get

$$\mathbb{P}(A_n \text{ ultimately}) = \mathbb{P}(\liminf_n A_n) = 0.$$

(Equivalently,  $\liminf_n A_n \subseteq \limsup_n A_n$  and part (e) already gave  $\mathbb{P}(\limsup_n A_n) = 0$ .)

□

## Question 2

2. Simulate in Matlab or in Python 1000 tossing of a fair coin.

1. Count the number of heads and the number of tails.

*Solution.*

```
1 import numpy as np
2
3 rng = np.random.default_rng(40313) # fixed seed for reproducibility
4 n = 1000
5
6 # True = Head, False = Tail
7 tosses = rng.random(n) < 0.5
8
9 heads = int(tosses.sum())
10 tails = n - heads
11
12 print(f"Heads: {heads}, Tails: {tails}")
```

Heads: 477, Tails: 523

□

2. Find the frequency of heads as a function of  $n$  ( $n = 1, \dots, 1000$ ) and represent the function.

*Solution.*

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3
4 rng = np.random.default_rng(2024)
5 n = 1000
6
7 # 1 = Head, 0 = Tail
8 tosses = (rng.random(n) < 0.5).astype(int)
9
10 cum_heads = np.cumsum(tosses)
11 n_vals = np.arange(1, n + 1)
12 freq = cum_heads / n_vals
13
14 plt.figure()
15 plt.plot(n_vals, freq, label="Observed head frequency")
16 plt.axhline(0.5, linestyle="--", linewidth=1, label="Theoretical p=0.5")
17 plt.xlabel("n (number of tosses)")
18 plt.ylabel("Frequency of heads up to n")
19 plt.title("Cumulative frequency of heads (fair coin)")
20 plt.legend()
21 plt.show()
```

□

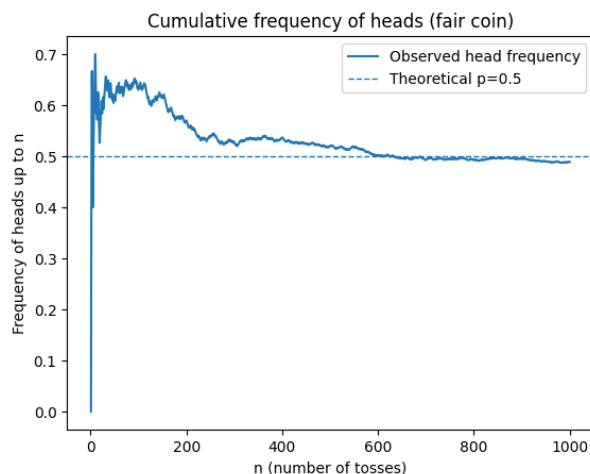


Figure 0-1: Cumulative Frequency of Heads (Fair Coin)

3. Count the number of blocks of heads of length 2 (that is sequences (THHT)).

*Solution.*

```
1 import numpy as np
2
3 def count_THHT(tosses):
4     """
5     Count occurrences of the pattern Tail-Head-Head-Tail (THHT).
6     Accepts either:
7     - a string like "THHTHT...", or
8     - an iterable of "H"/"T" characters.
9     """
10    s = tosses if isinstance(tosses, str) else "".join(tosses)
11    return sum(1 for i in range(len(s) - 3) if s[i:i+4] == "THHT")
12
13 rng = np.random.default_rng(40313) # fixed seed for reproducibility
14 n = 1000
15
16 tosses = np.where(rng.random(n) < 0.5, "H", "T") # array of "H"/"T"
17
18 print("THHT count:", count_THHT(tosses))
```

THHT count: 60

□

4. Repeat the above calculations for a coin with probability of heads=3/4.

*Solution.*

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3
4 # --- Setup ---
5 rng = np.random.default_rng(2024)
6 n = 1000
7 p = 0.75 # probability of Heads
8
9 # Simulate: 1 = Head, 0 = Tail
10 tosses = (rng.random(n) < p).astype(int)
11
12 # (a) Counts
13 heads = int(tosses.sum())
14 tails = n - heads
```

```

15 print(f"Heads: {heads}, Tails: {tails}")
16
17 # (b) Frequency of heads vs n
18 cum_heads = np.cumsum(tosses)
19 n_vals = np.arange(1, n + 1)
20 freq = cum_heads / n_vals
21
22 plt.figure()
23 plt.plot(n_vals, freq, label="Observed head frequency")
24 plt.axhline(p, linestyle="--", linewidth=1, label=f"Theoretical p={p}")
25 plt.xlabel("n (number of tosses)")
26 plt.ylabel("Frequency of heads up to n")
27 plt.title("Cumulative frequency of heads (biased coin, p=0.75)")
28 plt.legend()
29 plt.show()
30
31 # (c) Count occurrences of the pattern THHT
32 def count_THHT(tosses_ht_or_str):
33     """
34     Count occurrences of Tail-Head-Head-Tail (THHT).
35     Accepts a string of 'H'/'T' or an iterable of 'H'/'T'.
36     """
37     s = tosses_ht_or_str if isinstance(tosses_ht_or_str, str) else "".join(
38         tosses_ht_or_str)
39     return sum(1 for i in range(len(s) - 3) if s[i:i+4] == "THHT")
40
41 # Convert to 'H'/'T' and count
42 ht = np.where(tosses == 1, "H", "T")
43 thht_count = count_THHT(ht)
44 print(f"Occurrences of 'THHT': {thht_count}")

```

Heads: 740, Tails: 260

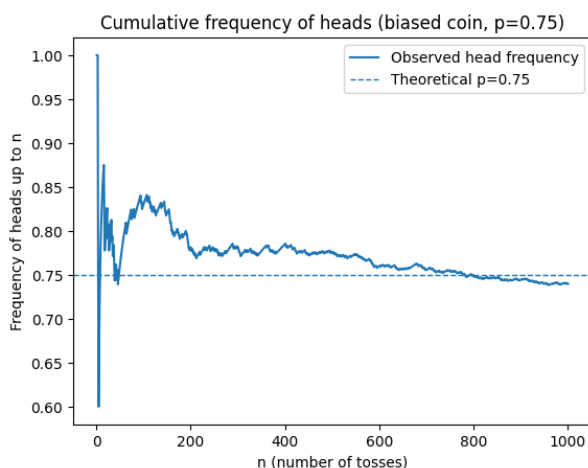


Figure 0-2: Cumulative Frequency of Heads (Biased Coin)

Occurrences of 'THHT': 46

