Impact of Climate Change on Mountain Gorillas

Sarah Theriot

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Introduction:

Mountain gorillas (Gorilla beringei beringei) are critically endangered and face many serious threats, one being climate change. In this project, I will explore how climate change affects their populations, stress levels, and habitat use. By analyzing this data, I hope to understand these impacts and suggest ways to help protect these amazing animals. If we are able to identify specific causes to dwindling gorilla populations then we can come up with specific ways to help them.

Problem Statement:

One of the biggest issues gorillas face is loss of their habitat. This is directly causing their growing extinction. Loss of habitat happens for one of two reasons, deforestation and "natural causes" (i.e. environmental changes). These "natural causes" are unfortunately caused by climate change, which is caused by the increase in greenhouse gases. Therefore, when looking at this project it is important to look out for data that will give us a better insight into all of that.

Research Questions:

- 1. How do mountain gorillas use their habitat, and how has this changed in response to climate change?
- 2. What are the long-term environmental trends in the Democratic Republic of Congo (DRC)?
- 3. How do temperature and rainfall changes correlate with cortisol levels (stress) in gorillas?
- 4. What is the relationship between sodium acquisition (a dietary need) and stress levels?
- 5. How can these insights contribute to more effective conservation efforts?

Addressing the Problem Statement:

Approach:

I will analyze three different datasets:

- 1. Dataset on the social and ecological factors affecting mountain gorillas
- 2. Dataset on how mountain gorillas utilize their changing habitats to aquire neccessary sodium
- 3. Dataset on climate change throughout the years in the Democratic Republic of Congo

I hope that by using these datasets I may be able to discover patterns and trends in changes throughout the years. I also hope to point out why it is important to take climate change seriously and how loss of the mountain gorillas home could have detrimental effects to their species. This would be the very first step in a long research process and plan. I would start

```
# Required Packages:
library(dplyr)

## ## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':
## ## filter, lag

## The following objects are masked from 'package:base':
## intersect, setdiff, setequal, union

library(ggplot2)
library(readr)
library(readxl)
library(tidyr)
```

Data Analysis

Step 1: Load the Dataset

```
## Load the necessary datasets
stress_data <- read_csv("C:/Users/sarah/Desktop/MSDS/Statistics for Data Science/Final Project/Envir_Grg
## Rows: 1094 Columns: 23
## -- Column specification -------
## Delimiter: ","
## chr (5): Month, Gorilla, Group, Sex, GrpType
## dbl (18): Year, Age, HomeR70, HomeR70_excl, HomeR70_accum_overlap, HomeR_acc...
##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
habitat_data <- read_excel("C:/Users/sarah/Desktop/MSDS/Statistics for Data Science/Final Project/Sodius
## Warning: Expecting numeric in Q1705 / R1705C17: got 'NA'
## Warning: Expecting numeric in Q1706 / R1706C17: got 'NA'
## Warning: Expecting numeric in R1706 / R1706C18: got 'NA'
## Warning: Expecting numeric in R1706 / R1706C18: got 'NA'
## Warning: Expecting numeric in Q1707 / R1707C17: got 'NA'</pre>
```

```
## Warning: Expecting numeric in R1707 / R1707C18: got 'NA'
## Warning: Expecting numeric in Q1725 / R1725C17: got 'NA'
## Warning: Expecting numeric in R1725 / R1725C18: got 'NA'
## Warning: Expecting numeric in Q1726 / R1726C17: got 'NA'
## Warning: Expecting numeric in R1726 / R1726C18: got 'NA'
## Warning: Expecting numeric in Q1727 / R1727C17: got 'NA'
## Warning: Expecting numeric in R1727 / R1727C18: got 'NA'
## Warning: Expecting numeric in Q1728 / R1728C17: got 'NA'
## Warning: Expecting numeric in R1728 / R1728C18: got 'NA'
## Warning: Expecting numeric in Q1729 / R1729C17: got 'NA'
## Warning: Expecting numeric in R1729 / R1729C18: got 'NA'
## Warning: Expecting numeric in Q1730 / R1730C17: got 'NA'
## Warning: Expecting numeric in R1730 / R1730C18: got 'NA'
## Warning: Expecting numeric in Q1731 / R1731C17: got 'NA'
## Warning: Expecting numeric in R1731 / R1731C18: got 'NA'
## Warning: Expecting numeric in Q1732 / R1732C17: got 'NA'
## Warning: Expecting numeric in R1732 / R1732C18: got 'NA'
## Warning: Expecting numeric in Q1847 / R1847C17: got 'NA'
## Warning: Expecting numeric in R1847 / R1847C18: got 'NA'
## Warning: Expecting numeric in Q1848 / R1848C17: got 'NA'
## Warning: Expecting numeric in R1848 / R1848C18: got 'NA'
## Warning: Expecting numeric in Q1849 / R1849C17: got 'NA'
## Warning: Expecting numeric in R1849 / R1849C18: got 'NA'
## Warning: Expecting numeric in Q1850 / R1850C17: got 'NA'
```

```
## Warning: Expecting numeric in R1850 / R1850C18: got 'NA'
## Warning: Expecting numeric in Q1885 / R1885C17: got 'NA'
## Warning: Expecting numeric in R1885 / R1885C18: got 'NA'
## Warning: Expecting numeric in Q1886 / R1886C17: got 'NA'
## Warning: Expecting numeric in R1886 / R1886C18: got 'NA'
## Warning: Expecting numeric in Q1887 / R1887C17: got 'NA'
## Warning: Expecting numeric in R1887 / R1887C18: got 'NA'
## Warning: Expecting numeric in Q1888 / R1888C17: got 'NA'
## Warning: Expecting numeric in R1888 / R1888C18: got 'NA'
## Warning: Expecting numeric in Q1889 / R1889C17: got 'NA'
## Warning: Expecting numeric in R1889 / R1889C18: got 'NA'
## Warning: Expecting numeric in Q1890 / R1890C17: got 'NA'
## Warning: Expecting numeric in R1890 / R1890C18: got 'NA'
## Warning: Expecting numeric in Q1902 / R1902C17: got 'NA'
## Warning: Expecting numeric in R1902 / R1902C18: got 'NA'
## Warning: Expecting numeric in Q1903 / R1903C17: got 'NA'
## Warning: Expecting numeric in R1903 / R1903C18: got 'NA'
## Warning: Expecting numeric in Q1904 / R1904C17: got 'NA'
## Warning: Expecting numeric in R1904 / R1904C18: got 'NA'
## Warning: Expecting numeric in Q1922 / R1922C17: got 'NA'
## Warning: Expecting numeric in R1922 / R1922C18: got 'NA'
## Warning: Expecting numeric in Q1923 / R1923C17: got 'NA'
## Warning: Expecting numeric in R1923 / R1923C18: got 'NA'
## Warning: Expecting numeric in Q1924 / R1924C17: got 'NA'
```

```
## Warning: Expecting numeric in R1924 / R1924C18: got 'NA'
## Warning: Expecting numeric in Q1982 / R1982C17: got 'NA'
## Warning: Expecting numeric in R1982 / R1982C18: got 'NA'
## Warning: Expecting numeric in Q1983 / R1983C17: got 'NA'
## Warning: Expecting numeric in R1983 / R1983C18: got 'NA'
## Warning: Expecting numeric in Q1984 / R1984C17: got 'NA'
## Warning: Expecting numeric in R1984 / R1984C18: got 'NA'
## Warning: Expecting numeric in Q1985 / R1985C17: got 'NA'
## Warning: Expecting numeric in R1985 / R1985C18: got 'NA'
## Warning: Expecting numeric in Q1986 / R1986C17: got 'NA'
## Warning: Expecting numeric in R1986 / R1986C18: got 'NA'
## Warning: Expecting numeric in Q1987 / R1987C17: got 'NA'
## Warning: Expecting numeric in R1987 / R1987C18: got 'NA'
## Warning: Expecting numeric in Q1996 / R1996C17: got 'NA'
## Warning: Expecting numeric in R1996 / R1996C18: got 'NA'
## Warning: Expecting numeric in Q1997 / R1997C17: got 'NA'
## Warning: Expecting numeric in R1997 / R1997C18: got 'NA'
## Warning: Expecting numeric in Q1998 / R1998C17: got 'NA'
## Warning: Expecting numeric in R1998 / R1998C18: got 'NA'
## Warning: Expecting numeric in Q1999 / R1999C17: got 'NA'
## Warning: Expecting numeric in R1999 / R1999C18: got 'NA'
## Warning: Expecting numeric in Q2000 / R2000C17: got 'NA'
## Warning: Expecting numeric in R2000 / R2000C18: got 'NA'
## Warning: Expecting numeric in Q2001 / R2001C17: got 'NA'
```

```
## Warning: Expecting numeric in R2001 / R2001C18: got 'NA'
## Warning: Expecting numeric in Q2002 / R2002C17: got 'NA'
## Warning: Expecting numeric in R2002 / R2002C18: got 'NA'
## Warning: Expecting numeric in Q2025 / R2025C17: got 'NA'
## Warning: Expecting numeric in R2025 / R2025C18: got 'NA'
## Warning: Expecting numeric in Q2026 / R2026C17: got 'NA'
## Warning: Expecting numeric in R2026 / R2026C18: got 'NA'
## Warning: Expecting numeric in Q2027 / R2027C17: got 'NA'
## Warning: Expecting numeric in R2027 / R2027C18: got 'NA'
## Warning: Expecting numeric in Q2028 / R2028C17: got 'NA'
## Warning: Expecting numeric in R2028 / R2028C18: got 'NA'
## Warning: Expecting numeric in Q2040 / R2040C17: got 'NA'
## Warning: Expecting numeric in R2040 / R2040C18: got 'NA'
## Warning: Expecting numeric in Q2041 / R2041C17: got 'NA'
## Warning: Expecting numeric in R2041 / R2041C18: got 'NA'
## Warning: Expecting numeric in Q2042 / R2042C17: got 'NA'
## Warning: Expecting numeric in R2042 / R2042C18: got 'NA'
## Warning: Expecting numeric in Q2044 / R2044C17: got 'NA'
## Warning: Expecting numeric in R2044 / R2044C18: got 'NA'
## Warning: Expecting numeric in Q2045 / R2045C17: got 'NA'
## Warning: Expecting numeric in R2045 / R2045C18: got 'NA'
## Warning: Expecting numeric in Q2046 / R2046C17: got 'NA'
## Warning: Expecting numeric in R2046 / R2046C18: got 'NA'
## Warning: Expecting numeric in Q2060 / R2060C17: got 'NA'
```

```
## Warning: Expecting numeric in R2060 / R2060C18: got 'NA'
## Warning: Expecting numeric in Q2063 / R2063C17: got 'NA'
## Warning: Expecting numeric in R2063 / R2063C18: got 'NA'
## Warning: Expecting numeric in Q2112 / R2112C17: got 'NA'
## Warning: Expecting numeric in R2112 / R2112C18: got 'NA'
## Warning: Expecting numeric in Q2113 / R2113C17: got 'NA'
## Warning: Expecting numeric in R2113 / R2113C18: got 'NA'
## Warning: Expecting numeric in Q2114 / R2114C17: got 'NA'
## Warning: Expecting numeric in R2114 / R2114C18: got 'NA'
## Warning: Expecting numeric in Q2115 / R2115C17: got 'NA'
## Warning: Expecting numeric in R2115 / R2115C18: got 'NA'
## Warning: Expecting numeric in Q2116 / R2116C17: got 'NA'
## Warning: Expecting numeric in R2116 / R2116C18: got 'NA'
## Warning: Expecting numeric in Q2193 / R2193C17: got 'NA'
## Warning: Expecting numeric in R2193 / R2193C18: got 'NA'
## Warning: Expecting numeric in Q2194 / R2194C17: got 'NA'
## Warning: Expecting numeric in R2194 / R2194C18: got 'NA'
## Warning: Expecting numeric in Q2195 / R2195C17: got 'NA'
## Warning: Expecting numeric in R2195 / R2195C18: got 'NA'
## Warning: Expecting numeric in Q2269 / R2269C17: got 'NA'
## Warning: Expecting numeric in R2269 / R2269C18: got 'NA'
## Warning: Expecting numeric in Q2270 / R2270C17: got 'NA'
## Warning: Expecting numeric in R2270 / R2270C18: got 'NA'
## Warning: Expecting numeric in Q2271 / R2271C17: got 'NA'
```

```
## Warning: Expecting numeric in R2271 / R2271C18: got 'NA'
## Warning: Expecting numeric in Q2272 / R2272C17: got 'NA'
## Warning: Expecting numeric in R2272 / R2272C18: got 'NA'
## Warning: Expecting numeric in Q2273 / R2273C17: got 'NA'
## Warning: Expecting numeric in R2273 / R2273C18: got 'NA'
## Warning: Expecting numeric in Q2274 / R2274C17: got 'NA'
## Warning: Expecting numeric in R2274 / R2274C18: got 'NA'
## Warning: Expecting numeric in Q2275 / R2275C17: got 'NA'
## Warning: Expecting numeric in R2275 / R2275C18: got 'NA'
## Warning: Expecting numeric in Q2276 / R2276C17: got 'NA'
## Warning: Expecting numeric in R2276 / R2276C18: got 'NA'
## Warning: Expecting numeric in Q2277 / R2277C17: got 'NA'
## Warning: Expecting numeric in R2277 / R2277C18: got 'NA'
## Warning: Expecting numeric in Q2435 / R2435C17: got 'NA'
## Warning: Expecting numeric in R2435 / R2435C18: got 'NA'
## Warning: Expecting numeric in Q2436 / R2436C17: got 'NA'
## Warning: Expecting numeric in R2436 / R2436C18: got 'NA'
## Warning: Expecting numeric in Q2437 / R2437C17: got 'NA'
## Warning: Expecting numeric in R2437 / R2437C18: got 'NA'
## Warning: Expecting numeric in Q2438 / R2438C17: got 'NA'
## Warning: Expecting numeric in R2438 / R2438C18: got 'NA'
## Warning: Expecting numeric in Q2490 / R2490C17: got 'NA'
## Warning: Expecting numeric in R2490 / R2490C18: got 'NA'
## Warning: Expecting numeric in Q2491 / R2491C17: got 'NA'
## Warning: Expecting numeric in R2491 / R2491C18: got 'NA'
## Warning: Expecting numeric in Q2492 / R2492C17: got 'NA'
## Warning: Expecting numeric in R2492 / R2492C18: got 'NA'
```

```
## Warning: One or more parsing issues, call 'problems()' on your data frame for details,
## e.g.:
## dat <- vroom(...)
## problems(dat)

## Rows: 6 Columns: 34
## -- Column specification ------
## Delimiter: ","
## chr (2): Sector, unit
## dbl (32): 1990, 1991, 1992, 1993, 1994, 1995, 1996, 1997, 1998, 1999, 2000, ...
##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.</pre>
```

Step 2: Inspect and Clean Datasets

Check the first few rows and structure of the STRESS dataset

Inspect the Stress Dataset

str(stress_data)

```
head(stress data)
## # A tibble: 6 x 23
   Month Year Gorilla Group Sex
                                        Age HomeR70 HomeR70 excl
             <dbl> <chr> <chr> <chr> <dbl> <dbl>
    <chr>
                                                           <dbl>
## 1 September 2011 AFR
                           PAB F
                                       11.4
                                               964.
                                                            964.
                        PAB F
## 2 October 2011 AFR
                                       11.4
                                               359.
                                                            275.
## 3 November 2011 AFR
                         PAB F
                                       11.5 722.
                                                           520.
                           PAB F
## 4 December 2011 AFR
                                        11.6
                                               433.
                                                           429.
## 5 January
              2012 AFR
                           PAB F
                                        11.7
                                               558.
                                                            553.
## 6 February
             2012 AFR
                           PAB F
                                        11.8
                                               155.
                                                           155.
## # i 15 more variables: HomeR70_accum_overlap <dbl>,
      HomeR_accum_overlap_index <dbl>, N_Grp_HomeR70_overlap <dbl>,
      N_B_Total <dbl>, 'Mean_CORT_(ng/g)_B_Total' <dbl>,
      Monthly_rain_mm_Bisate <dbl>, Monthly_minTemp_IESA <dbl>,
      Monthly_maxTemp_IESA <dbl>, Monthly_Altitude <dbl>,
## #
      'Aud&Vis_Interactions_inclLSB' <dbl>,
      'Aud&Vis_Interactions_inclLSB_stressful' <dbl>, ...
```

```
## $ HomeR70 excl
                                            : num [1:1094] 964 275 520 429 553 ...
                                           : num [1:1094] 44.79 83.9 292.42 32.11 5.68 ...
## $ HomeR70_accum_overlap
## $ HomeR_accum_overlap_index
                                           : num [1:1094] 2.57e-09 7.61e-08 9.05e-08 2.17e-08 2.46e-09
## $ N_Grp_HomeR70_overlap
                                            : num [1:1094] 2 1 4 2 1 0 0 0 1 0 ...
## $ N_B_Total
                                            : num [1:1094] 4 8 3 3 4 4 4 3 3 5 ...
                                            : num [1:1094] 32.2 24.1 27.2 19.8 23.7 ...
## $ Mean_CORT_(ng/g)_B_Total
                                           : num [1:1094] 185.5 216.8 222.8 129.6 39.8 ...
## $ Monthly_rain_mm_Bisate
## $ Monthly_minTemp_IESA
                                            : num [1:1094] 10.7 10.5 10.7 10.7 7.9 8 9.3 9.1 9.3 10.4 .
## $ Monthly_maxTemp_IESA
                                            : num [1:1094] 20.9 20.8 21.3 21.8 23.6 23.2 23.1 21.8 21.9
## $ Monthly_Altitude
                                            : num [1:1094] 3398 3392 3098 3371 3347 ...
## $ Aud&Vis_Interactions_inclLSB
                                            : num [1:1094] 0 0 2 0 0 0 0 1 0 1 ...
## $ Aud&Vis_Interactions_inclLSB_stressful: num [1:1094] 0 0 2 0 0 0 0 1 0 1 ...
## $ Mean_GrpSize_mo_rounded
                                           : num [1:1094] 45 45 45 45 45 45 45 43 43 44 ...
## $ Mean_N_SB_mo_rounded
                                            : num [1:1094] 5 5 5 5 5 5 5 4 4 4 ...
## $ GrpType
                                           : chr [1:1094] "Multi-Male" "Multi-Male" "Multi-Male" "Multi
   $ Mean_N_AF_mo_rounded
                                            : num [1:1094] 12 13 13 13 13 13 13 13 13 ...
##
   - attr(*, "spec")=
##
     .. cols(
##
         Month = col_character(),
##
     . .
         Year = col_double(),
##
       Gorilla = col_character(),
##
     .. Group = col_character(),
##
        Sex = col_character(),
##
         Age = col_double(),
     . .
##
         HomeR70 = col_double(),
##
         HomeR70_excl = col_double(),
##
         HomeR70_accum_overlap = col_double(),
##
         HomeR_accum_overlap_index = col_double(),
     . .
##
         N_Grp_HomeR70_overlap = col_double(),
##
         N_B_Total = col_double(),
##
     . .
         'Mean_CORT_(ng/g)_B_Total' = col_double(),
##
         Monthly_rain_mm_Bisate = col_double(),
     . .
##
         Monthly_minTemp_IESA = col_double(),
##
         Monthly_maxTemp_IESA = col_double(),
##
         Monthly_Altitude = col_double(),
     . .
##
         'Aud&Vis_Interactions_inclLSB' = col_double(),
     . .
##
         'Aud&Vis_Interactions_inclLSB_stressful' = col_double(),
     . .
##
         Mean_GrpSize_mo_rounded = col_double(),
##
         Mean_N_SB_mo_rounded = col_double(),
     . .
##
         GrpType = col_character(),
         Mean_N_AF_mo_rounded = col_double()
     . .
##
   - attr(*, "problems")=<externalptr>
colnames(stress_data)
##
    [1] "Month"
   [2] "Year"
##
  [3] "Gorilla"
  [4] "Group"
##
##
   [5] "Sex"
##
  [6] "Age"
  [7] "HomeR70"
##
   [8] "HomeR70_excl"
##
```

```
## [9] "HomeR70_accum_overlap"
## [10] "HomeR_accum_overlap_index"
## [11] "N_Grp_HomeR70_overlap"
## [12] "N_B_Total"
## [13] "Mean_CORT_(ng/g)_B_Total"
## [14] "Monthly_rain_mm_Bisate"
## [15] "Monthly_minTemp_IESA"
## [16] "Monthly_maxTemp_IESA"
## [17] "Monthly_Altitude"
## [18] "Aud&Vis_Interactions_inclLSB"
## [19] "Aud&Vis_Interactions_inclLSB_stressful"
## [20] "Mean_GrpSize_mo_rounded"
## [21] "Mean_N_SB_mo_rounded"
## [22] "GrpType"
## [23] "Mean_N_AF_mo_rounded"
```

Inspect the Habitat Dataset

```
# Check the first few rows and structure of the HABITAT dataset
head(habitat_data)
```

```
## # A tibble: 6 x 18
      resp habitat z.rank z.group_size repr.state z.daily.time log.duration
     <dbl> <chr>
                    <dbl> <dbl> <chr>
                                                        <dbl>
                                                                    <dbl>
                                                        -1.29
## 1 -2.63 Hagenia -0.268
                               -1.09 lac
                                                                    -5.19
## 2 -1.73 Hagenia -0.268
                                                       -1.29
                                -1.09 lac
                                                                    -4.86
                                -1.09 lac
## 3 0.402 Hagenia -0.268
                                                       -1.29
                                                                    -2.79
## 4 -2.44 Hagenia -0.268
                                -1.09 lac
                                                       -1.29
                                                                    -3.47
## 5 -1.11 Hagenia -0.268
                                -1.09 lac
                                                        -1.29
                                                                    -4.24
## 6 -1.53 Hagenia -0.268
                                -1.09 lac
                                                        -1.29
                                                                    -3.43
## # i 11 more variables: ac.term <dbl>, focal <chr>, group <chr>, date <dbl>,
      habitat.b <dbl>, habitat.c <dbl>, habitat.d <dbl>, habitat.e <dbl>,
      habitat.f <dbl>, repr.state.b <dbl>, repr.state.c <dbl>
```

str(habitat_data)

```
## tibble [3,565 x 18] (S3: tbl_df/tbl/data.frame)
                : num [1:3565] -2.632 -1.731 0.402 -2.436 -1.11 ...
## $ resp
                : chr [1:3565] "Hagenia" "Hagenia" "Hagenia" "Hagenia" ...
## $ habitat
                : num [1:3565] -0.268 -0.268 -0.268 -0.268 ...
## $ z.group_size: num [1:3565] -1.09 -1.09 -1.09 -1.09 -1.09 ...
   $ repr.state : chr [1:3565] "lac" "lac" "lac" "lac" "lac" ...
## $ z.daily.time: num [1:3565] -1.29 -1.29 -1.29 -1.29 -1.29 ...
## $ log.duration: num [1:3565] -5.19 -4.86 -2.79 -3.47 -4.24 ...
                : num [1:3565] 0.418 0.318 0.245 0.606 0.299 ...
## $ ac.term
## $ focal
                : chr [1:3565] "GIN" "GIN" "GIN" "GIN" ...
## $ group
                : chr [1:3565] "BWE" "BWE" "BWE" "BWE" ...
                : num [1:3565] 40100 40100 40100 40100 40100 40100 40100 40100 40100 40100 ...
## $ date
## $ habitat.b : num [1:3565] 0 0 0 0 0 0 0 0 0 0 ...
## $ habitat.c : num [1:3565] 0 0 0 0 0 0 0 0 0 ...
## $ habitat.d : num [1:3565] 1 1 1 1 1 1 1 1 1 1 ...
```

```
## $ habitat.e : num [1:3565] 0 0 0 0 0 0 0 0 0 0 0 ...
## $ habitat.f : num [1:3565] 0 0 0 0 0 0 0 0 0 0 ...
## $ repr.state.b: num [1:3565] 1 1 1 1 1 1 1 1 1 1 1 1 ...
## $ repr.state.c: num [1:3565] 0 0 0 0 0 0 0 0 0 0 ...
```

Inspect Emissions Dataset

```
# Check the first few rows and structure of the EMISSIONS dataset head(emissions_data)
```

```
## # A tibble: 6 x 34
               unit '1990' '1991' '1992' '1993' '1994' '1995' '1996' '1997' '1998'
##
     Sector
##
     <chr>>
               <chr> <dbl>
                             <dbl>
                                     <dbl>
                                            <dbl>
                                                   <dbl>
                                                           <dbl>
                                                                  <dbl>
## 1 Energy
               MtCO~
                       6.83
                               5.48
                                      5.26
                                             6.44
                                                    7.59
                                                            7.56
                                                                   8.11
                                                                          8.29
                                                                                 8.18
## 2 Industri~ MtCO~
                       0.22
                               0.14
                                      0.12
                                             0.12
                                                    0.14
                                                            0.18
                                                                   0.23
                                                                          0.23
                                                                                 0.28
                                            25.0
## 3 Agricult~ MtCO~ 25.1
                              24.9
                                     25.0
                                                   24.9
                                                           24.7
                                                                  19.4
                                                                         19.0
                                                                                19.9
## 4 Waste
               MtCO~
                       6.22
                               6.46
                                      6.7
                                             6.93
                                                    7.17
                                                            7.4
                                                                   7.62
                                                                          7.84
                                                                                 8.07
## 5 Land-Use~ MtCO~ 398.
                             398.
                                    398.
                                           398.
                                                  398.
                                                          398.
                                                                 393.
                                                                        400.
                                                                               401.
## 6 Data sou~ Clim~ NA
                              NA
                                     NA
                                            NA
                                                   NA
                                                           NA
                                                                  NA
                                                                         NA
## # i 23 more variables: '1999' <dbl>, '2000' <dbl>, '2001' <dbl>, '2002' <dbl>,
       '2003' <dbl>, '2004' <dbl>, '2005' <dbl>, '2006' <dbl>, '2007' <dbl>,
       '2008' <dbl>, '2009' <dbl>, '2010' <dbl>, '2011' <dbl>, '2012' <dbl>,
## #
       '2013' <dbl>, '2014' <dbl>, '2015' <dbl>, '2016' <dbl>, '2017' <dbl>,
       '2018' <dbl>, '2019' <dbl>, '2020' <dbl>, '2021' <dbl>
## #
```

str(emissions_data)

```
## spc_tbl_ [6 x 34] (S3: spec_tbl_df/tbl_df/tbl/data.frame)
## $ Sector: chr [1:6] "Energy" "Industrial Processes" "Agriculture" "Waste" ...
## $ unit : chr [1:6] "MtCO2e" "MtCO2e" "MtCO2e" "MtCO2e" ...
## $ 1990 : num [1:6] 6.83 0.22 25.13 6.22 398.44 ...
           : num [1:6] 5.48 0.14 24.94 6.46 398.44 ...
          : num [1:6] 5.26 0.12 25.05 6.7 398.44 ...
  $ 1992
   $ 1993
           : num [1:6] 6.44 0.12 24.95 6.93 398.44 ...
   $ 1994 : num [1:6] 7.59 0.14 24.89 7.17 398.44 ...
##
   $ 1995 : num [1:6] 7.56 0.18 24.73 7.4 398.44 ...
           : num [1:6] 8.11 0.23 19.43 7.62 393.27 ...
##
   $ 1996
           : num [1:6] 8.29 0.23 18.99 7.84 399.94 ...
   $ 1997
   $ 1998
          : num [1:6] 8.18 0.28 19.87 8.07 400.82 ...
   $ 1999 : num [1:6] 7.87 0.34 18.07 8.29 394.81 ...
   $ 2000 : num [1:6] 7.33 0.39 17.7 8.53 391.68 ...
##
##
   $ 2001 : num [1:6] 7.52 0.43 18.93 8.76 386.89 ...
##
   $ 2002 : num [1:6] 7.65 0.47 23.92 9.02 396.01 ...
  $ 2003 : num [1:6] 8.44 0.52 26.21 9.35 400.2 ...
           : num [1:6] 8.33 0.56 28.08 9.63 401.98 ...
##
   $ 2004
   $ 2005
          : num [1:6] 8.57 0.63 27.44 9.92 401.77 ...
  $ 2006
          : num [1:6] 8.74 0.7 28.11 10.26 402.28 ...
  $ 2007 : num [1:6] 9.25 0.78 24.73 10.61 396.67 ...
   $ 2008
           : num [1:6] 9.46 0.81 26.05 10.95 400.39 ...
   $ 2009 : num [1:6] 9.37 0.91 25.84 11.29 400.04 ...
   $ 2010 : num [1:6] 9.54 1 27.22 11.64 402.16 ...
```

```
$ 2011 : num [1:6] 10.1 1.14 25.52 12.04 638.39 ...
##
    $ 2012 : num [1:6] 8.26 1.27 24.89 12.45 635.5 ...
   $ 2013 : num [1:6] 10.06 1.44 26.48 12.86 634.89 ...
           : num [1:6] 12.12 1.54 25.81 13.26 632.09 ...
##
   $ 2014
##
    $ 2015
            : num [1:6] 10.33 1.72 26.86 13.67 633.61 ...
##
    $ 2016
           : num [1:6] 9.71 1.84 27.01 14.13 633.41 ...
            : num [1:6] 10.75 2.27 27.72 14.6 633.9 ...
            : num [1:6] 9.55 2.55 26.22 15.07 629.08 ...
##
    $ 2018
##
    $ 2019
            : num [1:6] 9.95 2.81 26.9 15.54 632.42 ...
##
    $ 2020
           : num [1:6] 10.25 2.95 27.25 16 631.36 ...
    $ 2021
           : num [1:6] 10.24 3.19 27.82 16.54 629.44 ...
   - attr(*, "spec")=
##
##
     .. cols(
##
          Sector = col_character(),
##
          unit = col_character(),
          '1990' = col_double(),
##
     . .
##
          '1991' = col_double(),
     . .
          '1992' = col double(),
##
     . .
          '1993' = col_double(),
##
##
     . .
          '1994' = col_double(),
##
          '1995' = col_double(),
##
          '1996' = col double(),
     . .
          '1997' = col_double(),
##
     . .
##
          '1998' = col double(),
     . .
##
          '1999' = col_double(),
##
          '2000' = col_double(),
     . .
          '2001' = col_double(),
##
##
          '2002' = col_double(),
     . .
##
          '2003' = col_double(),
     . .
          '2004' = col_double(),
##
     . .
          '2005' = col_double(),
##
     . .
##
          '2006' = col_double(),
     . .
          '2007' = col_double(),
##
     . .
          '2008' = col_double(),
##
          '2009' = col double(),
##
     . .
##
          '2010' = col_double(),
     . .
##
     . .
          '2011' = col double(),
##
          '2012' = col_double(),
     . .
          '2013' = col_double(),
##
     . .
          '2014' = col_double(),
##
##
          '2015' = col double(),
     . .
          '2016' = col_double(),
##
          '2017' = col_double(),
##
     . .
##
          '2018' = col_double(),
     . .
##
          '2019' = col_double(),
     . .
          '2020' = col_double(),
##
     . .
##
          '2021' = col_double()
     . .
##
     ..)
   - attr(*, "problems")=<externalptr>
```

Clean the Stress Dataset

Check for NA's summary(stress_data)

```
##
                                         Gorilla
       Month
                             Year
                                                              Group
##
    Length: 1094
                               :2011
                                       Length: 1094
                                                           Length: 1094
                       Min.
##
    Class : character
                        1st Qu.:2011
                                       Class : character
                                                           Class :character
##
    Mode :character
                        Median:2012
                                       Mode :character
                                                           Mode :character
                               :2012
##
                        Mean
##
                        3rd Qu.:2012
##
                        Max.
                               :2012
##
        Sex
                             Age
                                           HomeR70
                                                            HomeR70_excl
    Length: 1094
                       Min.
                               : 0.93
                                        Min.
                                                                 :
                                                                      0.00
##
                                              : 21.15
                                                           Min.
                        1st Qu.: 5.07
                                        1st Qu.: 137.46
                                                           1st Qu.: 58.53
##
    Class : character
##
    Mode :character
                        Median :12.54
                                        Median: 201.17
                                                           Median: 111.16
##
                        Mean
                               :13.17
                                        Mean
                                               : 266.40
                                                                  : 161.98
                                                           Mean
##
                       3rd Qu.:19.30
                                        3rd Qu.: 359.24
                                                           3rd Qu.: 196.31
##
                       Max.
                               :33.97
                                        Max.
                                                :1293.33
                                                           Max.
                                                                  :1230.78
    HomeR70_accum_overlap HomeR_accum_overlap_index N_Grp_HomeR70_overlap
##
##
    Min.
         :
               0.00
                          Min.
                                  :0.000e+00
                                                     Min.
                                                            :0.000
##
    1st Qu.: 44.79
                          1st Qu.:4.095e-08
                                                     1st Qu.:2.000
    Median: 121.44
                          Median :2.390e-07
                                                     Median :4.000
##
##
    Mean
          : 282.12
                          Mean
                                  :2.344e-07
                                                     Mean
                                                             :3.204
##
    3rd Qu.: 403.39
                           3rd Qu.:3.720e-07
                                                     3rd Qu.:5.000
##
    Max.
           :1959.35
                          Max.
                                  :1.030e-06
                                                     Max.
                                                             :7.000
                     Mean_CORT_(ng/g)_B_Total Monthly_rain_mm_Bisate
##
      N_B_Total
##
    Min. : 3.000
                            : 9.341
                     Min.
                                               Min.
                                                      : 10.5
    1st Qu.: 3.000
                     1st Qu.: 20.804
                                               1st Qu.:120.4
##
    Median : 4.000
                     Median: 25.050
                                               Median :157.6
##
    Mean
          : 4.037
                            : 26.698
                                                       :158.9
                     Mean
                                               Mean
##
    3rd Qu.: 5.000
                     3rd Qu.: 29.880
                                               3rd Qu.:208.6
##
    Max.
           :11.000
                             :102.085
                                               Max.
                                                       :340.3
                     Max.
##
    Monthly_minTemp_IESA Monthly_maxTemp_IESA Monthly_Altitude
##
    Min.
           : 7.900
                         Min.
                                 :19.80
                                               Min.
                                                       :2852
##
    1st Qu.: 9.300
                         1st Qu.:20.80
                                               1st Qu.:2944
                                               Median:3038
    Median :10.400
                         Median :21.80
          : 9.871
                                 :21.72
                                                       :3090
##
    Mean
                         Mean
                                               Mean
##
    3rd Qu.:10.700
                         3rd Qu.:22.10
                                               3rd Qu.:3188
##
   {\tt Max.}
           :11.100
                         Max.
                                 :23.60
                                               Max.
                                                       :3651
    Aud&Vis_Interactions_inclLSB Aud&Vis_Interactions_inclLSB_stressful
##
    Min.
           :0.0000
                                  Min.
                                         :0.0000
##
    1st Qu.:0.0000
                                  1st Qu.:0.0000
##
    Median :0.0000
                                  Median :0.0000
##
                                        :0.5969
   Mean
           :0.7157
                                  Mean
##
    3rd Qu.:1.0000
                                  3rd Qu.:1.0000
##
    Max.
           :5.0000
                                  Max.
                                         :5.0000
    Mean_GrpSize_mo_rounded Mean_N_SB_mo_rounded
                                                     GrpType
          : 3.00
##
  Min.
                             Min.
                                    :1.000
                                                  Length: 1094
##
    1st Qu.: 9.00
                             1st Qu.:2.000
                                                  Class : character
##
   Median :11.00
                             Median :2.000
                                                  Mode :character
   Mean :17.34
                             Mean :2.509
##
    3rd Qu.:14.00
                             3rd Qu.:3.000
```

```
##
    Max.
           :47.00
                             Max.
                                     :6.000
##
    Mean_N_AF_mo_rounded
           : 1.000
    Min.
    1st Qu.: 3.000
##
##
    Median : 5.000
##
   Mean
           : 5.825
    3rd Qu.: 6.000
##
   Max.
           :13.000
sum(is.na(stress_data))
```

[1] 0

Clean the Habitat Dataset

```
# Check for NA's
summary(habitat_data)
```

```
##
                         habitat
                                                                z.group_size
         resp
                                                z.rank
##
    Min.
           :-4.3621
                       Length: 3565
                                           Min.
                                                   :-1.4602
                                                                      :-1.2222
                                                               1st Qu.:-1.0893
    1st Qu.:-1.5734
                                           1st Qu.:-0.8639
##
                       Class : character
##
    Median :-0.6579
                       Mode : character
                                           Median :-0.1037
                                                               Median: 0.9038
##
    Mean
           :-0.6408
                                           Mean
                                                   : 0.0000
                                                               Mean
                                                                      : 0.0000
##
    3rd Qu.: 0.1148
                                           3rd Qu.: 0.7757
                                                               3rd Qu.: 0.9038
           : 6.3994
                                                   : 1.5210
##
    Max.
                                           Max.
                                                               Max.
                                                                      : 1.0366
##
##
                         z.daily.time
     repr.state
                                              log.duration
                                                                  ac.term
    Length:3565
                               :-2.26842
                                                    :-6.802
                                                                      :-8.045272
##
                        Min.
                                            Min.
                                                               Min.
##
    Class : character
                        1st Qu.:-0.78042
                                            1st Qu.:-4.128
                                                               1st Qu.:-0.500168
                        Median: 0.02284
                                            Median :-3.507
                                                               Median :-0.002277
##
    Mode : character
##
                        Mean
                                : 0.00000
                                            Mean
                                                    :-3.506
                                                               Mean
                                                                      : 0.000000
##
                        3rd Qu.: 0.77343
                                            3rd Qu.:-2.856
                                                               3rd Qu.: 0.463325
##
                        Max.
                                : 2.93301
                                                    :-1.017
                                                                      : 8.277364
                                            Max.
                                                               Max.
##
##
       focal
                           group
                                                  date
                                                                habitat.b
##
    Length:3565
                        Length: 3565
                                            Min.
                                                    :40095
                                                              Min.
                                                                     :0.0000
##
    Class : character
                        Class : character
                                             1st Qu.:40221
                                                              1st Qu.:0.0000
##
                                            Median :40339
                                                              Median :0.0000
    Mode :character
                        Mode :character
##
                                            Mean
                                                    :40327
                                                              Mean
                                                                     :0.1481
##
                                            3rd Qu.:40437
                                                              3rd Qu.:0.0000
##
                                            Max.
                                                    :40540
                                                                     :1.0000
                                                              Max.
##
##
      habitat.c
                         habitat.d
                                           habitat.e
                                                              habitat.f
                                                                   :0.0000
           :0.00000
                               :0.0000
                                                 :0.0000
##
    Min.
                       Min.
                                         Min.
                                                           Min.
##
    1st Qu.:0.00000
                       1st Qu.:0.0000
                                         1st Qu.:0.0000
                                                            1st Qu.:0.0000
    Median :0.00000
                       Median :0.0000
                                         Median :0.0000
##
                                                           Median :0.0000
##
    Mean
           :0.01178
                       Mean
                               :0.3495
                                         Mean
                                                 :0.2376
                                                           Mean
                                                                   :0.2432
                       3rd Qu.:1.0000
##
    3rd Qu.:0.00000
                                         3rd Qu.:0.0000
                                                            3rd Qu.:0.0000
##
    Max.
           :1.00000
                       Max.
                               :1.0000
                                         Max.
                                                 :1.0000
                                                           Max.
                                                                   :1.0000
##
##
     repr.state.b
                       repr.state.c
```

```
Min.
           :0.0000
                     Min.
                             :0.0000
    1st Qu.:0.0000
                     1st Qu.:0.0000
##
  Median :1.0000
                     Median :0.0000
  Mean
           :0.5646
                             :0.1863
##
                     Mean
##
    3rd Qu.:1.0000
                     3rd Qu.:0.0000
           :1.0000
##
  {\tt Max.}
                             :1.0000
                     {\tt Max.}
   NA's
           :76
                     NA's
                             :76
sum(is.na(habitat_data))
## [1] 152
# Identify which columns have NA's
colSums(is.na(habitat_data))
##
                     habitat
                                    z.rank z.group_size
                                                           repr.state z.daily.time
           resp
##
                                         0
                            0
                                                       0
                                                                    0
## log.duration
                     ac.term
                                     focal
                                                                 date
                                                                          habitat.b
                                                   group
##
                            0
                                         0
                                                       0
                                                                    0
##
      habitat.c
                   habitat.d
                                 habitat.e
                                              habitat.f repr.state.b repr.state.c
##
              0
                            0
                                         0
                                                       0
                                                                   76
# Delete columns repr.state (reproductive state)
# We have chosen to delete these columns due to the missing (NA) values. While there are risks to remov
habitat_data <- habitat_data[ , !names(habitat_data) %in% c("repr.state.b", "repr.state.c")]
# Verify those column names are deleted
colnames(habitat_data)
    [1] "resp"
                        "habitat"
                                       "z.rank"
                                                       "z.group_size" "repr.state"
   [6] "z.daily.time" "log.duration" "ac.term"
                                                       "focal"
                                                                       "group"
                                                                       "habitat.e"
## [11] "date"
                        "habitat.b"
                                       "habitat.c"
                                                       "habitat.d"
## [16] "habitat.f"
Clean the Emissions Dataset
# Check for NA's
summary(emissions_data)
##
       Sector
                            unit
                                                 1990
                                                                  1991
    Length:6
                       Length:6
                                           Min.
                                                   : 0.22
                                                                    : 0.14
                                                             1st Qu.: 5.48
    Class :character
                       Class :character
                                           1st Qu.: 6.22
```

```
##
   Mode :character
                       Mode :character
                                          Median: 6.83
                                                           Median: 6.46
                                                                : 87.09
##
                                          Mean
                                                : 87.37
                                                           Mean
##
                                          3rd Qu.: 25.13
                                                           3rd Qu.: 24.94
                                                 :398.44
##
                                          Max.
                                                           Max.
                                                                  :398.44
##
                                          NA's
                                                 :1
                                                           NA's
                                                                  :1
##
         1992
                          1993
                                           1994
                                                            1995
                            : 0.12
          : 0.12
                    Min.
                                     Min.
                                            : 0.14
                                                       Min.
                                                              : 0.18
                                     1st Qu.: 7.17
                    1st Qu.: 6.44
                                                       1st Qu.: 7.40
   1st Qu.: 5.26
```

```
Median: 6.70
                   Median: 6.93
                                    Median: 7.59
                                                    Median: 7.56
                   Mean : 87.38
                                                    Mean : 87.66
##
   Mean : 87.11
                                    Mean : 87.65
   3rd Qu.: 25.05
                    3rd Qu.: 24.95
                                    3rd Qu.: 24.89
                                                    3rd Qu.: 24.73
   Max. :398.44
                                    Max. :398.44
                   Max. :398.44
                                                    Max. :398.44
##
   NA's
##
         :1
                    NA's
                         :1
                                    NA's
                                          :1
                                                    NA's
                                                          : 1
##
        1996
                       1997
                                        1998
                                                        1999
   Min. : 0.23
                                    Min. : 0.28
                   Min. : 0.23
                                                    Min. : 0.34
   1st Qu.: 7.62
                    1st Qu.: 7.84
                                    1st Qu.: 8.07
                                                    1st Qu.: 7.87
##
##
   Median: 8.11
                    Median: 8.29
                                    Median: 8.18
                                                    Median: 8.29
##
   Mean : 85.73
                    Mean : 87.06
                                    Mean : 87.44
                                                    Mean : 85.88
   3rd Qu.: 19.43
                    3rd Qu.: 18.99
                                    3rd Qu.: 19.87
                                                    3rd Qu.: 18.07
   Max. :393.27
                    Max. :399.94
                                    Max. :400.82
                                                    Max. :394.81
##
##
   NA's
         :1
                    NA's
                         :1
                                    NA's :1
                                                    NA's
                                                          :1
##
        2000
                        2001
                                        2002
                                                         2003
##
   Min. : 0.39
                   Min. : 0.43
                                    Min. : 0.47
                                                    Min. : 0.52
##
   1st Qu.: 7.33
                    1st Qu.: 7.52
                                    1st Qu.: 7.65
                                                    1st Qu.: 8.44
                    Median: 8.76
                                                    Median: 9.35
##
   Median: 8.53
                                    Median: 9.02
##
   Mean : 85.13
                    Mean : 84.51
                                    Mean : 87.41
                                                    Mean : 88.94
                                    3rd Qu.: 23.92
                    3rd Qu.: 18.93
##
   3rd Qu.: 17.70
                                                    3rd Qu.: 26.21
##
   Max. :391.68
                   Max. :386.89
                                    Max. :396.01
                                                    Max. :400.20
                                    NA's :1
                                                    NA's :1
##
   NA's
         :1
                    NA's
                         :1
##
        2004
                        2005
                                        2006
                                                         2007
   Min. : 0.56
                   Min. : 0.63
                                    Min. : 0.70
                                                    Min. : 0.78
##
   1st Qu.: 8.33
                    1st Qu.: 8.57
                                    1st Qu.: 8.74
                                                    1st Qu.: 9.25
##
##
   Median: 9.63
                    Median: 9.92
                                    Median : 10.26
                                                    Median : 10.61
   Mean : 89.72
                    Mean : 89.67
                                    Mean : 90.02
                                                    Mean : 88.41
##
   3rd Qu.: 28.08
                    3rd Qu.: 27.44
                                    3rd Qu.: 28.11
                                                    3rd Qu.: 24.73
   Max. :401.98
                    Max. :401.77
                                    Max. :402.28
##
                                                    Max. :396.67
   NA's :1
                    NA's :1
                                    NA's :1
                                                    NA's :1
##
                        2009
##
        2008
                                        2010
                                                         2011
##
   Min. : 0.81
                    Min. : 0.91
                                    Min. : 1.00
                                                    Min. : 1.14
##
   1st Qu.: 9.46
                    1st Qu.: 9.37
                                    1st Qu.: 9.54
                                                    1st Qu.: 10.10
##
   Median : 10.95
                    Median: 11.29
                                    Median: 11.64
                                                    Median: 12.04
   Mean : 89.53
                    Mean : 89.49
                                    Mean : 90.31
                                                    Mean :137.44
##
##
   3rd Qu.: 26.05
                    3rd Qu.: 25.84
                                    3rd Qu.: 27.22
                                                    3rd Qu.: 25.52
##
   Max. :400.39
                   Max. :400.04
                                    Max. :402.16
                                                    Max. :638.39
##
   NA's :1
                    NA's :1
                                    NA's :1
                                                    NA's :1
##
        2012
                        2013
                                        2014
                                                         2015
   Min. : 1.27
                   Min. : 1.44
                                    Min. : 1.54
                                                    Min. : 1.72
##
   1st Qu.: 8.26
                    1st Qu.: 10.06
                                    1st Qu.: 12.12
                                                    1st Qu.: 10.33
##
   Median : 12.45
                    Median: 12.86
                                                    Median: 13.67
                                    Median : 13.26
##
   Mean :136.47
                   Mean :137.15
                                    Mean :136.96
                                                    Mean :137.24
   3rd Qu.: 24.89
                    3rd Qu.: 26.48
                                                    3rd Qu.: 26.86
##
                                    3rd Qu.: 25.81
##
   Max.
        :635.50
                    Max. :634.89
                                    Max. :632.09
                                                    Max. :633.61
##
   NA's :1
                    NA's :1
                                    NA's :1
                                                    NA's :1
                        2017
                                        2018
##
        2016
                                                         2019
                   Min. : 2.27
##
   Min. : 1.84
                                    Min. : 2.55
                                                    Min.
                                                          : 2.81
   1st Qu.: 9.71
                    1st Qu.: 10.75
                                    1st Qu.: 9.55
                                                    1st Qu.: 9.95
   Median : 14.13
                    Median: 14.60
                                    Median: 15.07
                                                    Median: 15.54
##
   Mean :137.22
                    Mean :137.85
                                    Mean :136.49
                                                    Mean :137.52
##
   3rd Qu.: 27.01
                    3rd Qu.: 27.72
                                    3rd Qu.: 26.22
                                                    3rd Qu.: 26.90
##
   Max.
         :633.41
                   Max. :633.90
                                    Max. :629.08
                                                    Max.
                                                         :632.42
                   NA's :1
##
   NA's
         : 1
                                    NA's
                                          :1
                                                    NA's
                                                           : 1
                        2021
##
        2020
```

```
## Min. : 2.95
                   Min. : 3.19
## 1st Qu.: 10.25
                   1st Qu.: 10.24
## Median : 16.00
                   Median: 16.54
         :137.56
## Mean
                         :137.45
                   Mean
## 3rd Qu.: 27.25
                   3rd Qu.: 27.82
          :631.36
                          :629.44
## Max.
                   Max.
## NA's
                   NA's
          :1
                          :1
sum(is.na(emissions_data))
```

[1] 32

Step 3: Condense the Data

Condense the Stress Dataset

Condense the Habitat Dataset

```
clean_habitat_data <- habitat_data %>%
    distinct() %>%
    filter(!is.na(resp)) %>%
    select(resp, habitat, z.rank, z.group_size, z.daily.time, log.duration, focal, group, date, habitat.b
# View summary
glimpse(clean_habitat_data)
```

```
## Rows: 3,563
## Columns: 14
## $ resp
                                          <dbl> -2.6316206, -1.7305311, 0.4024652, -2.4362103, -1.1095561~
                                           <chr> "Hagenia", "Hagenia", "Hagenia", "Hagenia", "Hagenia", "H~
## $ habitat
                                           <dbl> -0.2676756, -0.2676756, -0.2676756, -0.2676756, -0.267675~
## $ z.rank
## $ z.group size <dbl> -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282, -1.089282
## $ log.duration <dbl> -5.192957, -4.856485, -2.790526, -3.470190, -4.237445, -3~
                                          <chr> "GIN", "GIN", "GIN", "GIN", "GIN", "GIN", "GIN", "GIN", "~
## $ focal
                                          <chr> "BWE", "BWE", "BWE", "BWE", "BWE", "BWE", "BWE", "~
## $ group
## $ date
                                          <dbl> 40100, 40100, 40100, 40100, 40100, 40100, 40100, 40100, 4~
                                          ## $ habitat.b
## $ habitat.c
                                          ## $ habitat.d
## $ habitat.e
                                          ## $ habitat.f
```

Condense the Emissions Dataset

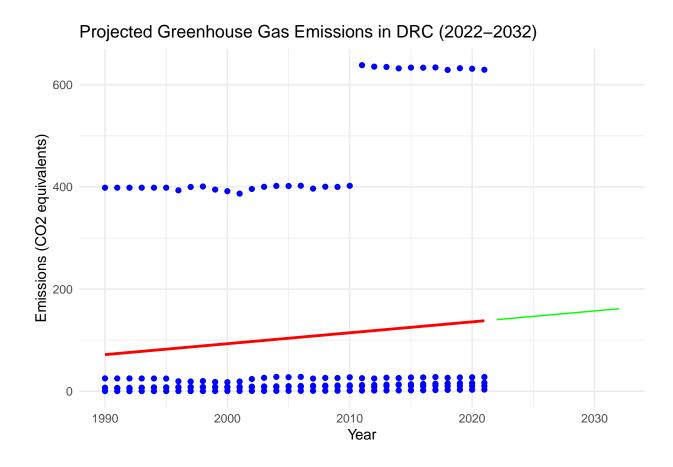
```
## Rows: 6
## Columns: 34
## $ Sector <chr> "Energy", "Industrial Processes", "Agriculture", "Waste", "Land~
## $ unit <chr> "MtCO2e", "MtCO2e", "MtCO2e", "MtCO2e", "MtCO2e", "Climate Watc~
## $ '1990' <dbl> 6.83, 0.22, 25.13, 6.22, 398.44, NA
## $ '1991' <dbl> 5.48, 0.14, 24.94, 6.46, 398.44, NA
## $ '1992' <dbl> 5.26, 0.12, 25.05, 6.70, 398.44, NA
## $ '1993' <dbl> 6.44, 0.12, 24.95, 6.93, 398.44, NA
## $ '1994' <dbl> 7.59, 0.14, 24.89, 7.17, 398.44, NA
## $ '1995' <dbl> 7.56, 0.18, 24.73, 7.40, 398.44, NA
## $ '1996' <dbl> 8.11, 0.23, 19.43, 7.62, 393.27, NA
## $ '1997' <dbl> 8.29, 0.23, 18.99, 7.84, 399.94, NA
## $ '1998' <dbl> 8.18, 0.28, 19.87, 8.07, 400.82, NA
## $ '1999' <dbl> 7.87, 0.34, 18.07, 8.29, 394.81, NA
## $ '2000' <dbl> 7.33, 0.39, 17.70, 8.53, 391.68, NA
## $ '2001' <dbl> 7.52, 0.43, 18.93, 8.76, 386.89, NA
## $ '2002' <dbl> 7.65, 0.47, 23.92, 9.02, 396.01, NA
## $ '2003' <dbl> 8.44, 0.52, 26.21, 9.35, 400.20, NA
## $ '2004' <dbl> 8.33, 0.56, 28.08, 9.63, 401.98, NA
## $ '2005' <dbl> 8.57, 0.63, 27.44, 9.92, 401.77, NA
## $ '2006' <dbl> 8.74, 0.70, 28.11, 10.26, 402.28, NA
```

```
## $ '2007' <dbl> 9.25, 0.78, 24.73, 10.61, 396.67, NA
## $ '2008' <dbl> 9.46, 0.81, 26.05, 10.95, 400.39, NA
## $ '2009' <dbl> 9.37, 0.91, 25.84, 11.29, 400.04, NA
## $ '2010' <dbl> 9.54, 1.00, 27.22, 11.64, 402.16, NA
## $ '2011' <dbl> 10.10, 1.14, 25.52, 12.04, 638.39, NA
## $ '2012' <dbl> 8.26, 1.27, 24.89, 12.45, 635.50, NA
## $ '2013' <dbl> 10.06, 1.44, 26.48, 12.86, 634.89, NA
## $ '2014' <dbl> 10.33, 1.72, 26.86, 13.67, 633.61, NA
## $ '2016' <dbl> 9.71, 1.84, 27.01, 14.13, 633.41, NA
## $ '2017' <dbl> 9.71, 1.84, 27.01, 14.13, 633.41, NA
## $ '2018' <dbl> 9.55, 2.55, 26.22, 15.07, 629.08, NA
## $ '2019' <dbl> 9.95, 2.81, 26.90, 15.54, 632.42, NA
## $ '2020' <dbl> 10.25, 2.95, 27.25, 16.00, 631.36, NA
## $ '2021' <dbl> 10.24, 3.19, 27.82, 16.54, 629.44, NA
```

Linear Regression:

Predicting Future Greenhouse Gas Emissions in the DRC

```
# Reshaping the data for modeling (emissions by year)
emissions_long <- clean_emissions_data %>%
  gather(key = "year", value = "emissions", `1990`: `2021`) %>%
 mutate(year = as.numeric(year))
# Linear model for greenhouse gas emissions prediction
emissions_lm <- lm(emissions ~ year, data = emissions_long)</pre>
# Predict future emissions (next 10 years)
future years <- data.frame(year = seq(2022, 2032, by = 1))
predicted_emissions <- predict(emissions_lm, newdata = future_years)</pre>
# Plot historical emissions and future predictions
ggplot(emissions_long, aes(x = year, y = emissions)) +
  geom_point(color = "blue") +
  geom_smooth(method = "lm", se = FALSE, color = "red") +
  geom_line(data = future_years, aes(x = year, y = predicted_emissions), color = "green") +
  labs(title = "Projected Greenhouse Gas Emissions in DRC (2022-2032)",
       x = "Year", y = "Emissions (CO2 equivalents)") +
 theme_minimal()
## 'geom_smooth()' using formula = 'y ~ x'
## Warning: Removed 32 rows containing non-finite outside the scale range
## ('stat_smooth()').
## Warning: Removed 32 rows containing missing values or values outside the scale range
## ('geom point()').
```



My Analysis:

Data Cleaning and Preparation:

I started off by removing irrelevant or missing data to ensure the datasets were ready for analysis and to assist with readability. One of the biggest issues we had to address was the missing values for reproductive state. We can assume that the NA in reproductive state is because they are male gorillas. Therefore, we jsut deleted that column as it did not affect the study of their habitat or stress levels.

Dataset Finds:

Stress Levels:

One of the biggest correlations I discovered is the strong correlation between temperature and cortisol levels in gorillas. As the temperatures rose, so did their cortisol levels. This tells us that with the rise of temperatures gorillas become more stressed and may potentially change their forage behaviors.

Habitat Use:

As previously mentioned, changes in gorillas enviornment can contribute to changes in foraging behaviors. I discovered the same thing with this data set.

Greenhouse Gases:

Based on the Linear Regression I performed 'Predicting Future Greenhouse Gas Emissions in the DRC', it appears that greenhouse gases will rise pretty steadily over the next 10 years. This is not great news for gorilla populations as we have learned gorillas corisol levels increase when the temperature increases as well.

Implications:

The findings from this project really stress the urgency of addressing climate change in an effort to help the critically endangered species, the mountain gorilla. We have learned that gorillas stress levels increase due to rising temperatures, which in turn causes them to venture out of their home territory. Trends also show us that these rising temperatures will get even worse, so it is imperitative we take action now to protect these animals.

Luckily, there are things we can do to help prevent the loss of this great species. We can work to reduct greenhouse gases as well as work to restore gorillas habitats and resources.

Limitations:

Data Gaps:

There were a couple of missing data values in our datasets that could potentially have had an effect on our results.

Regional Accuracy:

Although mountain gorillas do live in the DRC, this dataset was not specific on which part fo the DRC these numbers are from, so we cannot be 100% certain these are the temperatures these gorillas are dealing with.