```
In [4]:
           num_friends = [100, 49, 41, 40, 25, 21, 21, 19, 19, 18, 18, 16, 15, 15, 15, 15, 14, 14,
 In [5]:
           from collections import Counter
           import matplotlib.pyplot as plt
 In [6]:
           friend counts = Counter(num friends)
           xs = range(101)
                                                    # The largest value is 100
           ys = [friend_counts[x] for x in xs]
                                                   # The height is just the number of friends
           plt.bar(xs, ys)
           plt.axis([0, 101, 0, 25])
           plt.title("Histogram of Friend Counts")
           plt.xlabel("Number of Friends")
           plt.ylabel("Number of People")
           # plt.show()
 Out[6]: Text(0, 0.5, 'Number of People')
                           Histogram of Friend Counts
            25
            20
         Number of People
            15
            10
             5
                                           60
                                                     80
                                                              100
                                 Number of Friends
 In [7]:
           num points = len(num friends)
                                                         # 204
 In [8]:
           assert num_points == 204
 In [9]:
           largest value = max(num friends)
                                                         # 100
           smallest value = min(num friends)
                                                         # 1
In [10]:
           assert largest_value == 100
           assert smallest_value == 1
In [11]:
           sorted values = sorted(num friends)
           smallest_value = sorted_values[0]
                                                         # 1
           second smallest value = sorted values[1]
                                                         # 1
           second_largest_value = sorted_values[-2]
                                                         # 49
```

```
In [12]:
          assert smallest value == 1
In [13]:
          assert second smallest value == 1
In [14]:
          assert second largest value == 49
In [15]:
          from typing import List
In [16]:
          def mean(xs: List[float]) -> float:
              return sum(xs) / len(xs)
In [17]:
          mean(num_friends)
                              # 7.333333
Out[17]: 7.3333333333333333
In [18]:
          assert 7.3333 < mean(num_friends) < 7.3334</pre>
In [19]:
          # The Underscores Indicate That These Are Private Functions, as They're
          # Intended to Be Called by the Median Function but Not by Other People
          # Using the Statistics Library
          def _median_odd(xs: List[float]) -> float:
              """If len(xs) is odd, the median is the middle element"""
              return sorted(xs)[len(xs) // 2]
In [20]:
          def median even(xs: List[float]) -> float:
              """If len(xs) is even, it's the average of the middle two elements"""
              sorted_xs = sorted(xs)
              hi midpoint = len(xs) // 2 # e.g. length 4 => hi midpoint 2
              return (sorted xs[hi midpoint - 1] + sorted xs[hi midpoint]) / 2
In [22]:
          def median(v: List[float]) -> float:
              """Finds the middle-most value of v"""
              return median even(v) if len(v) \% 2 == 0 else median odd(v)
In [23]:
          assert median([1, 10, 2, 9, 5]) == 5
In [24]:
          assert median([1, 9, 2, 10]) == (2 + 9) / 2
In [25]:
          assert median(num friends) == 6
```

```
In [26]:
          def quantile(xs: List[float], p: float) -> float:
              """Returns the p-th percentile value in x"""
              p index = int(p * len(xs))
              return sorted(xs)[p index]
In [27]:
          assert quantile(num_friends, 0.10) == 1
In [28]:
          assert quantile(num friends, 0.25) == 3
In [29]:
          assert quantile(num_friends, 0.75) == 9
In [30]:
          assert quantile(num_friends, 0.90) == 13
In [31]:
          def mode(x: List[float]) -> List[float]:
              """Returns a list, since there might be more than one mode"""
              counts = Counter(x)
              max_count = max(counts.values())
              return [x i for x i, count in counts.items()
                      if count == max count]
In [32]:
          assert set(mode(num_friends)) == {1, 6}
In [33]:
          # "range" Already Means Something In Python, so We'll Use a Different Name
          def data_range(xs: List[float]) -> float:
              return max(xs) - min(xs)
In [34]:
          assert data range(num friends) == 99
In [43]:
          from scratch.linear algebra import sum of squares
In [44]:
          def de_mean(xs: List[float]) -> List[float]:
              """Translate xs by subtracting its mean (so the result has mean 0)"""
              x_bar = mean(xs)
              return [x - x_bar for x in xs]
In [45]:
          def variance(xs: List[float]) -> float:
              """Almost the average squared deviation from the mean"""
              assert len(xs) >= 2, "Variance requires at least two elements"
              n = len(xs)
              deviations = de mean(xs)
              return sum_of_squares(deviations) / (n - 1)
```

```
In [46]:
          assert 81.54 < variance(num_friends) < 81.55</pre>
In [47]:
          import math
In [48]:
          def standard deviation(xs: List[float]) -> float:
               """The standard deviation is the square root of the variance"""
              return math.sqrt(variance(xs))
In [49]:
          assert 9.02 < standard deviation(num friends) < 9.04</pre>
In [50]:
          def interquartile_range(xs: List[float]) -> float:
               """Returns the difference between the 75th percentile and the 25th percentile"""
              return quantile(xs, 0.75) - quantile(xs, 0.25)
In [51]:
          assert interquartile range(num friends) == 6
In [52]:
          daily_minutes = [1, 68.77, 51.25, 52.08, 38.36, 44.54, 57.13, 51.4, 41.42, 31.22, 34.76
In [53]:
          daily hours = [dm / 60 for dm in daily minutes]
In [54]:
          from scratch.linear_algebra import dot
In [55]:
          def covariance(xs: List[float], ys: List[float]) -> float:
              assert len(xs) == len(ys), "The xs and ys must have same number of elements"
              return dot(de_mean(xs), de_mean(ys)) / (len(xs) - 1)
In [56]:
          assert 22.42 < covariance(num friends, daily minutes) < 22.43</pre>
In [57]:
          assert 22.42 / 60 < covariance(num_friends, daily_hours) < 22.43 / 60</pre>
In [58]:
          def correlation(xs: List[float], ys: List[float]) -> float:
               """Measures how much the xs and ys vary in tandem about their means"""
              stdev x = standard deviation(xs)
              stdev y = standard deviation(ys)
              if stdev_x > 0 and stdev_y > 0:
                   return covariance(xs, ys) / stdev x / stdev y
              else:
                   return 0
                               # If there is no variation, then the correlation is zero
```

```
In [59]:
           assert 0.24 < correlation(num_friends, daily_minutes) < 0.25</pre>
In [60]:
           assert 0.24 < correlation(num_friends, daily_hours) < 0.25</pre>
In [61]:
           outlier = num_friends.index(100)
                                               # Index of the outlier
In [62]:
           num\_friends\_good = [x]
                                for i, x in enumerate(num_friends)
                                if i != outlier]
In [63]:
           daily_minutes_good = [x]
                                  for i, x in enumerate(daily_minutes)
                                  if i != outlier]
In [64]:
           daily_hours_good = [dm / 60 for dm in daily_minutes_good]
In [65]:
           assert 0.57 < correlation(num_friends_good, daily_minutes_good) < 0.58</pre>
In [66]:
           assert 0.57 < correlation(num_friends_good, daily_hours_good) < 0.58</pre>
```