Final Project Report

Class: DS 5100

• Student Name: Tyler Gorecki

• Student Net ID: ttg6nx

• This URL: https://github.com/tylergorecki/ds5100-finalproject-ttg6nx/blob/main/DS5100_FinalProject.ipynb

Instructions

Follow the instructions in the Final Project isntructions notebook and put evidence of your work in this notebook.

Total points for each subsection under **Deliverables** and **Scenarios** are given in parentheses.

Breakdowns of points within subsections are specified within subsection instructions as bulleted lists.

This project is worth **50 points**.

Deliverables

The Monte Carlo Module (10)

• URL included, appropriately named (1).

def init (self, face values):

- Includes all three specified classes (3).
- Includes at least all 12 specified methods (6; .5 each).

Put the URL to your GitHub repo here.

Repo URL: https://github.com/tylergorecki/ds5100-finalproject-ttg6nx

Paste a copy of your module here.

NOTE: Paste as text, not as code. Use triple backticks to wrap your code blocks.

```
import numpy as np
import pandas as pd

class Die:
    """
    A Die is an object with N sides ('faces') and W weights and can be
rolled to select a face. By default, each of the sides have a weight of 1,
but that can be changed using a method in this class to adjust individual
sides. Each side is unique and the Die object can be rolled one or more
times, resulting in a single face for each roll.
    """
```

11 11 11

Initializes a Die object and saves the faces and weights of the Die in a private data frame with faces as the index.

```
Parameters
        face values : must be a numpy array of all unique values
        Returns
        _____
        None
        Raises
        _____
        TypeError
            when face values input is not a numpy array
        ValueError
            when face values input does not have all unique values
        ** ** **
        if type(face values) != type(np.array(1)):
            raise TypeError("Face values argument is not a numpy array")
        if len(face values) != len(np.unique(face values)):
            raise ValueError("Face values argument does not have all unique
values")
        self. die = pd.DataFrame(data = {
            'face': face values,
            'weight': np.ones(len(face values))
        }).set index('face')
    def change weight(self, face, new val):
        This method changes the weight of a single side. It takes a face and
a numeric value as inputs, saving that face's new weight value in the Die's
private data frame.
        Parameters
        face : face value (side) of the Die to be changed
```

new val : new weight value for that face, must be numeric or

Returns

castable to numeric

```
None
        Raises
        _____
        IndexError
            when face argument is not a face value in the current Die object
        TypeError
            when new val input is not a numeric or a string castable to
numeric
        ** ** **
        if face not in self. die.index:
            raise IndexError("Face value not in die array")
        if type(new val) not in [int, float]:
            try:
                new val = float(new val)
            except:
                raise TypeError("The new value is not numeric or castable as
numeric")
        self. die.loc[face] = new val
    def roll(self, rolls = 1):
        11 11 11
        Rolls the Die one or more times. Randomly samples n (number of rolls
input) times and returns the face results of the rolls as a list.
        Parameters
        rolls : default is 1, indicates the number of rolls to sample from
the Die object
        Returns
        -----
        List of face outputs that result from the random sampling of the Die
object.
        11 11 11
        weights = self. die.weight/sum(self. die.weight)
        return list(np.random.choice(
            a = self. die.index,
            size = rolls,
```

```
p = weights
))

def current_die_state(self):
    """
    Shows the Die object's current state by returning a copy of the private die data frame.

Parameters
------
None

Returns
-----
The private data frame containing face values and weights for each face of the Die object.
    """
    return self._die.copy()
```

class Game:

11 11 11

A Game object consists of rolling one or more similar Die objects one or more times. The dice should be similar, meaning they have the same number of sides and associated faces, and Game objects only keep the results of their most recent play.

11 11 11

```
def __init__(self, dice):
```

Initializes a Game object, created from a list of similar dice. The dice should have the same faces.

```
Parameters
-----
dice: must be a list of already instantiated similar dice

Returns
-----
None
"""

self.dice = dice
```

```
def play(self, rolls):
    """
```

This method takes an integer parameter to specify the number of times the dice should be rolled. These values are then saved in a private data frame in wide format. The roll number is row index starting with 0 and each die index is the column name, with the values being faces rolled for each instance.

Parameters

 $% \left(1\right) =\left(1\right) +\left(1\right) +\left($

Returns

None

" " "

```
def show_recent_play(self, df_form = 'wide'):
```

Returns a copy of the private data frame created by the play function to the user. Takes a parameter that controls whether the data frame is returned in narrow or wide form.

Parameters

df_form : must be a string value in ['narrow', 'wide'], default is
'wide'

Returns

 $\ensuremath{\text{Narrow}}$ or wide formed data frame consisting of the data from the most recent play

function call by the Game object

Raises

ValueError

when $\operatorname{df_form}$ input is not one of 'narrow' or 'wide'

```
if df form not in ['narrow', 'wide']:
            raise ValueError("Form invalid, input must be 'narrow' or
'wide'")
        if df_form == 'wide':
            return self._play_dice.copy()
        else:
            return
self. play dice.stack().to frame('Outcome').rename axis(['Roll', 'Die'])
class Analyzer:
   11 11 11
   An Analyzer object takes the result of a Game object and computes
various descriptive statistical properties about it.
    def __init__(self, game):
        Initializes an Analyzer object from a Game object input.
        Parameters
        _____
        game : must be a Game object
        Returns
        _____
        None
        Raises
        _____
        ValueError
            when input parameter is not a Game object
        if type(game) != Game:
            raise ValueError("Input parameter is not a game object")
        self.game = game
    def jackpot(self):
        ** ** **
```

A jackpot is a result in which all faces are the same for a single roll of all dice in the game. This method computes how many times this occurs among all rolls in the game.

```
_____
        None
        Returns
        An integer for the number of jackpots.
        11 11 11
        df = self.game.show recent play()
        df uniques = [len(set(df.loc[i])) == 1 for i in range(len(df))]
        return sum(df uniques)
    def face counts per roll(self):
        11 11 11
        Computes the number of times each face is rolled in each event,
returning a data frame of the results.
        Parameters
        _____
        None
        Returns
        _____
        Data frame in wide format containing roll number as index, face
values as columns, and count values in the cells.
        df = self.game.show recent play()
        return df.apply(pd.Series.value counts, axis =
1).fillna(0).astype(int)
    def combo count(self):
        Computes the distinct combinations of faces rolled and their counts.
Here, the order does not matter. The method returns a data frame of the
results.
```

Parameters

Parameters

```
None
        Returns
        _____
        Data frame with a MultiIndex of distinct combinations and a column
for the associated counts values.
        df = self.game.show recent play()
        new df = pd.DataFrame([sorted(df.iloc[x]) for x in range(len(df))])
        cols = list(new df.columns)
        return new df.groupby(cols).size().reset index(name =
'Count').set index(cols)
    def permutation count(self):
        Computes the distinct permutations of faces rolled and their counts.
Here, the order does matter. The method returns a data frame of the results.
        Parameters
        _____
        None
        Returns
        Data frame with a MultiIndex of distinct permutations and a column
for the associated count values.
        df = self.game.show recent play()
        cols = list(df.columns)
        return df.groupby(cols).size().reset index(name =
'Count').set index(cols)
```

Unitest Module (2)

Paste a copy of your test module below.

NOTE: Paste as text, not as code. Use triple backticks to wrap your code blocks.

- All methods have at least one test method (1).
- Each method employs one of Unittest's Assert methods (1).

```
from montecarlo.montecarlo import Die, Game, Analyzer
import unittest
import numpy as np
import pandas as pd
class MontecarloTest(unittest.TestCase):
    def test die init(self):
        die1 = Die(np.array(['A','B','C']))
        self.assertTrue(all(die1.current die state().weight == 1))
    def test die change weight(self):
        die1 = Die(np.array(['A','B','C']))
        die1.change weight('B',2)
        actual = diel.current die state().loc['B'].weight
        expected = 2
        self.assertEqual(actual, expected)
    def test die roll(self):
        die1 = Die(np.array(['A','B','C']))
        self.assertTrue(type(die1.roll(10)) == list)
    def test die state(self):
        die1 = Die(np.array(['A','B','C']))
        actual = list(die1.current die state().index)
        expected = ['A','B','C']
        self.assertEqual(actual, expected)
    def test game init(self):
        die1 = Die(np.array(['A','B','C']))
        die2 = Die(np.array(['A','B','C']))
        die3 = Die(np.array(['A','B','C']))
        game = Game([die1, die2, die3])
        self.assertEqual(die1, game.dice[0])
    def test game play(self):
        die1 = Die(np.array(['A','B','C']))
        die2 = Die(np.array(['A','B','C']))
        die3 = Die(np.array(['A','B','C']))
```

```
game = Game([die1, die2, die3])
        game.play(5)
        recent game = game.show recent play()
        actual = recent_game.shape[0]
        expected = 5
        self.assertEqual(actual, expected)
    def test game show play(self):
        die1 = Die(np.array(['A','B','C']))
        die2 = Die(np.array(['A','B','C']))
        die3 = Die(np.array(['A','B','C']))
        game = Game([die1, die2, die3])
        game.play(5)
        recent game = game.show recent play('narrow')
        self.assertTrue(type(recent game.index) == pd.MultiIndex)
    def test analyzer init(self):
        die1 = Die(np.array(['A','B','C']))
        die2 = Die(np.array(['A','B','C']))
        die3 = Die(np.array(['A','B','C']))
        game = Game([die1, die2, die3])
        game.play(5)
        analyzer1 = Analyzer(game)
        self.assertTrue(type(analyzer1.face counts per roll()) ==
pd.DataFrame)
    def test analyzer jackpot(self):
        die1 = Die(np.array(['A','B','C']))
        die2 = Die(np.array(['A','B','C']))
        die3 = Die(np.array(['A','B','C']))
        game = Game([die1, die2, die3])
        game. play dice = pd.DataFrame({
            0: ['A','A','B'],
            1: ['A','B','B'],
            2: ['A','C','B']
        })
```

```
analyzer = Analyzer(game)
        actual = analyzer.jackpot()
        expected = 2
        self.assertEqual(actual, expected)
    def test_analyzer_face_counts_per_roll(self):
        die1 = Die(np.array(['A','B','C']))
        die2 = Die(np.array(['A','B','C']))
        die3 = Die(np.array(['A','B','C']))
        game = Game([die1, die2, die3])
        game. play dice = pd.DataFrame({
            0: ['A','A','A'],
            1: ['A','B','C'],
            2: ['B','B','B']
        })
        analyzer = Analyzer(game)
        actual = list(analyzer.face counts per roll().loc[2])
        expected = [1,1,1]
        self.assertEqual(actual, expected)
    def test analyzer combo count(self):
        die1 = Die(np.array(['A','B','C']))
        die2 = Die(np.array(['A','B','C']))
        die3 = Die(np.array(['A','B','C']))
        game = Game([die1, die2, die3])
        game. play dice = pd.DataFrame({
            0: ['B','A','B'],
            1: ['A','B','C'],
            2: ['B','B','B']
        })
        analyzer = Analyzer(game)
        actual = analyzer.combo count()
        expected = pd.DataFrame({
            'Count':[2,1]
        }, index=pd.MultiIndex.from tuples([('A','B','B'), ('B','B','C')],
names=[0,1,2])
        self.assertEqual(actual.shape, expected.shape)
```

```
def test analyzer permutation_count(self):
        die1 = Die(np.array(['A','B','C']))
        die2 = Die(np.array(['A','B','C']))
        die3 = Die(np.array(['A','B','C']))
        game = Game([die1, die2, die3])
        game. play dice = pd.DataFrame({
            0: ['C','A','A'],
            1: ['C', 'B', 'B'],
            2: ['B','B','B']
        })
        analyzer = Analyzer(game)
        actual = list(analyzer.permutation count()['Count'])
        expected = [2,1]
        self.assertEqual(actual, expected)
if name _ == '__main__':
    unittest.main(verbosity=3)
```

Unittest Results (3)

Put a copy of the results of running your tests from the command line here.

Again, paste as text using triple backticks.

• All 12 specified methods return OK (3; .25 each).

```
test_analyzer_combo_count (__main__.MontecarloTest) ... ok
test_analyzer_face_counts_per_roll (__main__.MontecarloTest) ... ok
test_analyzer_init (__main__.MontecarloTest) ... ok
test_analyzer_jackpot (__main__.MontecarloTest) ... ok
test_analyzer_permutation_count (__main__.MontecarloTest) ... ok
test_die_change_weight (__main__.MontecarloTest) ... ok
test_die_init (__main__.MontecarloTest) ... ok
test_die_roll (__main__.MontecarloTest) ... ok
test_die_state (__main__.MontecarloTest) ... ok
test_game_init (__main__.MontecarloTest) ... ok
test_game_play (__main__.MontecarloTest) ... ok
test_game_show_play (__main__.MontecarloTest) ... ok

Test_game_show_play (__main__.MontecarloTest) ... ok

Test_game_show_play (__main__.MontecarloTest) ... ok
```

Import (1)

Import your module here. This import should refer to the code in your package directory.

• Module successufly imported (1).

In [1]:

from montecarlo.montecarlo import Die, Game, Analyzer Montecarlo package imported successfully!

Help Docs (4)

Show your docstring documentation by applying help () to your imported module.

- All methods have a docstring (3; .25 each).
- All classes have a docstring (1; .33 each).

```
In [2]:
help(Die)
Help on class Die in module montecarlo.montecarlo:
class Die(builtins.object)
| Die(face values)
| A Die is an object with N sides ('faces') and W weights and can be rolled
to select
 | a face. By default, each of the sides have a weight of 1, but that can be
changed using
| a method in this class to adjust individual sides. Each side is unique
and the Die object
| can be rolled one or more times, resulting in a single face for each
roll.
  Methods defined here:
    init (self, face values)
       Initializes a Die object and saves the faces and weights of the Die
in a private data
       frame with faces as the index.
       Parameters
       face values : must be a numpy array of all unique values
```

```
Returns
       -----
       None
      Raises
       ----
      TypeError
           when face_values input is not a numpy array
       ValueError
           when face values input does not have all unique values
 | change weight(self, face, new val)
       This method changes the weight of a single side. It takes a face and
a numeric value
       as inputs, saving that face's new weight value in the Die's private
data frame.
       Parameters
       -----
       face : face value (side) of the Die to be changed
       new val : new weight value for that face, must be numeric or castable
to numeric
      Returns
       -----
      None
      Raises
       _____
       IndexError
           when face argument is not a face value in the current Die object
       TypeError
           when new val input is not a numeric or a string castable to
numeric
| current die state(self)
       Shows the Die object's current state by returning a copy of the
private die data frame.
       Parameters
       -----
       None
      Returns
```

```
The private data frame containing face values and weights for each
face of the Die object.
roll(self, rolls=1)
       Rolls the Die one or more times. Randomly samples n (number of rolls
input) times
       and returns the face results of the rolls as a list.
      Parameters
       -----
       rolls : default is 1, indicates the number of rolls to sample from
the Die object
Returns
      List of face outputs that result from the random sampling of the Die
object.
   ______
| Data descriptors defined here:
| __dict
       dictionary for instance variables (if defined)
   __weakref_
      list of weak references to the object (if defined)
                                                                    In [3]:
help(Game)
Help on class Game in module montecarlo.montecarlo:
class Game(builtins.object)
| Game(dice)
| A Game object consists of rolling one or more similar Die objects one or
| The dice should be similar, meaning they have the same number of sides
and associated
| faces, and Game objects only keep the results of their most recent play.
| Methods defined here:
   __init__(self, dice)
       Initializes a Game object, created from a list of similar dice. The
dice should
```

```
have the same faces.
       Parameters
       dice : must be a list of already instantiated similar dice
       Returns
       -----
       None
| play(self, rolls)
       This method takes an integer parameter to specify the number of times
the dice
       should be rolled. These values are then saved in a private data frame
in wide
       format. The roll number is row index starting with 0 and each die
index is the
       column name, with the values being faces rolled for each instance.
Parameters
       -----
       rolls: number of rolls to perform on each Die object within the Game
object
Returns
       -----
      None
| show recent play(self, df form='wide')
       Returns a copy of the private data frame created by the play function
to the user.
       Takes a parameter that controls whether the data frame is returned in
narrow or
      wide form.
Parameters
       df form : must be a string value in ['narrow', 'wide'], default is
'wide'
       Returns
       Narrow or wide formed data frame consisting of the data from the most
recent play
       function call by the Game object
```

```
Raises
       ----
       ValueError
          when df form input is not one of 'narrow' or 'wide'
 | -----
 | Data descriptors defined here:
   __dict__
       dictionary for instance variables (if defined)
   __weakref__
       list of weak references to the object (if defined)
                                                                   In [4]:
help(Analyzer)
Help on class Analyzer in module montecarlo.montecarlo:
class Analyzer(builtins.object)
| Analyzer(game)
| An Analyzer object takes the result of a Game object and computes various
descriptive
| statistical properties about it.
| Methods defined here:
   init (self, game)
       Initializes an Analyzer object from a Game object input.
       Parameters
       game : must be a Game object
      Returns
       -----
      None
      Raises
       ValueError
          when input parameter is not a Game object
 | combo count(self)
```

```
Computes the distinct combinations of faces rolled and their counts.
Here, the order
       does not matter. The method returns a data frame of the results.
      Parameters
       _____
      None
      Returns
       Data frame with a MultiIndex of distinct combinations and a column
for the associated
   counts values.
| face counts per roll(self)
       Computes the number of times each face is rolled in each event,
returning a data
      frame of the results.
      Parameters
       -----
       None
      Returns
      Data frame in wide format containing roll number as index, face
values as columns,
       and count values in the cells.
| jackpot(self)
       A jackpot is a result in which all faces are the same for a single
roll of all dice in
       the game. This method computes how many times this occurs among all
rolls in the game.
      Parameters
       _____
       None
      Returns
       An integer for the number of jackpots.
 | permutation_count(self)
```

```
Computes the distinct permutations of faces rolled and their counts.
Here, the order
       does matter. The method returns a data frame of the results.
       Parameters
       -----
       None
       Returns
       Data frame with a MultiIndex of distinct permutations and a column
for the associated
 count values.
   Data descriptors defined here:
   __dict_
       dictionary for instance variables (if defined)
    weakref
       list of weak references to the object (if defined)
```

README.md File (3)

Provide link to the README.md file of your project's repo.

- Metadata section or info present (1).
- Synopsis section showing how each class is called (1). (All must be included.)
- API section listing all classes and methods (1). (All must be included.)

URL: https://github.com/tylergorecki/ds5100-finalproject-ttg6nx/blob/main/README.md

Successful installation (2)

Put a screenshot or paste a copy of a terminal session where you successfully install your module with pip.

If pasting text, use a preformatted text block to show the results.

- Installed with pip (1).
- Successfully installed message appears (1).

Ran in terminal:

```
pip install -e .
Output:
    Obtaining file:///Users/tylergorecki/Desktop/DS%205100/ds5100-
finalproject-ttg6nx
    Preparing metadata (setup.py) ... done
    Installing collected packages: montecarlo
    Attempting uninstall: montecarlo
    Found existing installation: montecarlo 1.0.0
    Uninstalling montecarlo-1.0.0:
    Successfully uninstalled montecarlo-1.0.0
    Running setup.py develop for montecarlo
    Successfully installed montecarlo-1.0.0
```

Scenarios

Use code blocks to perform the tasks for each scenario.

Be sure the outputs are visible before submitting.

Scenario 1: A 2-headed Coin (9)

Task 1. Create a fair coin (with faces \$H\$ and \$T\$) and one unfair coin in which one of the faces has a weight of \$5\$ and the others \$1\$.

In [5]:

- Fair coin created (1).
- Unfair coin created with weight as specified (1).

```
import numpy as np

fair_coin = Die(np.array(['H','T']))
unfair_coin = Die(np.array(['H','T']))
unfair_coin.change_weight('H',5)
Task 2. Play a game of $1000$ flips with two fair dice.
```

• Play method called correctty and without error (1).

```
game1 = Game([fair_coin, fair_coin])
game1.play(1000)
In [6]:
```

Task 3. Play another game (using a new Game object) of \$1000\$ flips, this time using two unfair dice and one fair die. For the second unfair die, you can use the same die object twice in the list of dice you pass to the Game object.

- New game object created (1).
- Play method called correctty and without error (1).

```
In [7]:
game2 = Game([unfair_coin, unfair_coin, fair_coin])
game2.play(1000)
```

Task 4. For each game, use an Analyzer object to determine the raw frequency of jackpots — i.e. getting either all \$H\$s or all \$T\$s.

- Analyzer objecs instantiated for both games (1).
- Raw frequencies reported for both (1).

```
# Game 1
analyzer1 = Analyzer(game1)
jackpots1 = analyzer1.jackpot()
jackpots1

504

In [9]:
# Game 2
analyzer2 = Analyzer(game2)
jackpots2 = analyzer2.jackpot()
jackpots2
Out[9]:

Out[9]:
```

Task 5. For each analyzer, compute relative frequency as the number of jackpots over the total number of rolls.

• Both relative frequencies computed (1).

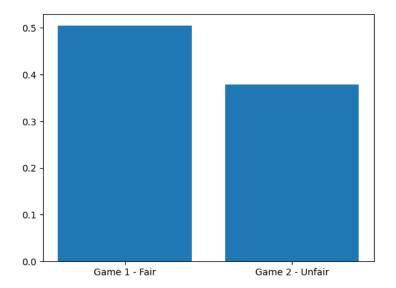
```
In [10]:
# Analyzer 1
relfreq1 = jackpots1 / len(analyzer1.game.show_recent_play())
relfreq1

0.504
In [11]:
# Analyzer 2
relfreq2 = jackpots2 / len(analyzer2.game.show_recent_play())
relfreq2
Out[11]:
0.378
```

Task 6. Show your results, comparing the two relative frequencies, in a simple bar chart.

• Bar chart plotted and correct (1).

```
In [12]:
import matplotlib.pyplot as plt
plt.bar(x = ['Game 1 - Fair', 'Game 2 - Unfair'], height=[relfreq1,
relfreq2]);
```



Scenario 2: A 6-sided Die (9)

Task 1. Create three dice, each with six sides having the faces 1 through 6.

• Three die objects created (1).

```
In [13]:
die1 = Die(np.array([1,2,3,4,5,6]))
die2 = Die(np.array([1,2,3,4,5,6]))
die3 = Die(np.array([1,2,3,4,5,6]))
```

Task 2. Convert one of the dice to an unfair one by weighting the face \$6\$ five times more than the other weights (i.e. it has weight of 5 and the others a weight of 1 each).

• Unfair die created with proper call to weight change method (1).

```
In [14]:
die1.change weight(6, 5)
```

Task 3. Convert another of the dice to be unfair by weighting the face \$1\$ five times more than the others.

• Unfair die created with proper call to weight change method (1).

```
In [15]:
die2.change_weight(1, 5)
```

Task 4. Play a game of \$10000\$ rolls with \$5\$ fair dice.

- Game class properly instantiated (1).
- Play method called properly (1).

```
In [16]:
game1 = Game([die3]*5)
```

```
game1.play(10000)
```

Task 5. Play another game of \$10000\$ rolls, this time with \$2\$ unfair dice, one as defined in steps #2 and #3 respectively, and \$3\$ fair dice.

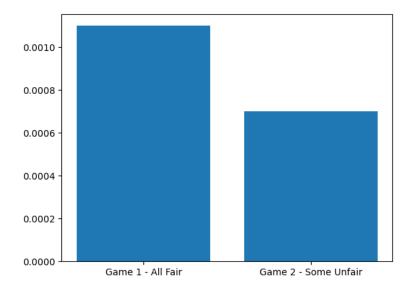
- Game class properly instantiated (1).
- Play method called properly (1).

```
In [17]:
game2 = Game([die1, die2, die3, die3, die3])
game2.play(10000)
```

Task 6. For each game, use an Analyzer object to determine the relative frequency of jackpots and show your results, comparing the two relative frequencies, in a simple bar chart.

- Jackpot methods called (1).
- Graph produced (1).

```
In [18]:
# Game 1
analyzer1 = Analyzer(game1)
relfreq1 = analyzer1.jackpot() / len(analyzer1.game.show recent play())
relfreq1
                                                                            Out[18]:
0.0011
                                                                            In [19]:
# Game 2
analyzer2 = Analyzer(game2)
relfreq2 = analyzer2.jackpot() / len(analyzer2.game.show_recent_play())
relfreq2
                                                                           Out[19]:
0.0007
                                                                            In [20]:
plt.bar(x = ['Game 1 - All Fair', 'Game 2 - Some Unfair'], height=[relfreq1,
relfreq2]);
```



Scenario 3: Letters of the Alphabet (7)

Task 1. Create a "die" of letters from \$A\$ to \$Z\$ with weights based on their frequency of usage as found in the data file <code>english_letters.txt</code>. Use the frequencies (i.e. raw counts) as weights.

- Die correctly instantiated with source file data (1).
- Weights properly applied using weight setting method (1).

```
In [21]:
import pandas as pd
english_letters = pd.read_csv('english_letters.txt', sep=' ', header=None)
letters = Die(np.array(english_letters[0]))

for i in range(len(english_letters)):
   index = english_letters.loc[i,0]
   weight = english_letters.loc[i,1]
   letters.change_weight(index, weight)
```

Task 2. Play a game involving \$4\$ of these dice with \$1000\$ rolls.

• Game play method properly called (1).

```
game = Game([letters]*4)
game.play(1000)
```

Task 3. Determine how many permutations in your results are actual English words, based on the vocabulary found in scrabble words.txt.

- Use permutation method (1).
- Get count as difference between permutations and vocabulary (1).

In [23]:

```
analyzer = Analyzer(game)
permutation = analyzer.permutation_count().reset_index()
permutation_words = permutation[0] + permutation[1] + permutation[2] +
permutation[3]

scrabble_words = pd.read_csv('scrabble_words.txt', header=None)
scrabble_words = scrabble_words[0]

len([word for word in list(permutation_words) if word in
list(scrabble_words)])

Out[23]:
```

Task 4. Repeat steps #2 and #3, this time with \$5\$ dice. How many actual words does this produce? Which produces more?

- Successfully repreats steps (1).
- Identifies parameter with most found words (1).

```
In [24]:
game = Game([letters]*5)
game.play(1000)

analyzer = Analyzer(game)
permutation = analyzer.permutation_count().reset_index()
permutation_words = permutation[0] + permutation[1] + permutation[2] +
permutation[3] + permutation[4]

scrabble_words = pd.read_csv('scrabble_words.txt', header=None)
scrabble_words = scrabble_words[0]

len([word for word in list(permutation_words) if word in
list(scrabble_words)])

Out[24]:
```

The 4 dice of letters produced more words than what was produced by the 5 dice.