

# MATH2270 Assignment 2

## Visualising Open Data

### Student Details

- Alistair Grevis-James (s3644119)

<https://www.kaggle.com/zhangjuefei/birds-bones-and-living-habits>  
(<https://www.kaggle.com/zhangjuefei/birds-bones-and-living-habits>)

#### About

According to their living environments and living habits, birds are classified into different ecological groups. There are 8 ecological groups of birds:

- Swimming Birds
- Wading Birds
- Terrestrial Birds
- Raptors
- Scansorial Birds
- Singing Birds
- Cursorial Birds (not included in dataset)
- Marine Birds (not included in dataset)

First 6 groups are main and are covered by this dataset.

There are 420 birds contained in this dataset. Each bird is represented by 10 measurements (features):

- Length and Diameter of Humerus
- Length and Diameter of Ulna
- Length and Diameter of Femur
- Length and Diameter of Tibiotarsus
- Length and Diameter of Tarsometatarsus

```
# Load your packages
library(tidyr)
library(dplyr)
library(knitr)
library(GGally)
library(ggplot2)
library(ggthemes)
```

### Data

```
# Load your data and prepare for visualisation
birdDS <- read.csv("bird.csv")
```

### Exploring the Data

```
# Load your data and prepare for visualisation
head(birdDS)
```

	<b>id</b> <int>	<b>huml</b> <dbl>	<b>humw</b> <dbl>	<b>ulnal</b> <dbl>	<b>ulnaw</b> <dbl>	<b>feml</b> <dbl>	<b>femw</b> <dbl>	<b>tibl</b> <dbl>	<b>tibw</b> <dbl>
1	0	80.78	6.68	72.01	4.88	41.81	3.70	5.50	4.03
2	1	88.91	6.63	80.53	5.59	47.04	4.30	80.22	4.51
3	2	79.97	6.37	69.26	5.28	43.07	3.90	75.35	4.04
4	3	77.65	5.70	65.76	4.77	40.04	3.52	69.17	3.40
5	4	62.80	4.84	52.09	3.73	33.95	2.72	56.27	2.96
6	5	61.92	4.78	50.46	3.47	49.52	4.41	56.95	2.73

6 rows | 1-10 of 13 columns

```
colnames(birdDS)
```

```
## [1] "id"      "huml"    "humw"    "ulnal"   "ulnaw"   "feml"    "femw"    "tibl"
## [9] "tibw"    "tarl"    "tarw"    "type"
```

```
colNamesFull <- c("ID", "HumerusLength", "HumerusDiameter", "UlnaLength", "UlnaDiameter",
                  "FemurLength", "FemurDiameter", "TibiotarusLength", "TibiotarusDiameter",
                  "TarsometatarusLength", "TarsometatarusDiameter", "EcologicalBirdType")
```

```
# Load your data and prepare for visualisation
summary(birdDS)
```

```
##           id           huml           humw           ulnal
## Min.      : 0.0      Min.      : 9.85      Min.      : 1.140      Min.      : 14.09
## 1st Qu.:104.8      1st Qu.: 25.17      1st Qu.: 2.190      1st Qu.: 28.05
## Median :209.5      Median : 44.18      Median : 3.500      Median : 43.71
## Mean      :209.5      Mean      : 64.65      Mean      : 4.371      Mean      : 69.12
## 3rd Qu.:314.2      3rd Qu.: 90.31      3rd Qu.: 5.810      3rd Qu.: 97.52
## Max.      :419.0      Max.      :420.00      Max.      :17.840      Max.      :422.00
##           NA's      :1           NA's      :1           NA's      :3
##           ulnaw           feml           femw           tibl
## Min.      : 1.000      Min.      : 11.83      Min.      : 0.930      Min.      : 5.50
## 1st Qu.: 1.870      1st Qu.: 21.30      1st Qu.: 1.715      1st Qu.: 36.42
## Median : 2.945      Median : 31.13      Median : 2.520      Median : 52.12
## Mean      : 3.597      Mean      : 36.87      Mean      : 3.221      Mean      : 64.66
## 3rd Qu.: 4.770      3rd Qu.: 47.12      3rd Qu.: 4.135      3rd Qu.: 82.87
## Max.      :12.000      Max.      :117.07      Max.      :11.640      Max.      :240.00
## NA's      :2           NA's      :2           NA's      :1           NA's      :2
##           tibw           tarl           tarw           type
## Min.      : 0.870      Min.      : 7.77      Min.      : 0.660      P : 38
## 1st Qu.: 1.565      1st Qu.: 23.04      1st Qu.: 1.425      R : 50
## Median : 2.490      Median : 31.74      Median : 2.230      SO:128
## Mean      : 3.182      Mean      : 39.23      Mean      : 2.930      SW:116
## 3rd Qu.: 4.255      3rd Qu.: 50.25      3rd Qu.: 3.500      T : 23
## Max.      :11.030      Max.      :175.00      Max.      :14.090      W : 65
## NA's      :1           NA's      :1           NA's      :1
```

```
# Load your data and prepare for visualisation
str(birdDS)
```

```
## 'data.frame':    420 obs. of  12 variables:
## $ id   : int  0 1 2 3 4 5 6 7 8 9 ...
## $ huml : num  80.8 88.9 80 77.7 62.8 ...
## $ humw : num  6.68 6.63 6.37 5.7 4.84 ...
## $ ulnal: num  72 80.5 69.3 65.8 52.1 ...
## $ ulnaw: num  4.88 5.59 5.28 4.77 3.73 3.47 4.5 4.55 6.13 7.05 ...
## $ feml : num  41.8 47 43.1 40 34 ...
## $ femw : num  3.7 4.3 3.9 3.52 2.72 4.41 3.41 3.78 5.45 7.44 ...
## $ tibl : num  5.5 80.2 75.3 69.2 56.3 ...
## $ tibw : num  4.03 4.51 4.04 3.4 2.96 2.73 3.56 3.81 5.58 7.31 ...
## $ tarl : num  38.7 41.5 38.3 35.8 31.9 ...
## $ tarw : num  3.84 4.01 3.34 3.41 3.13 2.83 3.64 3.81 4.37 6.34 ...
## $ type : Factor w/ 6 levels "P","R","SO","SW",...: 4 4 4 4 4 4 4 4 4 4 ...
```

```
# Load your data and prepare for visualisation
head(birdDS)
```

	id	huml	humw	ulnal	ulnaw	feml	femw	tibl	tibw
	<int>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>	<dbl>
1	0	80.78	6.68	72.01	4.88	41.81	3.70	5.50	4.03
2	1	88.91	6.63	80.53	5.59	47.04	4.30	80.22	4.51
3	2	79.97	6.37	69.26	5.28	43.07	3.90	75.35	4.04
4	3	77.65	5.70	65.76	4.77	40.04	3.52	69.17	3.40

	id <int>	huml <dbl>	humw <dbl>	ulnal <dbl>	ulnaw <dbl>	feml <dbl>	femw <dbl>	tibl <dbl>	tibw <dbl>
5	4	62.80	4.84	52.09	3.73	33.95	2.72	56.27	2.96
6	5	61.92	4.78	50.46	3.47	49.52	4.41	56.95	2.73

6 rows | 1-10 of 13 columns

```
# Check the species ID
unique(birdDS$type)
```

```
## [1] SW W T R P SO
## Levels: P R SO SW T W
```

## Determine the mean values

```
# SW - Swimming Birds
SWbirds <- subset(birdDS, birdDS$type == "SW") # SW - Swimming Birds
Wbirds <- subset(birdDS, birdDS$type == "W") # W - Wading Birds
Tbirds <- subset(birdDS, birdDS$type == "T") # T - Terrestrial Birds
Rbirds <- subset(birdDS, birdDS$type == "R") # R - Raptors
Pbirds <- subset(birdDS, birdDS$type == "P") # P - Scansorial Birds
SObirds <- subset(birdDS, birdDS$type == "SO") # SO - Singing Birds
```

```
# Filling NA - Rbirds
Wbirds$feml[is.na(Wbirds$feml)] <- mean(Wbirds$feml, na.rm = TRUE)
Wbirds$femw[is.na(Wbirds$femw)] <- mean(Wbirds$femw, na.rm = TRUE)
```

```
# Filling NA - Rbirds
Rbirds$ulnal[is.na(Rbirds$ulnal)] <- mean(Rbirds$ulnal, na.rm = TRUE)
Rbirds$ulnaw[is.na(Rbirds$ulnaw)] <- mean(Rbirds$ulnaw, na.rm = TRUE)
Rbirds$starl[is.na(Rbirds$starl)] <- mean(Rbirds$starl, na.rm = TRUE)
Rbirds$starw[is.na(Rbirds$starw)] <- mean(Rbirds$starw, na.rm = TRUE)
```

```
# Filling NA - SObirds
SObirds$huml[is.na(SObirds$huml)] <- mean(SObirds$huml, na.rm = TRUE)
SObirds$humw[is.na(SObirds$humw)] <- mean(SObirds$humw, na.rm = TRUE)
SObirds$ulnal[is.na(SObirds$ulnal)] <- mean(SObirds$ulnal, na.rm = TRUE)
SObirds$ulnaw[is.na(SObirds$ulnaw)] <- mean(SObirds$ulnaw, na.rm = TRUE)
SObirds$feml[is.na(SObirds$feml)] <- mean(SObirds$feml, na.rm = TRUE)
SObirds$tibl[is.na(SObirds$tibl)] <- mean(SObirds$tibl, na.rm = TRUE)
SObirds$tibw[is.na(SObirds$tibw)] <- mean(SObirds$tibw, na.rm = TRUE)
```

```
birdDS_clean <- rbind(SWbirds, Wbirds, Tbirds, Rbirds, Pbirds, SObirds)
```

```
summary(birdDS_clean)
```

```
##           id           huml           humw           ulnal
## Min.      : 0.0      Min.      : 9.85      Min.      : 1.140      Min.      : 14.09
## 1st Qu.:104.8      1st Qu.: 25.04      1st Qu.: 2.188      1st Qu.: 28.00
## Median :209.5      Median : 44.08      Median : 3.495      Median : 43.51
## Mean     :209.5      Mean     : 64.55      Mean     : 4.365      Mean     : 68.99
## 3rd Qu.:314.2      3rd Qu.: 90.22      3rd Qu.: 5.805      3rd Qu.: 97.56
## Max.     :419.0      Max.     :420.00      Max.     :17.840      Max.     :422.00
##           ulnaw           feml           femw           tibl
## Min.      : 1.000      Min.      : 11.83      Min.      : 0.930      Min.      : 5.50
## 1st Qu.: 1.867      1st Qu.: 21.33      1st Qu.: 1.718      1st Qu.: 36.34
## Median : 2.945      Median : 31.13      Median : 2.525      Median : 51.94
## Mean     : 3.596      Mean     : 36.84      Mean     : 3.221      Mean     : 64.53
## 3rd Qu.: 4.772      3rd Qu.: 47.10      3rd Qu.: 4.122      3rd Qu.: 82.87
## Max.     :12.000      Max.     :117.07      Max.     :11.640      Max.     :240.00
##           tibw           tarl           tarw           type
## Min.      : 0.870      Min.      : 7.77      Min.      : 0.660      P : 38
## 1st Qu.: 1.560      1st Qu.: 23.04      1st Qu.: 1.427      R : 50
## Median : 2.490      Median : 31.81      Median : 2.235      S0:128
## Mean     : 3.178      Mean     : 39.28      Mean     : 2.935      SW:116
## 3rd Qu.: 4.253      3rd Qu.: 50.46      3rd Qu.: 3.522      T : 23
## Max.     :11.030      Max.     :175.00      Max.     :14.090      W : 65
```

## Visualisation

```
colnames(birdDS_clean)
```

```
## [1] "id"      "huml"    "humw"    "ulnal"   "ulnaw"   "feml"    "femw"    "tibl"
## [9] "tibw"    "tarl"    "tarw"    "type"
```

```
allMeasurements <- c("huml", "humw", "ulnal", "ulnaw", "feml", "femw", "tibl", "tibw", "tarl", "tarw")
lengthMeasurements <- c("huml", "ulnal", "feml", "tibl", "tarl")
widthMeasurements <- c("humw", "ulnaw", "femw", "tibw", "tarw")
```

```
test_reorder <- birdDS_clean[,c(12,2,3,4,5,6,7,8,9,10,11,1)]
```

```
test <- birdDS_clean %>% gather("huml", "humw", "ulnal", "ulnaw", "feml", "femw", "tibl", "tibw", "tarl", "tarw",
                               key = "id", value = "measurement")
```

```

SWbirdsLong <- SWbirds %>% gather("huml", "humw", "ulnal", "ulnaw", "feml", "femw",
  "tibl", "tibw", "tarl", "tarw",
  key = "type", value = "measurement")
SWbirdsLong$id <- 'SW'
WbirdsLong <- Wbirds %>% gather("huml", "humw", "ulnal", "ulnaw", "feml", "femw",
  "tibl", "tibw", "tarl", "tarw",
  key = "type", value = "measurement")
WbirdsLong$id <- 'W'
TbirdsLong <- Tbirds %>% gather("huml", "humw", "ulnal", "ulnaw", "feml", "femw",
  "tibl", "tibw", "tarl", "tarw",
  key = "type", value = "measurement")
TbirdsLong$id <- 'T'
RbirdsLong <- Rbirds %>% gather("huml", "humw", "ulnal", "ulnaw", "feml", "femw",
  "tibl", "tibw", "tarl", "tarw",
  key = "type", value = "measurement")
RbirdsLong$id <- 'R'
PbirdsLong <- Pbirds %>% gather("huml", "humw", "ulnal", "ulnaw", "feml", "femw",
  "tibl", "tibw", "tarl", "tarw",
  key = "type", value = "measurement")
PbirdsLong$id <- 'P'
SObirdsLong <- SObirds %>% gather("huml", "humw", "ulnal", "ulnaw", "feml", "femw",
  "tibl", "tibw", "tarl", "tarw",
  key = "type", value = "measurement")
SObirdsLong$id <- 'SO'

```

```

birdDS_Long <- rbind(SWbirdsLong, WbirdsLong, TbirdsLong, RbirdsLong, PbirdsLong, SObirdsLong)

```

```
summary(birdDS_Long)
```

```

##           id           type           measurement
## Length:4200      Length:4200      Min.   : 0.66
## Class :character Class :character 1st Qu.: 2.67
## Mode  :character Mode  :character Median : 12.47
##                                     Mean   : 29.15
##                                     3rd Qu.: 38.50
##                                     Max.   :422.00

```

```
colnames(birdDS_Long) <- c("birdType", "bone", "measurement")
```

```

birdDS_Long$measurementType <- sapply(strsplit(as.character(birdDS_Long$bone), ""), tail, 1)
birdDS_Long$boneAlone = substr(birdDS_Long$bone,1,nchar(birdDS_Long$bone)-1)

```

```

birdDS_Long$boneAlone <- factor(birdDS_Long$boneAlone)
levels(birdDS_Long$boneAlone) <- c("Femur", "Humerus", "Tarsometatarsus", "Tibiotarsus", "Ulna")
levels(birdDS_Long$boneAlone)

```

```

## [1] "Femur"           "Humerus"           "Tarsometatarsus" "Tibiotarsus"
## [5] "Ulna"

```

```

png('birds.png', units="in", width=32, height=18, res=300)
birdsPlot <- ggplot(data = birdDS_Long,
                    aes(x=birdDS_Long$measurement,
                        y = birdType,
                        fill = measurementType))
birdsPlot <- birdsPlot + geom_density_ridges2(scale = 0.9, alpha=0.7, colour = 'white', size = 0.5) +
  labs(y = NULL, x = "Measurement (mm)",
       title = "Bird Bone Measurements",
       subtitle = "Alistair Grevis-James s3644119",
       caption="Source: kaggle.com/zhangjuefei/birds-bones-and-living-habits.") +
  theme(plot.title=element_text(size=62,
                                face="bold",
                                family="American Typewriter",
                                color="grey30"),
        plot.subtitle=element_text(size=30,
                                    family="American Typewriter",
                                    color="grey30"),
        plot.caption = element_text(size=24,
                                    color="grey30"),
        axis.title.x=element_text(vjust=0,
                                   face = "bold",
                                   family="American Typewriter",
                                   size=30),
        axis.text.y = element_text(vjust = 0,
                                   family="American Typewriter",
                                   size = 30),
        axis.text.x = element_text(size = 20,
                                   family="American Typewriter"),
        strip.text.x = element_text(size = 30,
                                   family="American Typewriter"),
        legend.text = element_text(size=24)) +
  guides(fill = guide_legend(keywidth = 2.5, keyheight = 2.5)) +
  scale_x_continuous(expand = c(0.01, 0), breaks = c(0, 25, 50, 75, 100, 125)) +
  coord_cartesian(xlim = c(0, 150)) +
  scale_y_discrete(expand = c(0.01, 0), labels=c("Scansorial Birds", "Raptors",
                                                "Song Birds", "Swimming Birds",
                                                "Terrestrial Birds", "Wading Bird
s")) +
  facet_grid(.~boneAlone) +
  theme(legend.title = element_blank()) +
  theme(legend.position = c(0.95, 0.09)) +
  scale_fill_manual(values = c("#ff7f00", "#377eb8"), labels=c("Length", "Width"))

birdsPlot
dev.off()

```

```

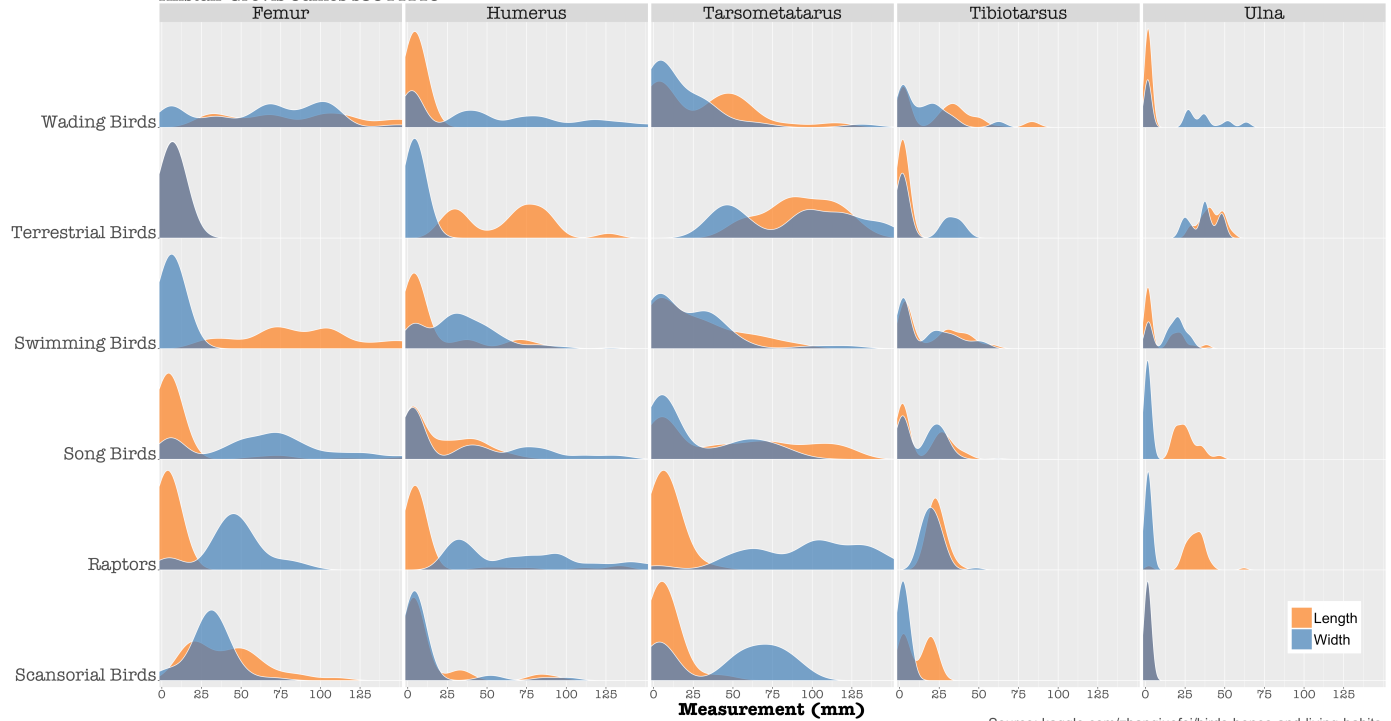
## quartz_off_screen
##                2

```

```
birdsPlot
```

## Bird Bone Measurements

Alistair Grevis-James s3644119

Source: [kaggle.com/zhangjuefei/birds-bones-and-living-habits](https://kaggle.com/zhangjuefei/birds-bones-and-living-habits).

The figure shows a series of faceted density plots of bird bone measurements. The measurements are of either length in orange or diameter (width) in blue – all measurements are in mm. The plots are faceted by bone type, and each row represents a type of bird. The visualisation is highly effective at showing the relation between length and diameter of a particular bone, within a particular bird type. The visualisation also allows for distribution comparisons between bird groups and for distribution comparisons between bone types. Starting in the top left-hand corner, we see for example that femur measurements of wading birds are very widely distributed. If we look to terrestrial birds, we see the femur length and width are extremely highly correlated. This correlation can then be compared with the other bones measured.