

### **Project Background**

The goal of this project is to perform a statistical analysis on the impact of the Gray Wolf population in Wisconsin in order to support or refute commonly held concerns about the impacts of Gray Wolves

#### Questions of Interest:

- 1. How has the growth in the Wisconsin Gray Wolf population impacted the Wisconsin deer population?
- 2. Has the growing wolf population led to an increase in the number of interactions between people and wolves?
- 3. Time permitting, how have the lives and deaths of wolves changed over the reporting period?

3 project components - PDF data parser, data checker, statistical analyzer

### Background and Use Case

Wisconsin Department of Natural Resources (DNR) publishes data on wolf and deer in the state in PDFs and does not provide access to the underlying data.

Transcribing the data from the PDFs creates opportunity for data errors and would inhibit others from expanding on the work by adding data from other years or other states

We plan to utilize a software package to extract the data tables from the PDFs programmatically and then analyze the data.

## Package Options

#### tabula - py:

Python wrapper of tabula-java. A library for extracting tables from PDF files and converting them into a pandas DataFrame.

Author: Aki Ariga (tabula-py) and tabula-java (Manuel Aristaran)

Requires Java 8+ and Python 3.7+

MIT License

### Camelot - py:

Camelot is a PDF table extraction library that was made to offer complete control over the extraction process.

Author: Dimiter Naydenov and Vinayak Mehta

Requires ghostscript and tkinter (for Windows)

MIT License

# **Tabula-py Testing**

- Easy to install and run
- Able to export data in numerous formats, but defaults to a pandas DataFrame.
- Results will require substantial cleaning and validation:
  - Difficulty processing tables with multi-line headers or rows.

**Table 1.** Total miles tracked, average miles tracked per survey, and the number of surveys completed by wolf harvest zone and personnel type during the 2021-2022 winter tracking season.

| Wolf Management Unit | Total Miles<br>Tracked | Average Miles<br>per Survey | Number of Surveys<br>Completed |     |
|----------------------|------------------------|-----------------------------|--------------------------------|-----|
| Zone 1               | 5,689                  | 35                          |                                | 163 |
| Zone 2               | 3,764                  | 30                          |                                | 128 |
| Zone 3               | 2,189                  | 38                          |                                | 57  |
| Zone 4               | 903                    | 26                          |                                | 35  |
| Zone 5               | 1,219                  | 30                          |                                | 41  |
| Zone 6               | 3,015                  | 33                          |                                | 92  |
| Volunteer            | 4,165                  | 29                          |                                | 142 |
| DNR                  | 10,902                 | 33                          |                                | 332 |
| USDA                 | 1,457                  | 47                          |                                | 31  |
| Tribal               | 129                    | 26                          |                                | 5   |
| Military             | 126                    | 21                          |                                | 6   |
| Total (Statewide)    | 16,779                 | 32                          |                                | 516 |

| Index | Unnamed: 0           | Total Miles | Average Miles | Unnamed: 1 | Number of Surveys | Unnamed: 2 |
|-------|----------------------|-------------|---------------|------------|-------------------|------------|
|       | Wolf Management Unit | nan         | nan           | nan        | nan               | nan        |
|       | nan                  | Tracked     | per Survey    | nan        | Completed         | nan        |
|       | Zone 1               | 5,689       | nan           | 35         | nan               | 163        |
|       | Zone 2               | 3,764       | nan           | 30         | nan               | 128        |
| 4     | Zone 3               | 2,189       | nan           | 38         | nan               | 57         |
|       | Zone 4               | 903         | nan           | 26         | nan               | 35         |
| 6     | Zone 5               | 1,219       | nan           | 30         | nan               | 41         |
|       | Zone 6               | 3,015       | nan           |            | nan               | 92         |
| 8     | Volunteer            | 4,165       | nan           | 29         | nan               | 142        |
| 9     | DNR                  | 10,902      | nan           |            | nan               | 332        |
| 10    | USDA                 | 1,457       | nan           | 47         | nan               | 31         |
|       | Tribal               | 129         | nan           | 26         | nan               | 5          |
|       | Military             | 126         | nan           |            | nan               | 6          |
|       | Total (Statewide)    | 16,779      | nan           |            | nan               | 516        |

# **Camelot Testing**

#### Pros

- Easy to use
- Multi-platform support
- Can read skewed and rotated tables

### Cons

- Slow on large/complex PDF files
- Difficult download process depending on OS
- Less documentation

|  | Wolf Ha | rvest Zo | ne  |   |     |    | State |
|--|---------|----------|-----|---|-----|----|-------|
|  | 1       | 2        | 3   | 4 | 5   | 6  | Total |
| Livestock Cases  |         |          |     |   |     |    |       |
| Confirmed Depredation<br>Incidents                           | 28      | 2        | 6   | 1 | 5   | 8  | 5     |
| Confirmed Threat Incidents                                   | 13      |          | 3   | 1 | - 0 | 1  | 1     |
| Chronic Farms Affected                                       | 18      | 1        | 4   |   | 1   |    | 2     |
| Total Farms Affected   | 24      | 1        | 5   | 2 | 5   | 6  | 4     |
| Cattle Killed  | 27      |          | 6   | 1 | 4   | 3  | 4     |
| Cattle Injured   | 5       |          |     |   | 9.  |    |       |
| Captive Deer Killed  |         | 4        |     |   |     |    |       |
| Captive Deer Injured   |         |          |     |   | - 5 |    | . )   |
| Sheep Killed   | 1       |          |     |   |     | 16 | 1     |
| Sheep Injured  |         |          |     |   | - 7 |    | 7 )   |
| Goats Killed   |         |          |     |   | - 1 |    | 7     |
| Alpacas Killed   |         |          | - 1 |   | - 1 |    | 9     |
| Alpacas Injured  |         |          |     |   | - 1 |    | 9     |
| Horses Killed  | 1       |          |     |   | 1   | 1  |       |
| Horses Injured   |         |          |     |   | - 0 |    | )     |
| Poultry Killed   |         |          |     |   |     |    | 0     |
| Non-Livestock Cases  |         |          |     |   |     |    |       |
| Confirmed Depredation<br>Incidents                           | 17      | 1        | 3   | 0 | 1   | 0  | 2     |
| Confirmed Threat Incidents                                   | 4       | 0        | 0   | 1 | 0   | 0  | 8     |
| Dogs Killed While Actively<br>Engaged in Hunting Activities  | 12      |          | 2   |   | 1   |    | 1     |
| Dogs Injured While Actively<br>Engaged in Hunting Activities | 2       |          | 1   |   |     |    |       |
| Dogs Killed While Not Engaged<br>in Hunting Activities       | 5       |          |     |   |     |    | 1     |
| Dogs Injured While Not<br>Engaged in Hunting Activities      |         | 1        |     |   |     |    |       |

|    | Α           | В           | C      | D | E | F | G  | Н     |
|----|-------------|-------------|--------|---|---|---|----|-------|
| 1  | 0           | 1           | 2      | 3 | 4 | 5 | 6  | 7     |
| 2  |             | Wolf Harves | t Zone |   |   |   |    | State |
| 3  |             | 1           | 2      | 3 | 4 | 5 | 6  | Total |
| 4  | Livestock   | Cases       |        |   |   |   |    |       |
| 5  | Confirme    | 28          | 2      | 6 | 1 | 5 | 8  | 50    |
| 6  | Confirmed   | 13          |        | 3 | 1 |   | 1  | 18    |
| 7  | Chronic Fa  | 18          | 1      | 4 |   | 1 |    | 24    |
| 8  | Total Farm  | 24          | 1      | 5 | 2 | 5 | 6  | 43    |
| 9  | Cattle Kill | 27          |        | 6 | 1 | 4 | 3  | 41    |
| 10 | Cattle Inju | 5           |        |   |   |   |    | 5     |
| 11 | Captive De  | eer Killed  | 4      |   |   |   |    | 4     |
| 12 | Captive De  | eer Injured |        |   |   |   |    | 0     |
| 13 | Sheep Kill  | 1           |        |   |   |   | 16 | 17    |
| 14 | Sheep Inju  | ired        |        |   |   |   |    | 0     |
| 15 | Goats Kille | ed          |        |   |   |   |    | 0     |
| 16 | Alpacas Ki  | lled        |        |   |   |   |    | 0     |
| 17 | Alpacas In  | jured       |        |   |   |   |    | 0     |
| 18 | Horses Kil  | 1           |        |   |   | 1 | 1  | 3     |
| 19 | Horses Inj  | ured        |        |   |   |   |    | 0     |
| 20 | Poultry Ki  | lled        |        |   |   |   |    | 0     |
| 21 | Non-Lives   | tock Cases  |        |   |   |   |    |       |
| 22 | Confirme    | 17          | 1      | 3 | 0 | 1 | 0  | 22    |
| 23 | Confirmed   | 4           | 0      | 0 | 1 | 0 | 0  | 5     |
| 24 | Dogs        | 12          |        | 2 |   | 1 |    | 15    |
| 25 | Dogs        | 2           |        | 1 |   |   |    | 3     |
| 26 | Dogs        | 5           |        |   |   |   |    | 5     |
| 27 | Dogs        |             | 1      |   |   |   |    | 1     |
| 20 |             |             |        |   |   |   |    |       |

### **Final Decision**

- Camelot
- Camelot's sample outputs provided better dataframes
- Speed is no issue (research project)
- Still potential issues with installing based upon
  OS
- Not perfect but will do

|    | А           | В        | C     | D       |  |
|----|-------------|----------|-------|---------|--|
| 1  | 0           | 1        | 2     | 3       |  |
| 2  | Cause of [  | Wolf Man | State | % of    |  |
| 3  |             | 1        | Total |         |  |
| 4  | Human       |          |       |         |  |
| 5  | Agency Co   | 52b      | 65    | 70.70%  |  |
| 6  | Vehicle Co  | 2        | 15    | 16.30%  |  |
| 7  | Illegally K | 4a*      | 9     | 9.80%   |  |
| 8  | Capture R   | 0        | 0     | 0.00%   |  |
| 9  | Total       | 58       |       | 96.70%  |  |
| 10 | Natural     |          |       |         |  |
| 11 | Disease /   | 0        | 0     | 0.00%   |  |
| 12 | Intra-      | 1        | 2     | 2.20%   |  |
| 13 | Euthaniz    | 0        | 0     | 0.00%   |  |
| 14 | Total       | 1        | 2     | 2.20%   |  |
| 15 | Unknown     | 0        | 1     | 1.10%   |  |
| 16 | Total       | 59       | 92    | 100.00% |  |
|    |             |          |       |         |  |

| Cause of Death               | Wolf Man | agemen | State | % of<br>Total |    |   |       |        |
|------------------------------|----------|--------|-------|---------------|----|---|-------|--------|
| TO SECURE A SECURE           | 1        | 2      | 3     | 4             | 5  | 6 | Total |        |
| Human Caused<br>Mortality    |          |        |       |               |    |   |       |        |
| Agency Control               | 52b      | 0      | 9     | 0             | 2  | 2 | 65    | 70.7%  |
| Vehicle Collision            | 2        | 41     | 0     | 0             | 5  | 4 | 15    | 16.3%  |
| Illegally Killed             | 41*      | 1      | 2*    | 0             | 1  | 1 | 9     | 9.8%   |
| Capture Related              | 0        | 0      | 0     | 0             | 0  | 0 | 0     | 0.0%   |
| Total Human<br>Caused        | 58       | 5      | 11    | 0             | 8  | 7 | 89    | 96.7%  |
| Natural<br>Mortality         |          |        |       |               |    |   |       |        |
| Disease / Injury             | 0        | 0      | 0     | 0             | 0  | 0 | 0     | 0.0%   |
| Intra-specific<br>Aggression | 1        | 0      | 1     | 0             | 0  | 0 | 2     | 2.2%   |
| Euthanized (non-<br>control) | 0        | 0      | 0     | 0             | 0  | 0 | 0     | 0.0%   |
| Total Natural<br>Causes      | 1        | 0      | 1     | 0             | 0  | 0 | 2     | 2.2%   |
| Unknown Causes               | 0        | 0      | 0     | 0             | 1= | 0 | 1     | 1.1%   |
| Total Detected<br>Mortality  | 59       | 5      | 13    | 0             | 9  | 7 | 92    | 100.0% |