```
In [1]:
```

```
from prob140 import Table
import matplotlib.pyplot as plt
import numpy as np
%matplotlib inline
```

### In [2]:

```
def add(num1, num2):
    return num1 + num2

dice = [1, 2, 3, 4, 5, 6]
X = set()
Y = set()
all_poss = []

for d1 in dice:
    for d2 in dice:
        all_poss.append( str(d1)+str(d2) )
        X.add( max(d1,d2) )
        Y.add( add(d1, d2) )
```

# In [3]:

```
print("All possibilities are", all_poss)
print("Random Variable X:", X)
print("Random Variable Y:", Y)

All possibilities are ['11', '12', '13', '14', '15', '16', '21', '22', '23', '24', '25', '26', '31', '32', '33', '34', '35', '36', '41', '42', '43', '44', '45', '46', '51', '52', '53', '54', '55', '56', '61', '62', '63', '64', '65', '66']
Random Variable X: {1, 2, 3, 4, 5, 6}
Random Variable Y: {2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12}
```

```
In [4]:
def str max(str poss):
    num1 = int(str poss[0])
    num2 = int(str_poss[1])
    return max(num1, num2)
def str_add(str_poss):
    num1 = int(str_poss[0])
    num2 = int(str_poss[1])
    return num1 + num2
def calc prob(num, all poss, fun):
    c = 0
    for poss in all_poss:
        if fun(poss) == num:
                                # If this poss satisfies the Random Variable's individual then increase count
er
            c = c + 1
    prob = c/len(all_poss)
      print(num, "occurs", c, "with", fun, "having", prob)
    return prob
# Calculating probs of all values of Random Variables
X \text{ probs} = \{\}
for x in X:
    X_probs[x] = calc_prob(x, all_poss, str_max)
# print()
Y \text{ probs} = \{\}
for y in Y:
    Y probs[y] = calc prob(y, all poss, str add)
print(round(sum(X_probs.values())) == 1)
print(round(sum(Y_probs.values())) == 1)
print(X_probs, '\n')
print(Y probs)
True
True
{1: 0.027777777777776, 2: 0.083333333333333333333333, 3: 0.13888888888888, 4: 0.194444444444444445
, 5: 0.25, 6: 0.305555555555556}
{2: 0.027777777777776, 3: 0.0555555555555555555, 4: 0.083333333333333, 5: 0.111111111111111
, 6: 0.13888888888889, 7: 0.16666666666666666666666666, 8: 0.1388888888889, 9: 0.1111111111111111,
10: 0.08333333333333333, 11: 0.055555555555555, 12: 0.0277777777777776}
In [5]:
res = []
           # Calculating probs of all cartesian pairs of X and Y
for x in X:
    for y in Y:
        prob = X_probs[x] * Y_probs[y]
#
         print(x,"with", X probs[x], y, "with", Y probs[y], "has", prob)
```

In [6]:

res.append(prob)

```
print(round(sum(res)) == 1)
print(len(res))
```

True 66

```
In [7]:
```

```
dist = Table().domain("X", X, "Y", Y)
print(dist, '\n')
print(dist.shape)
1
       2
     | 3
1
1
     | 4
     | 5
     | 6
1
     7
     i 8
1
     9
1
     | 10
     | 11
... (56 rows omitted)
X | Y
[66] | [66]
Χ
```

/home/muhammadammarabid/anaconda3/lib/python3.8/site-packages/datascience/tables.py:222: Future Warning: Implicit column method lookup is deprecated.

warnings.warn("Implicit column method lookup is deprecated.", FutureWarning)

# In [8]:

```
dist = dist.probabilities(res)
```

### In [9]:

dist

# Out[9]:

	X=1	X=2	X=3	X=4	X=5	X=6
Y=12	0.000772	0.002315	0.003858	0.005401	0.006944	0.008488
Y=11	0.001543	0.004630	0.007716	0.010802	0.013889	0.016975
Y=10	0.002315	0.006944	0.011574	0.016204	0.020833	0.025463
Y=9	0.003086	0.009259	0.015432	0.021605	0.027778	0.033951
Y=8	0.003858	0.011574	0.019290	0.027006	0.034722	0.042438
Y=7	0.004630	0.013889	0.023148	0.032407	0.041667	0.050926
Y=6	0.003858	0.011574	0.019290	0.027006	0.034722	0.042438
Y=5	0.003086	0.009259	0.015432	0.021605	0.027778	0.033951
Y=4	0.002315	0.006944	0.011574	0.016204	0.020833	0.025463
Y=3	0.001543	0.004630	0.007716	0.010802	0.013889	0.016975
Y=2	0.000772	0.002315	0.003858	0.005401	0.006944	0.008488

### In [10]:

```
dist.both marginals()
```

### Out[10]:

	X=1	X=2	X=3	X=4	X=5	X=6	Sum: Marginal of Y
Y=12	0.000772	0.002315	0.003858	0.005401	0.006944	0.008488	0.027778
Y=11	0.001543	0.004630	0.007716	0.010802	0.013889	0.016975	0.055556
Y=10	0.002315	0.006944	0.011574	0.016204	0.020833	0.025463	0.083333
Y=9	0.003086	0.009259	0.015432	0.021605	0.027778	0.033951	0.111111
Y=8	0.003858	0.011574	0.019290	0.027006	0.034722	0.042438	0.138889
Y=7	0.004630	0.013889	0.023148	0.032407	0.041667	0.050926	0.166667
Y=6	0.003858	0.011574	0.019290	0.027006	0.034722	0.042438	0.138889
Y=5	0.003086	0.009259	0.015432	0.021605	0.027778	0.033951	0.111111
Y=4	0.002315	0.006944	0.011574	0.016204	0.020833	0.025463	0.083333
Y=3	0.001543	0.004630	0.007716	0.010802	0.013889	0.016975	0.055556
Y=2	0.000772	0.002315	0.003858	0.005401	0.006944	0.008488	0.027778
Sum: Marginal of X	0.027778	0.083333	0.138889	0.194444	0.250000	0.305556	1.000000

### In [11]:

```
X_marginal_dist = dist.marginal_dist("X")
print(X_marginal_dist)
```

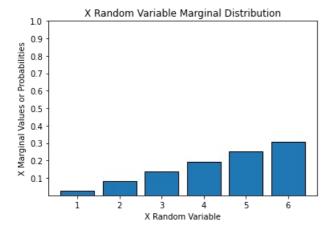
### In [12]:

```
X_vals, X_probs = X_marginal_dist[0], X_marginal_dist[1]
print( X_vals, X_probs)
```

[1 2 3 4 5 6] [0.02777778 0.08333333 0.13888889 0.19444444 0.25 0.30555556]

# In [13]:

```
def plot_X_marginal_dist(X_vals, X_probs):
    plt.bar(X_vals, X_probs)
    plt.yticks(np.arange(0.1, 1.10, 0.10))
    plt.xlabel("X Random Variable")
    plt.ylabel("X Marginal Values or Probabilities")
    plt.title("X Random Variable Marginal Distribution")
    plt.show()
plot_X_marginal_dist(X_vals, X_probs)
```



```
In [15]:
```

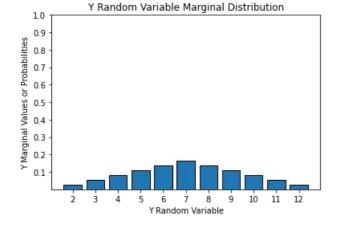
```
Y marginal dist = dist.marginal dist("Y")
print(Y marginal dist)
Value | Probability
        0.0277778
3
        0.055556
        0.0833333
5
        0.111111
6
        0.138889
        0.166667
8
        0.138889
9
        0.111111
10
      0.0833333
      | 0.055556
11
... (1 rows omitted)
In [16]:
```

```
Y_vals, Y_probs = Y_marginal_dist[0], Y_marginal_dist[1]
print(Y_vals, Y_probs)
```

```
[ 2 3 4 5 6 7 8 9 10 11 12] [0.02777778 0.05555556 0.08333333 0.11111111 0.13888889 0.16 666667 0.13888889 0.11111111 0.08333333 0.05555556 0.02777778]
```

# In [17]:

```
def plot_Y_marginal_dist(Y_vals, Y_probs):
    plt.bar(Y_vals, Y_probs)
    plt.xticks(np.arange(2, 13, 1))
    plt.yticks(np.arange(0.1, 1.10, 0.10))
    plt.xlabel("Y Random Variable")
    plt.ylabel("Y Marginal Values or Probabilities")
    plt.title("Y Random Variable Marginal Distribution")
    plt.show()
plot_Y_marginal_dist(Y_vals, Y_probs)
```



# **Let's Try Challenge Question**

```
In [18]:
unfair_dice = [(1, first_half_prob), (2, first_half_prob), (3, first_half_prob),
           (4, second half prob), (5, second half prob), (6, second half prob)]
all poss = []
for d1 in unfair dice:
   for d2 in unfair dice:
      all poss.append( (str(d1[0])+str(d2[0]), d1[1]*d2[1]) )
print("All possibilities are", all poss)
print("Random Variable X:", X)
print("Random Variable Y:", Y)
print( round(sum(p[1] for p in all poss)) == 1 )
99994), ('55', 0.039999999999999), ('56', 0.03999999999999), ('61', 0.02666666666666666
), ('62', 0.0266666666666666), ('63', 0.026666666666666), ('64', 0.03999999999999999), (
Random Variable Y: {2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12}
True
In [19]:
# This logic could be used for above case too, it would give same results
def calc prob(num, all poss, fun):
   total prob = 0
   for poss in all poss:
      # Summing the probs of the possibilities which satisfy Random Variable's individual
      if fun(poss[0]) == num:
         total prob = total prob + poss[1]
```

return total prob

```
In [20]:

X_probs = {}
for x in X:
    X_probs[x] = calc_prob(x, all_poss, str_max)
# print()
Y_probs = {}
for y in Y:
    Y_probs[y] = calc_prob(y, all_poss, str_add)

print(round(sum(X_probs.values())) == 1)
print(round(sum(Y_probs.values())) == 1)
print(X_probs, '\n')
print(Y_probs)
```

```
In [21]:
```

```
# Probs of all cartesian pairs
res = []
for x in X:
    for y in Y:
        prob = X_probs[x] * Y_probs[y]
#        print(x, "with", X_probs[x], y, "with", Y_probs[y], "has", prob)
        res.append(prob)

print()
print(round(sum(res)) == 1)
print(len(res))
```

True 66

### In [22]:

```
dist = Table().domain("X", X, "Y", Y)
print(dist, '\n')
print(dist.shape)
dist = dist.probabilities(res)
```

```
| Y
1
     2
     | 3
1
1
     | 4
       5
1
     | 6
     j 7
1
1
     | 8
     | 9
1
       10
1
     | 11
... (56 rows omitted)
     | Y
[66] | [66]
```

/home/muhammadammarabid/anaconda3/lib/python3.8/site-packages/datascience/tables.py:222: Future
Warning: Implicit column method lookup is deprecated.
 warnings.warn("Implicit column method lookup is deprecated.", FutureWarning)

# In [23]:

dist

# Out[23]:

	X=1	X=2	X=3	X=4	X=5	X=6
Y=12	0.000711	0.002133	0.003556	0.008000	0.011200	0.0144
Y=11	0.001422	0.004267	0.007111	0.016000	0.022400	0.0288
Y=10	0.002133	0.006400	0.010667	0.024000	0.033600	0.0432
Y=9	0.002370	0.007111	0.011852	0.026667	0.037333	0.0480
Y=8	0.002607	0.007822	0.013037	0.029333	0.041067	0.0528
Y=7	0.002844	0.008533	0.014222	0.032000	0.044800	0.0576
Y=6	0.002212	0.006637	0.011062	0.024889	0.034844	0.0448
Y=5	0.001580	0.004741	0.007901	0.017778	0.024889	0.0320
Y=4	0.000948	0.002844	0.004741	0.010667	0.014933	0.0192
Y=3	0.000632	0.001896	0.003160	0.007111	0.009956	0.0128
Y=2	0.000316	0.000948	0.001580	0.003556	0.004978	0.0064

### In [24]:

dist.both marginals()

### Out[24]:

	X=1	X=2	X=3	X=4	X=5	X=6	Sum: Marginal of Y
Y=12	0.000711	0.002133	0.003556	0.008000	0.011200	0.0144	0.040000
Y=11	0.001422	0.004267	0.007111	0.016000	0.022400	0.0288	0.080000
Y=10	0.002133	0.006400	0.010667	0.024000	0.033600	0.0432	0.120000
Y=9	0.002370	0.007111	0.011852	0.026667	0.037333	0.0480	0.133333
Y=8	0.002607	0.007822	0.013037	0.029333	0.041067	0.0528	0.146667
Y=7	0.002844	0.008533	0.014222	0.032000	0.044800	0.0576	0.160000
Y=6	0.002212	0.006637	0.011062	0.024889	0.034844	0.0448	0.124444
Y=5	0.001580	0.004741	0.007901	0.017778	0.024889	0.0320	0.088889
Y=4	0.000948	0.002844	0.004741	0.010667	0.014933	0.0192	0.053333
Y=3	0.000632	0.001896	0.003160	0.007111	0.009956	0.0128	0.035556
Y=2	0.000316	0.000948	0.001580	0.003556	0.004978	0.0064	0.017778
Sum: Marginal of X	0.017778	0.053333	0.088889	0.200000	0.280000	0.3600	1.000000

# In [25]:

```
X marginal dist = dist.marginal dist("X")
X_vals, X_probs = X_marginal_dist[0], X_marginal_dist[1]
print(X_vals, X_probs, '\n')
Y_marginal_dist = dist.marginal_dist("Y")
Y_vals, Y_probs = Y_marginal_dist[0], Y_marginal_dist[1]
print(Y_vals, Y_probs)
```

```
[1 2 3 4 5 6] [0.01777778 0.05333333 0.088888889 0.2
                                                            0.28
```

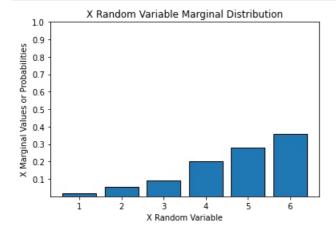
]

0.36

 $[\ 2\ 3\ 4\ 5\ 6\ 7\ 8\ 9\ 10\ 11\ 12]\ [0.01777778\ 0.03555556\ 0.05333333\ 0.08888889\ 0.12444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.16888889\ 0.124444444\ 0.1688889\ 0.124444444\ 0.1688889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.168889\ 0.124444444\ 0.16889\ 0.124444444\ 0.168889\ 0.12444444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.124444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.124444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.1244444444\ 0.168889\ 0.12444444444\ 0.168889\ 0.12444444444\ 0.168889\ 0.12444444444\ 0.168889\ 0.12444444444$ 0.14666667 0.13333333 0.12 0.08 0.04 ]

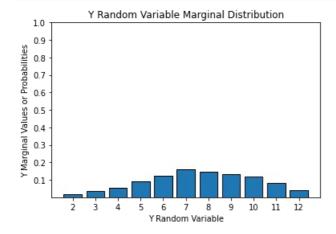
# In [26]:

plot\_X\_marginal\_dist(X\_vals, X\_probs) # Difference btw 1-3 and 4-6 is little bit more compared to fair one



# In [27]:

plot\_Y\_marginal\_dist(Y\_vals, Y\_probs) # Change after 7 compared to last one



# In [ ]: