Biodiversity for the National Parks

Capstone Option 2 by Shengcui Cheong

@Toolatetofail (on Slack)

Description of data in species.info.csv

- There are 5,824 record of species across 7 species types in the data
- Of the total record of 5,824 recorded species, 5,541 are unique as retrieved by the following code:

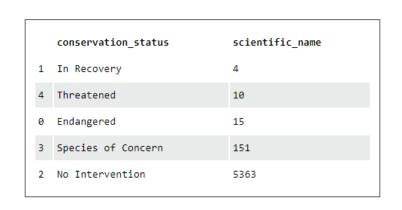
```
species_count = species.scientific_name.nunique()
```

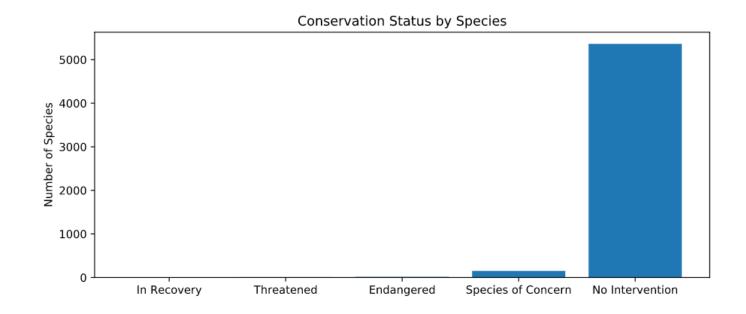
Highlighted code and result for both unique count and count:

```
scientific name
× script.py
                                                                                                 Mammal Clethrionomys gapperi gapperi
                                                                                                                               Bos bison
                                                                                                                              Bos taurus
import codecademylib
                                                                                                                              Ovis aries
import pandas as pd
                                                                                                                         Cervus elaphus
from matplotlib import pyplot as plt
                                                                                                                                       common names conservation status
species = pd.read_csv('species info.csv')
                                                                                                                          Gapper's Red-Backed Vole
                                                                                                                              American Bison, Bison
                                                                                                                                                                      NaN
print species.head()
                                                                                             2 Aurochs, Aurochs, Domestic Cattle (Feral), Dom...
                                                                                                                                                                      NaN
species count = species.scientific name.nunique()
                                                                                               Domestic Sheep, Mouflon, Red Sheep, Sheep (Feral)
                                                                                                                                                                      NaN
print species count
                                                                                                                                      Wapiti Or Elk
                                                                                                                                                                      \mathsf{NaN}
species count2 = species.scientific name.count()
                                                                                             5541
print species count2
```

Description of data in species.info.csv

 Most of the species are thriving with no need of intervention while some are endangered or threatened. The distribution is as follows:





Please note that the species count for these table and charts are 5,543... 2 more than the 5,541 unique count as shown in earlier slide. Perhaps there are unique species categorized in two or more conservation status

Description of data in species.info.csv

• The breakdown of 5,824 species (non-unique) across 7 species types are as follow:

Category	Not Protected	Protected	Total	% protected
Amphibian	73	7	80	8.75%
Bird	442	79	521	15.16%
Fish	116	11	127	8.66%
Mammal	176	38	214	17.76%
Nonvascular Plant	328	5	333	1.50%
Reptile	74	5	79	6.33%
Vascular Plant	4,424	46	4,470	1.03%

is_protected	category	not_protected	protected	percent_protected
0	Amphibian	73	7	0.087500
1	Bird	442	79	0.151631
2	Fish	116	11	0.086614
3	Mammal	176	38	0.177570
4	Nonvascular Plant	328	5	0.015015
5	Reptile	74	5	0.063291
6	Vascular Plant	4424	46	0.010291

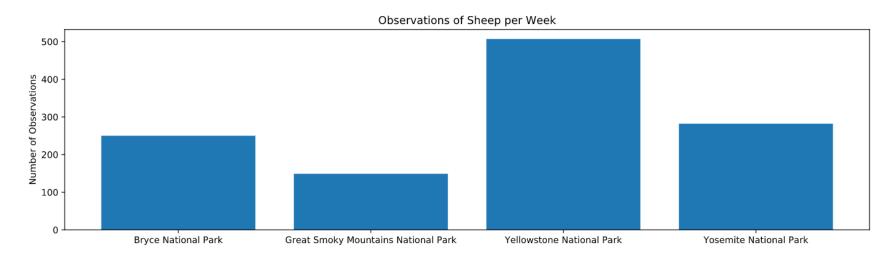
Significance calculation

- From the data in the previous slide, mammal and bird are most threatened.
- Are mammals more likely to be endangered than birds? Or is this due to chance (null hypothesis)? A chi-squared test of significance between them returns a pval of 0.68759 which is more than the 0.05 significance threshold.
- A value higher than 0.05 indicates weak evidence against null hypothesis which means mammal maybe more endangered than bird due to chance.
- A comparative study chi-squared test on mammal vs. reptile yield a pval of 0.0384 which is lower than 0.05 significance threshold. This means it is not due to chance that mammals are more endangered than reptile.
- It is recommended that more conservation and rehabilitation efforts should be channelled to protect birds and mammals as the significance study showed that there are types of species that are more likely to be endangered.

Foot and mouth disease in sheep

• The following is the observation of sheep in 4 national parks in a week

	park_name	observations
0	Bryce National Park	250
1	Great Smoky Mountains National Park	149
2	Yellowstone National Park	507
3	Yosemite National Park	282



Foot and mouth disease in sheep

- From the study in Bryce National Park, 15% of sheep are known to have foot and mouth disease.
- Therefore this sample sets the baseline at 15%
- As the park rangers want to reduce the % of foot and mouth infection to 10%, data scientist need to be able to measure a drop of 33% (5% out of 15%).
- Hence data scientist should set minimum detectable effect at 33%
- To achieve 90% of confidence level that the park ranger program is indeed effective, the sample size should be at 520.
- If data scientist is to observe at Yellowstone National Park, this will take slightly over a week of observation.

Code (Appendix)

Exercise 1 to 4

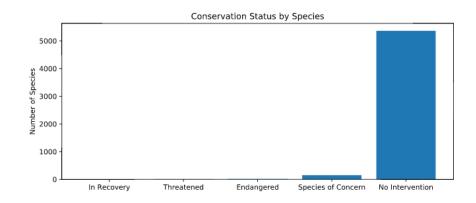
```
scientific_name \
Clethrionomys gapperi gapperi
                                                                                               Mamma1
                                                                                                                           Bos bison
                                                                                                                          Bos taurus
     import codecademylib
                                                                                                                          Ovis aries
     import pandas as pd
                                                                                               Mammal
                                                                                                                      Cervus elaphus
     from matplotlib import pyplot as plt
                                                                                                                                    common names conservation status
     species = pd.read csv('species info.csv')
                                                                                                                       Gapper's Red-Backed Vole
                                                                                                                          American Bison, Bison
                                                                                                                                                                 NaN
     print species.head()
                                                                                           2 Aurochs, Aurochs, Domestic Cattle (Feral), Dom...
                                                                                                                                                                 NaN
  8 species count = species.scientific name.nunique()
                                                                                             Domestic Sheep, Mouflon, Red Sheep, Sheep (Feral)
                                                                                                                                                                 NaN
     print species count
                                                                                                                                  Wapiti Or Elk
                                                                                                                                                                 NaN
10 species_type = species.category.unique()
                                                                                           5541
11 print species type
                                                                                           ['Mammal' 'Bird' 'Reptile' 'Amphibian' 'Fish' 'Vascular Plant'
12 conservation statuses = species.conservation status.unique()
                                                                                            'Nonvascular Plant']
                                                                                           [nan 'Species of Concern' 'Endangered' 'Threatened' 'In Recovery']
    print conservation statuses
14 conservation counts =
                                                                                             conservation status scientific name
     species.groupby('conservation status').scientific name.nunique().reset index()
                                                                                           0
                                                                                                      Endangered
15 print conservation counts
                                                                                                     In Recovery
                                                                                           2 Species of Concern
                                                                                                                               151
16 species.conservation status.fillna('No Intervention', inplace = True)
                                                                                                      Threatened
                                                                                                                               10
17 conservation counts fixed =
                                                                                             conservation status scientific name
     species.groupby('conservation status').scientific name.nunique().reset index()
                                                                                           0
                                                                                                                               15
                                                                                                      Endangered
    print conservation counts fixed
                                                                                           1
                                                                                                     In Recovery
                                                                                                 No Intervention
                                                                                                                             5363
                                                                                             Species of Concern
                                                                                                                              151
                                                                                                      Threatened
                                                                                                                               10
```

https://gist.github.com/462869499623775c203031790738a386

Exercise 5

```
import codecademylib
    import pandas as pd
    from matplotlib import pyplot as plt
    species = pd.read csv('species info.csv')
    species.fillna('No Intervention', inplace = True)
8 * protection counts = species.groupby('conservation_status')\
        .scientific name.nunique().reset index()\
        .sort_values(by='scientific_name')
   print protection counts
   plt.figure(figsize = (10,4))
14 ax = plt.subplot()
   plt.bar(range(len(protection_counts.conservation_status)),protection_counts.scientific_name)
16 ax.set xticks([0,1,2,3,4])
   ax.set xticklabels(protection counts.conservation status)
   plt.ylabel('Number of Species')
19 plt.title('Conservation Status by Species')
20 plt.show()
```

	conservation_status	scientific_name
1	In Recovery	4
4	Threatened	10
0	Endangered	15
3	Species of Concern	151
2	No Intervention	5363



https://gist.github.com/dbb11bad24e9b20492af25d87056452b

Exercise 6 to 7

```
5813
                                                                                                            False
    import pandas as pd
                                                                                              5814
                                                                                                            False
    from matplotlib import pyplot as plt
                                                                                              5815
                                                                                                            False
                                                                                              5816
                                                                                                            False
                                                                                              5817
                                                                                                            False
    species = pd.read_csv('species_info.csv')
                                                                                              5818
                                                                                                            False
                                                                                              5819
                                                                                                            False
    species.fillna('No Intervention', inplace = True)
                                                                                              5820
                                                                                                            False
   print species
                                                                                              5821
                                                                                                            False
                                                                                              5822
                                                                                                            False
10 * species['is_protected'] = species.apply(lambda row:
                                                                                              5823
                                                                                                            False
                                          if row['conservation status'] != 'No Intervention'
                                                                                              [5824 rows x 5 columns]
                                                                                                 is protected
                                                                                                                         category scientific name
                                                                                                        False
                                                                                                                        Amphibian
                                                                                                                                                442
                                                                                                        False
                                                                                                                             Bird
                                                                                                                             Fish
                                                                                                                                                116
                                                                                                        False
                                                                                                                                                176
                                                                                                        False
                                                                                                                           Mammal
   category_counts = species.groupby(['is_protected','category'])
                                                                                                         False Nonvascular Plant
                                                                                                                                                328
    ['scientific_name'].count().reset_index()
                                                                                                                      category False True
                                                                                              is protected
   print category_counts.head()
                                                                                                                                   73
                                                                                                                      Amphibian
                                                                                                                                  442
                                                                                                                                          79
                                                                                                                                  116
1  r category_pivot = category_counts.pivot(columns = 'is_protected',
                                                                                                                                          11
                                         index = 'category',
                                                                                                                                   328
                                         values = 'scientific name'
                                                                                                             Nonvascular Plant
                                                                                                                       Reptile
                                                                                                                                   74
                                        ).reset index()
                                                                                                                Vascular Plant
                                                                                                                                 4424
                                                                                                                                          46
   print category_pivot
                                                                                              is protected
                                                                                                                      category
                                                                                                                                 not protected
                                                                                                                                                protected
                                                                                                                     Amphibian
                                                                                                                                            73
     False: 'not_protected',
                                                                                                                          Bird
                                                                                                                                           442
                                                                                                                                                       79
     True: 'protected'},
                                                                                                                          Fish
                                                                                                                                           116
                                                                                                                                                       11
                                                                                                                        Mamma1
                                                                                                                                           176
                                                                                                                                                       38
                                                                                                             Nonvascular Plant
                                                                                                                                           328
                                                                                                                       Reptile
                                                                                                                                           74
   category_pivot['percent_protected'] = category_pivot.protected / (category_pivot.protected
                                                                                                                Vascular Plant
                                                                                                                                          4424
                                                                                                                                                       46
    + category_pivot.not_protected)
                                                                                              is_protected
                                                                                                                                 not protected
                                                                                                                                                protected
                                                                                                                                                            percent protected
   print category pivot
                                                                                                                                            73
                                                                                                                                                                     0.087500
                                                                                                                          Bird
                                                                                                                                           442
                                                                                                                                                       79
                                                                                                                                                                     0.151631
                                                                                                                                                       11
                                                                                                                          Fish
                                                                                                                                           116
                                                                                                                                                                     0.086614
                                                                                                                                           176
                                                                                                                                                       38
                                                                                                                                                                     0.177570
                                                                                                                        Mamma1
                                                                                                                                           328
                                                                                                             Nonvascular Plant
                                                                                                                                                                     0.015015
                                                                                                                       Reptile
                                                                                                                                           74
                                                                                                                                                                     0.063291
                                                                                                                Vascular Plant
                                                                                                                                          4424
                                                                                                                                                                    0.010291
Run
```

https://gist.github.com/7d7698be6a2e35672a3bf3c7f60391b4

Exercise 8 to 9

```
category not_protected protected percent_protected
       script.py
                                                                                                                    Amphibian
                                                                                                                                                                    0.087500
                                                                                                                                           73
                                                                                                                         Bird
                                                                                                                                          442
                                                                                                                                                                    0.151631
                                                                                                                                          116
                                                                                                                                                      11
                                                                                                                                                                    0.086614
        .sort_values(by='scientific_name')
                                                                                                                         Fish
                                                                                                                       Mamma1
                                                                                                                                          176
                                                                                                                                                                    0.177570
                                                                                                                                          328
                                                                                                           Nonvascular Plant
                                                                                                                                                                    0.015015
                                                                                                                      Reptile
                                                                                                                                          74
                                                                                                                                                                    0.063291
                                                                                                              Vascular Plant
                                                                                                                                         4424
                                                                                                                                                                    0.010291
                                                                                                        0.687594809666
                                                                                                        0.0383555902297
    species['is_protected'] = species.conservation_status != 'No Intervention'
46 * category_counts = species.groupby(['category', 'is_protected'])\
                            .scientific_name.count().reset_index()
51 category_pivot = category_counts.pivot(columns='is_protected', index='category',
    values='scientific_name').reset_index()
   category_pivot.columns = ['category', 'not_protected', 'protected']
   category_pivot['percent_protected'] = category_pivot.protected / (category_pivot.protected +
    category_pivot.not_protected)
    print category_pivot
58 * contingency = [[30, 146],
60 from scipy.stats import chi2_contingency
61 chi2, pval, dof, expected = chi2_contingency(contingency)
63 * contingency_reptile_mammal = [[5, 73],
   chi2, pval reptile mammal, dof, expected = chi2 contingency(contingency reptile mammal)
    print pval_reptile_mammal
```

https://gist.github.com/4bec4851ba30cecb25b12fe9fba3629e

Exercise 10 to 12

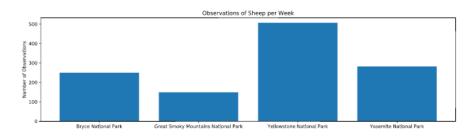
```
import pandas as pd
    from matplotlib import pyplot as plt
                                                                                                     category scientific_name
                                                                                                                                      common names
                                                                                                                                                                                       consei
    species = pd.read_csv('species_info.csv')
    species.fillna('No Intervention', inplace = True)
                                                                                                                                      Domestic Sheep, Mouflon, Red Sheep, Sheep (Feral) No Int
                                                                                                     Mammal Ovis aries
    species['is protected'] = species.conservation status != 'No Intervention'
    observations = pd.read_csv('observations.csv')
                                                                                                             Ovis canadensis
                                                                                                                                      Bighorn Sheep, Bighorn Sheep
                                                                                                                                                                                       Specie
    print species.head()
                                                                                                4446 Mammal Ovis canadensis sierrae Sierra Nevada Bighorn Sheep
                                                                                                                                                                                       Endang
   print observations.head()
11 * species['is sheep'] = species.apply(lambda row:
                                      if 'Sheep' in row['common names']
                                                                                               5 Mammal Ovis canadensis
                                                                                                                                    Bighorn Sheep, Bighorn Sheep
                                                                                                                                                                                     Species
                                                                                                6 Mammal Ovis canadensis
                                                                                                                                   Bighorn Sheep, Bighorn Sheep
                                                                                                                                                                                     Species
18 species is sheep = species[species.is sheep == True]
                                                                                                7 Mammal Ovis canadensis
                                                                                                                                   Bighorn Sheep, Bighorn Sheep
                                                                                                                                                                                     Species
   print species_is_sheep
                                                                                                8 Mammal Ovis canadensis sierrae Sierra Nevada Bighorn Sheep
                                                                                                                                                                                     Endanger
   sheep_species = species[(species.is_sheep == True) & (species.category == 'Mammal')]
   print sheep species
                                                                                                                                                                                     Endanger
                                                                                                9 Mammal Ovis canadensis sierrae Sierra Nevada Bighorn Sheep
    sheep_observations = pd.merge(sheep_species, observations)
   print sheep_observations
                                                                                                10 Mammal Ovis canadensis sierrae Sierra Nevada Bighorn Sheep
                                                                                                                                                                                     Endanger
obs by park = sheep observations.groupby('park name').observations.sum().reset index()
   print obs_by_park
                                                                                                11 Mammal Ovis canadensis sierrae Sierra Nevada Bighorn Sheep
                                                                                                                                                                                     Endanger
                                                                                                   park name
                                                                                                                                                                  observations
                                                                                                0 Bryce National Park
                                                                                                                                                                  250
                                                                                                1 Great Smoky Mountains National Park
                                                                                                                                                                  149
                                                                                                2 Yellowstone National Park
                                                                                                                                                                  507
                                                                                                3 Yosemite National Park
                                                                                                                                                                  282
```

https://gist.github.com/73a8e5bb2b52147a0ad03b92c3886ba4

Exercise 13

```
import codecademylib
import pandas as pd
from matplotlib import pyplot as plt
species = pd.read_csv('species_info.csv')
species['is_sheep'] = species.common_names.apply(lambda x: 'Sheep' in x)
sheep species = species[(species.is sheep) & (species.category == 'Mammal')]
observations = pd.read csv('observations.csv')
sheep observations = observations.merge(sheep species)
obs_by_park = sheep_observations.groupby('park_name').observations.sum().reset_index()
print obs by park
plt.figure(figsize=(16,4))
ax = plt.subplot()
plt.bar(range(len(obs_by_park.park_name)),obs_by_park.observations)
ax.set_xticks([0,1,2,3])
ax.set_xticklabels(obs_by_park.park_name)
plt.ylabel('Number of Observations')
plt.title('Observations of Sheep per Week')
plt.show()
```

	park_name	observations
0	Bryce National Park	250
1	Great Smoky Mountains National Park	149
2	Yellowstone National Park	507
3	Yosemite National Park	282



https://gist.github.com/ad78fa33403cf7f1e82972b68399ffd9

Exercise 14 to 15

```
script.py

1 baseline = 15
2 minimum_detectable_effect = 33
3 sample_size_per_variant = 520
4 yellowstone_weeks_observing = 2
```