



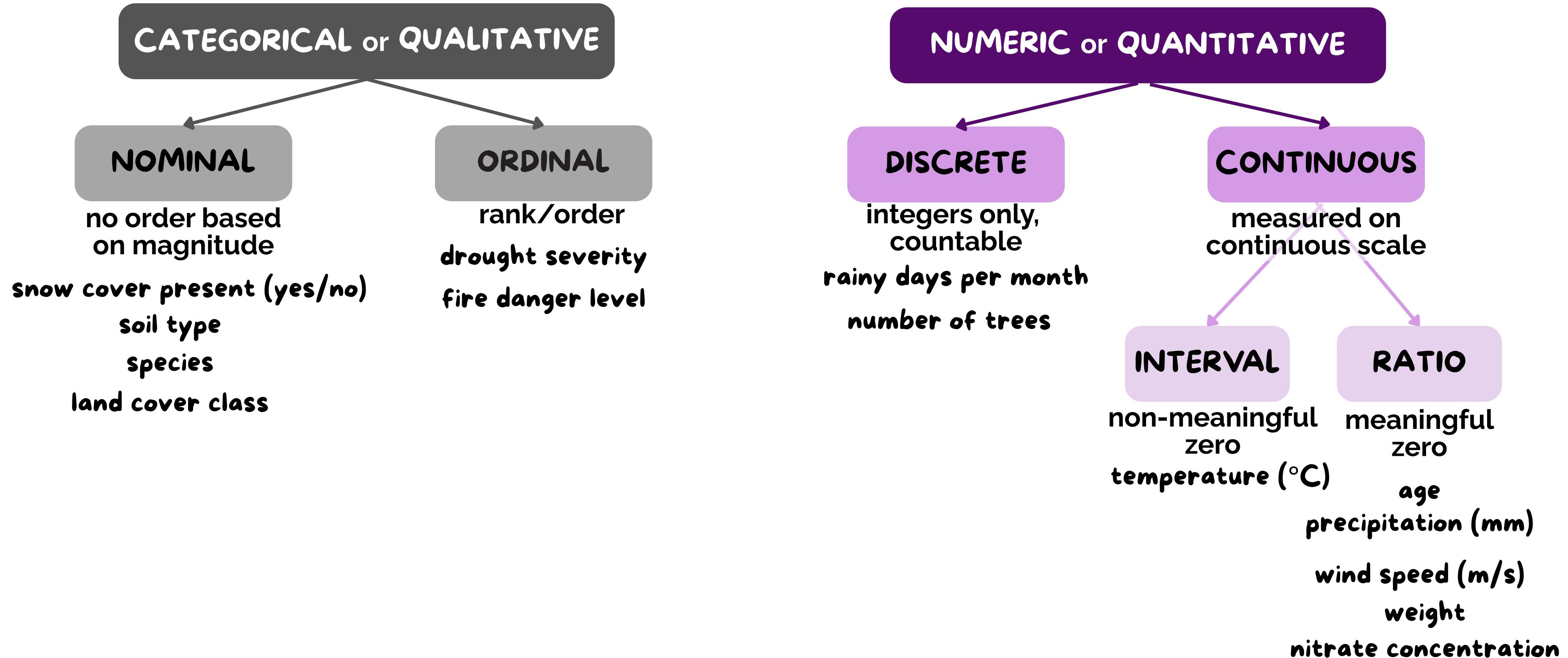
# MODELLING TOOLS FOR ENVIRONMENTAL SCIENTIFIC STUDIES

Descriptive Statistics and  
Exploratory Data Analysis

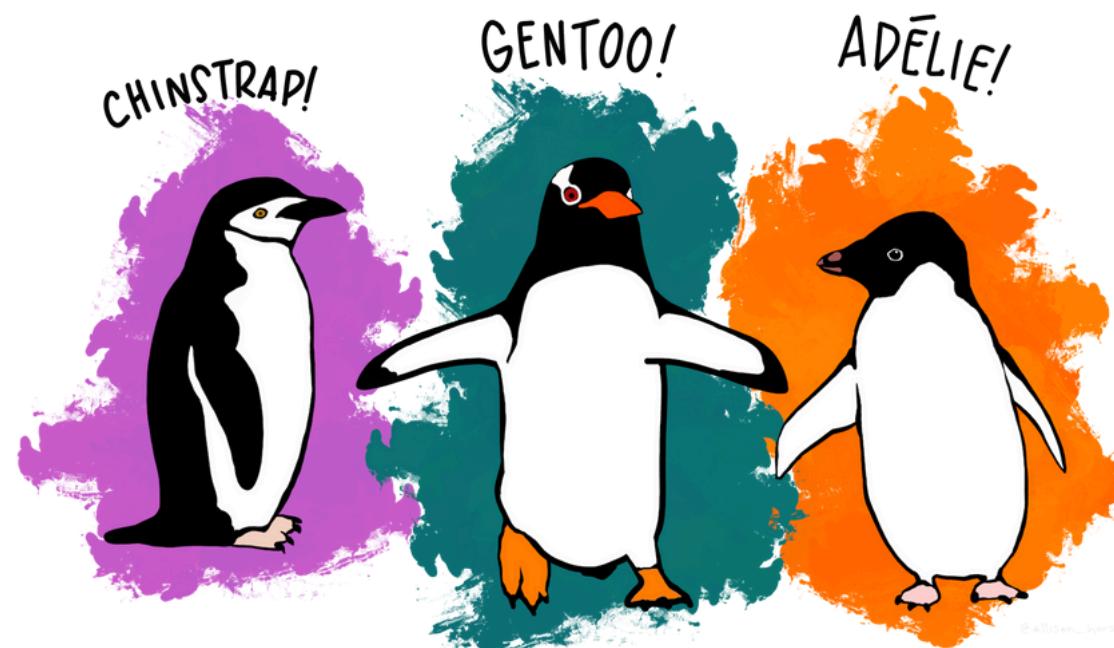
IDA RAHU

# VARIABLES & THEIR TYPES

VARIABLE = RECORDED INFO



# CATEGORICAL VARIABLES



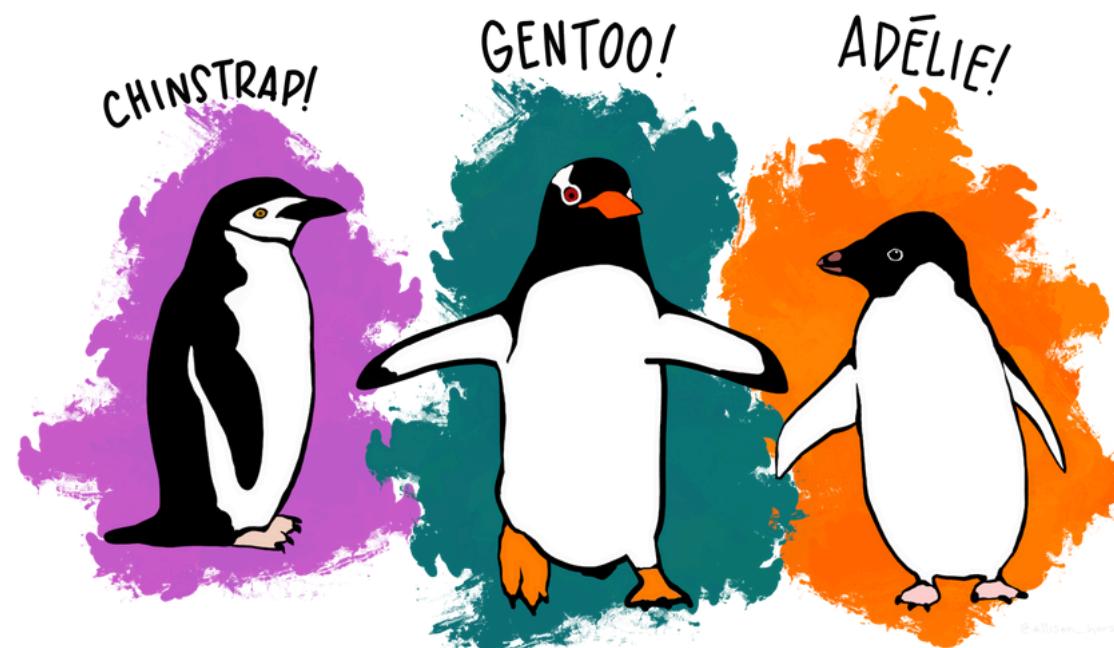
8 variables (n = 344 penguins)

The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# CATEGORICAL VARIABLES



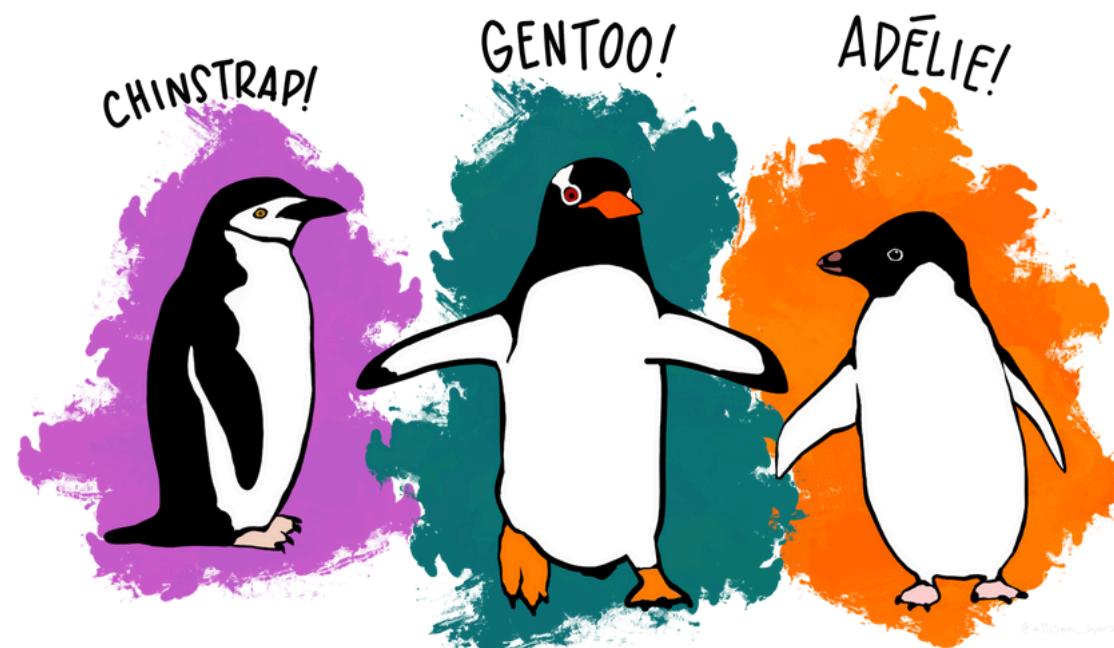
The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

8 variables (n = 344 penguins)

<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# CATEGORICAL VARIABLES



The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

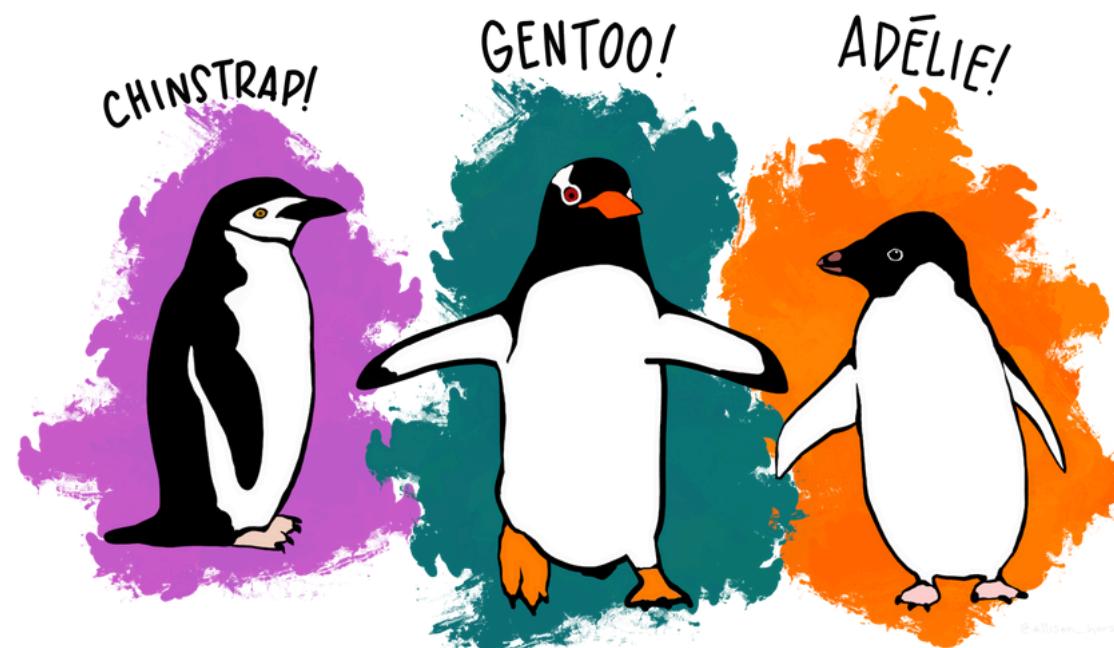
8 variables (n = 344 penguins)

<b>Species</b>	Penguin species
<b>Island</b>	Island in the Palmer
<b>Bill</b>	Length of the
<b>Bill</b>	Depth (thickness) of
<b>Flipper</b>	Length of the
<b>Body</b>	Body mass of the
<b>Sex</b>	Male or female (some)
<b>Year</b>	Year of observation

<b>Island</b>	<b>Frequency</b>	<b>Proportion</b>
Biscoe	168	
Dream	124	
Torgersen	52	
<b>TOTAL</b>	<b>344</b>	

These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# CATEGORICAL VARIABLES

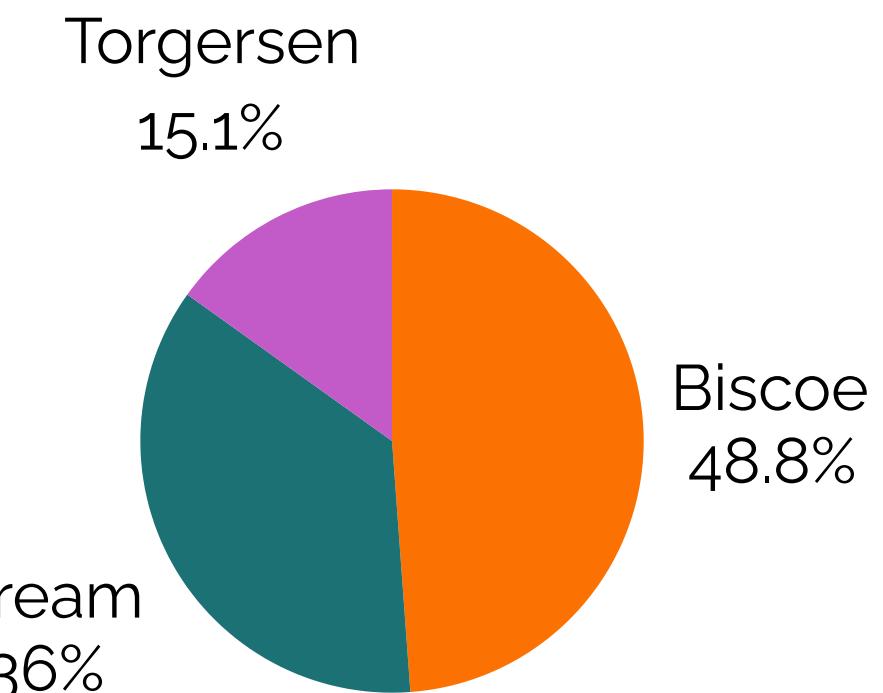


8 variables (n = 344 penguins)

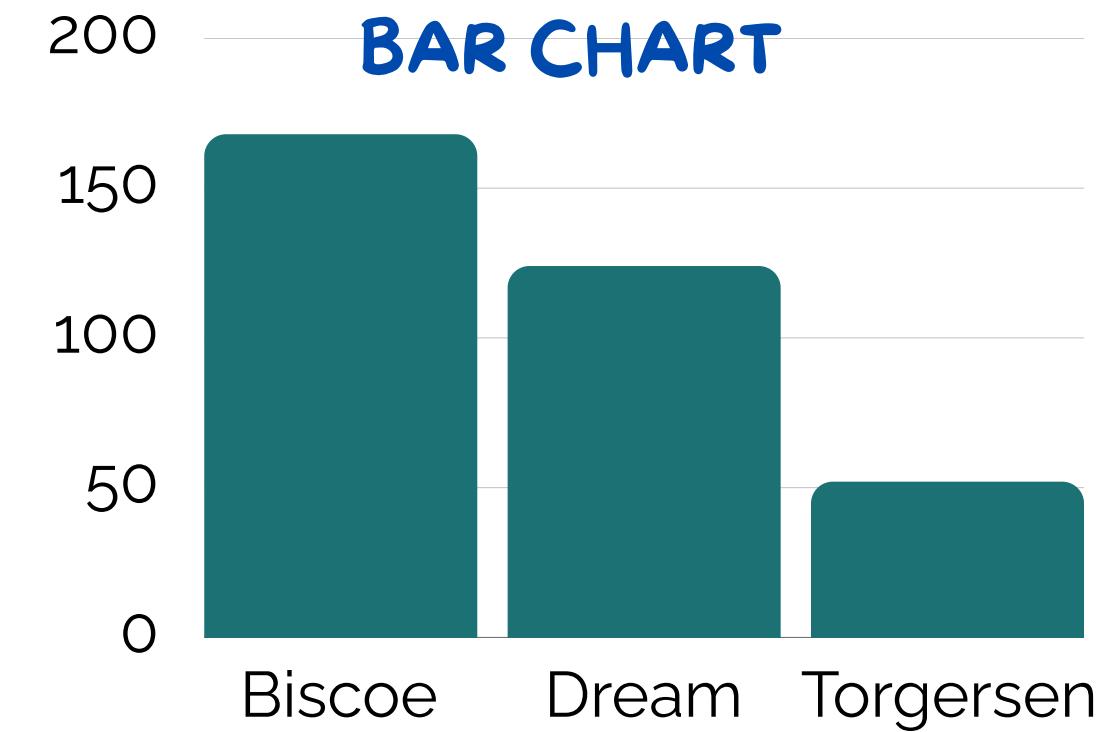
<b>Species</b>	Penguin species
<b>Island</b>	Island in the Palmer
<b>Bill</b>	Length of the
<b>Bill</b>	Depth (thickness) of
<b>Flipper</b>	Length of the
<b>Body</b>	Body mass of the
<b>Sex</b>	Male or female (some)
<b>Year</b>	Year of observation

Island	Frequency	Proportion
Biscoe	168	0.489
Dream	124	0.36
Torgersen	52	0.151
<b>TOTAL</b>	<b>344</b>	<b>1</b>

## PIE CHART

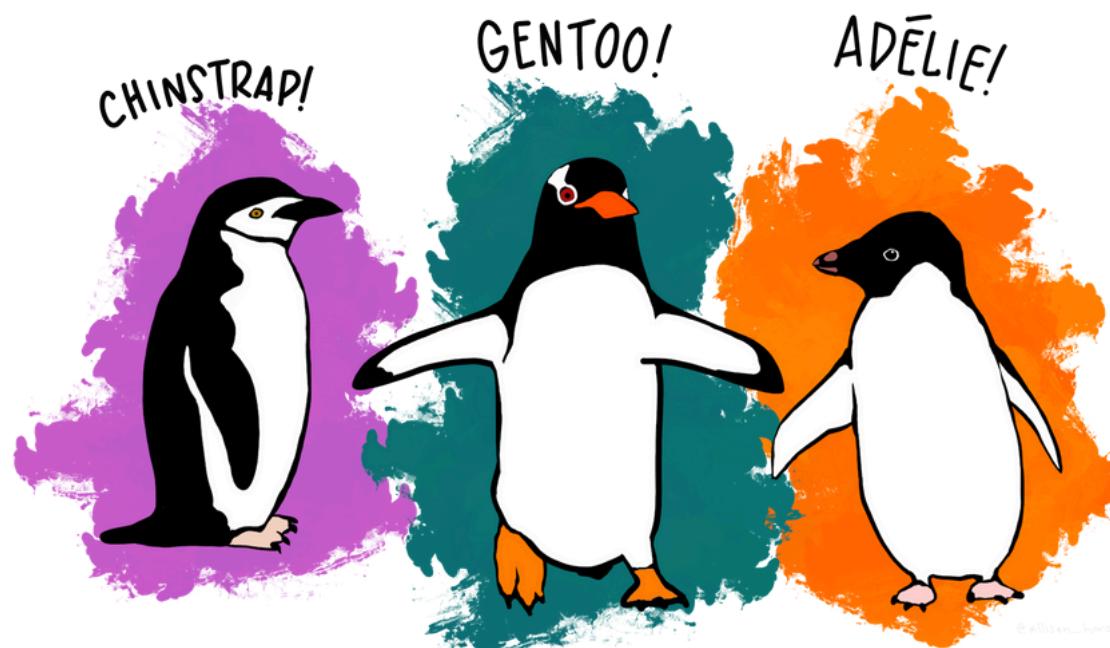


## BAR CHART



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# CATEGORICAL VARIABLES

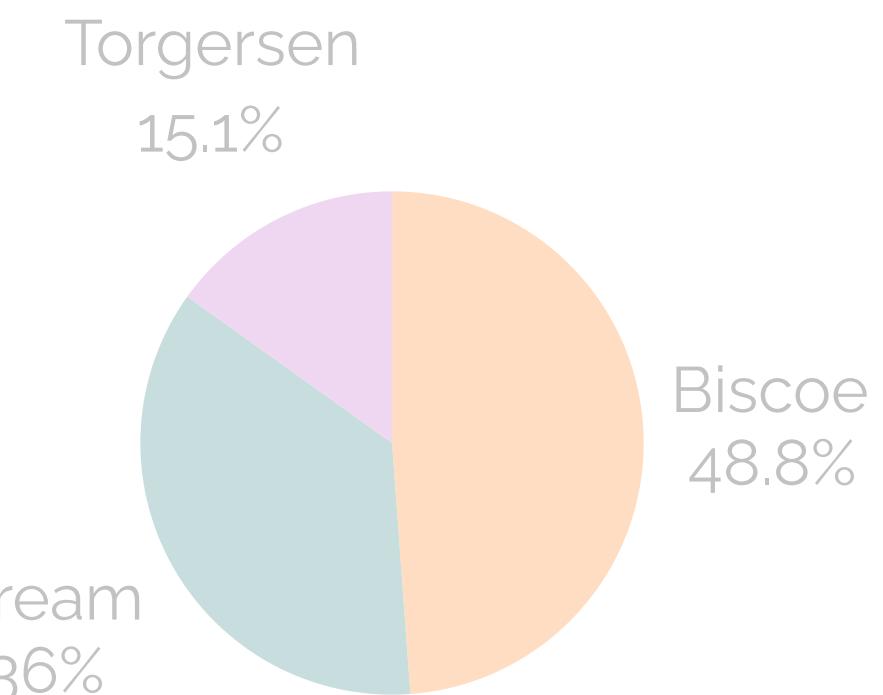


8 variables (n = 344 penguins)

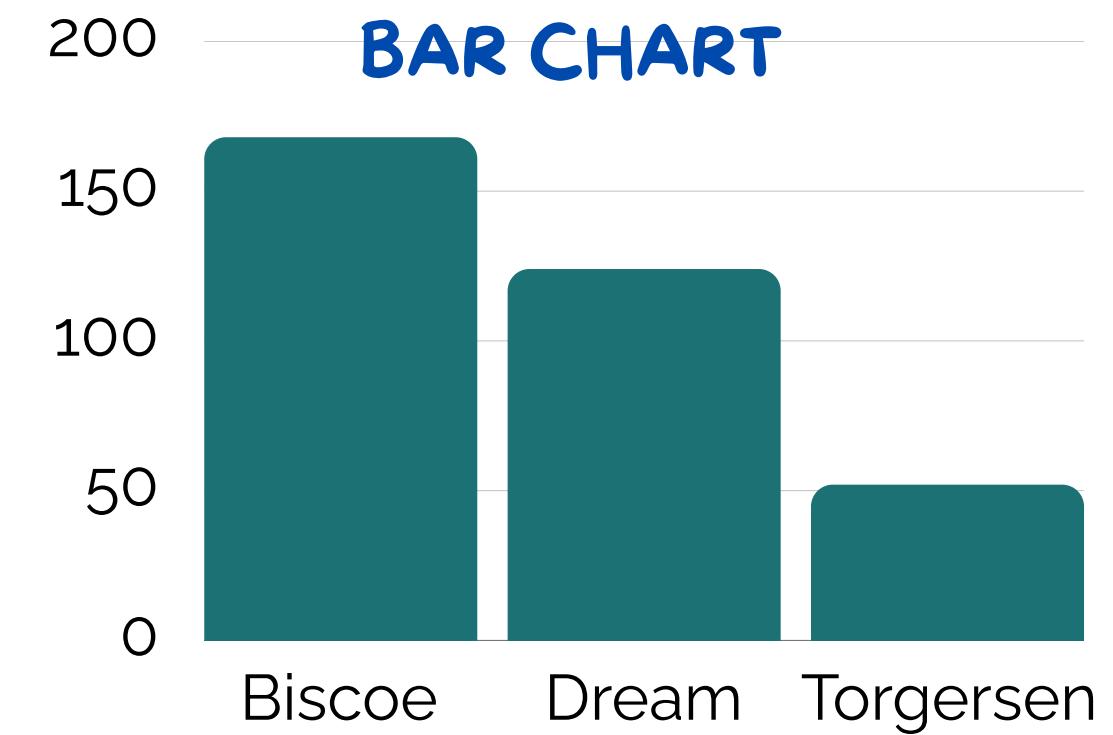
<b>Species</b>	Penguin species
<b>Island</b>	Island in the Palmer
<b>Bill</b>	Length of the
<b>Bill</b>	Depth (thickness) of
<b>Flipper</b>	Length of the
<b>Body</b>	Body mass of the
<b>Sex</b>	Male or female (some)
<b>Year</b>	Year of observation

Island	Frequency	Proportion
Biscoe	168	0.489
Dream	124	0.36
Torgersen	52	0.151
<b>TOTAL</b>	<b>344</b>	<b>1</b>

## PIE CHART

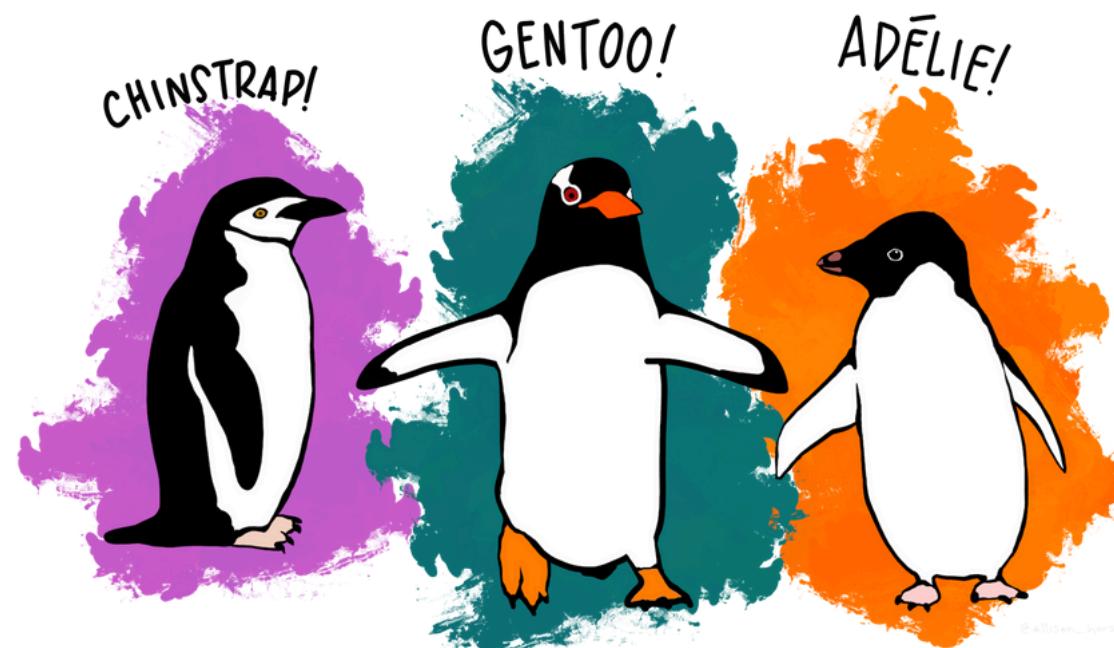


## BAR CHART



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# NUMERIC VARIABLES



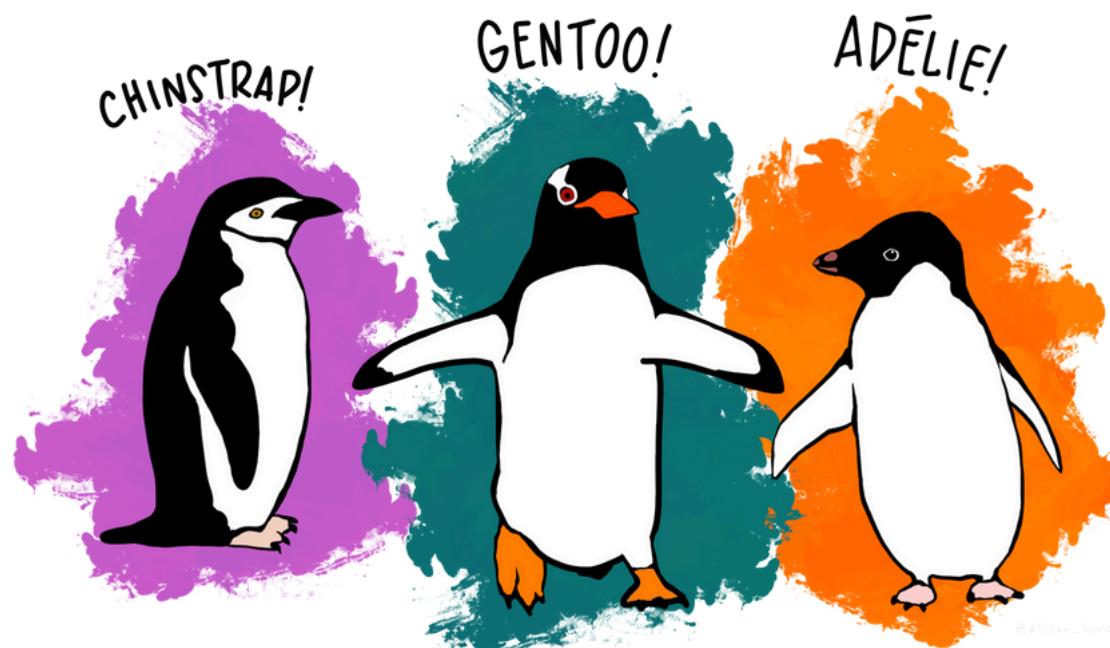
The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

8 variables (n = 344 penguins)

<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# NUMERIC VARIABLES



8 variables (n = 344 penguins)

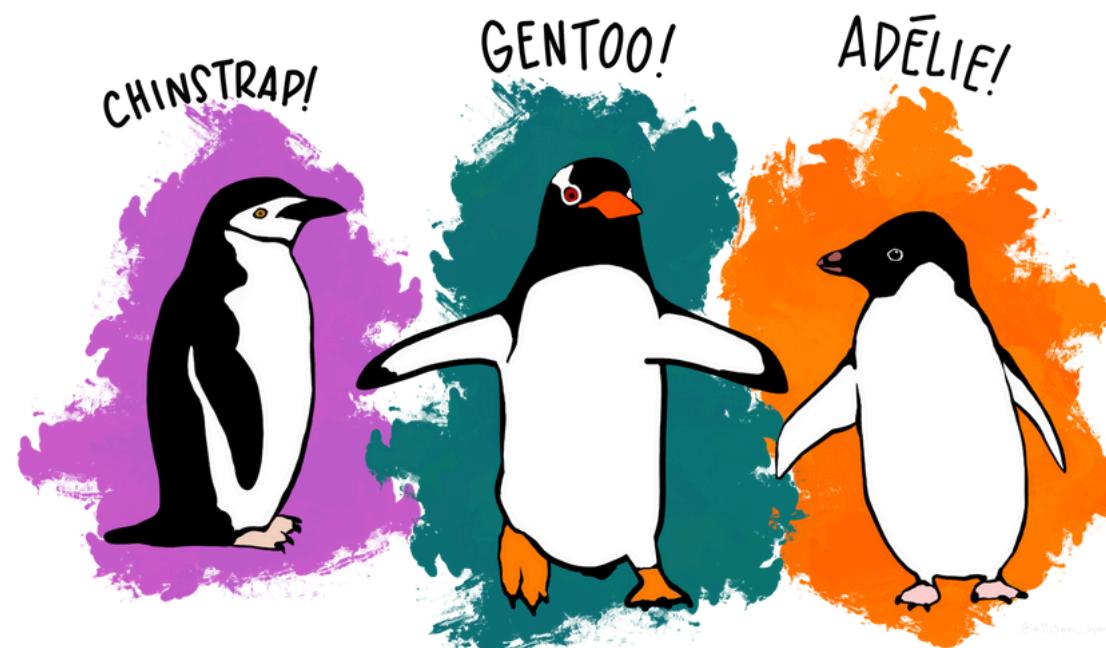
The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

73 male Adelie penguins  
 min body mass = 3325 g  
 max body mass = 4775 g

<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# NUMERIC VARIABLES



8 variables (n = 344 penguins)

The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

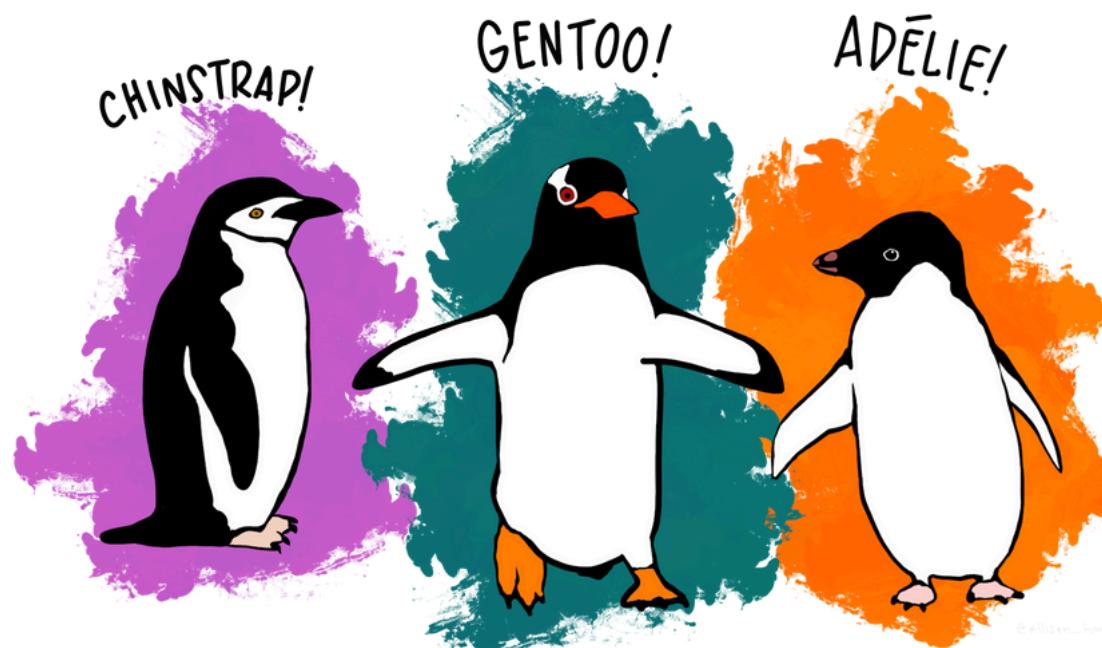
73 male Adelie penguins  
 min body mass = 3325 g  
 max body mass = 4775 g

<b>Speci</b>	Penguin
<b>Island</b>	Island in the Palmer Archipelago
<b>Bill</b>	Length of the bill
<b>Bill depth</b>	Depth of the bill
<b>Flippe</b>	Length of the flipper
<b>Body</b>	Body mass of the penguin
<b>Sex</b>	Male or female
<b>Year</b>	Year of collection

	<b>Body mass (g)</b>	<b>Frequency</b>	<b>Proportion</b>
	[3325...3615)	9	
	[3615...3905)	20	
	[3905..4195)	18	
	[4195...4485)	18	
	[4485...4775)	8	
	<b>TOTAL</b>	<b>73</b>	

These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# NUMERIC VARIABLES



8 variables (n = 344 penguins)

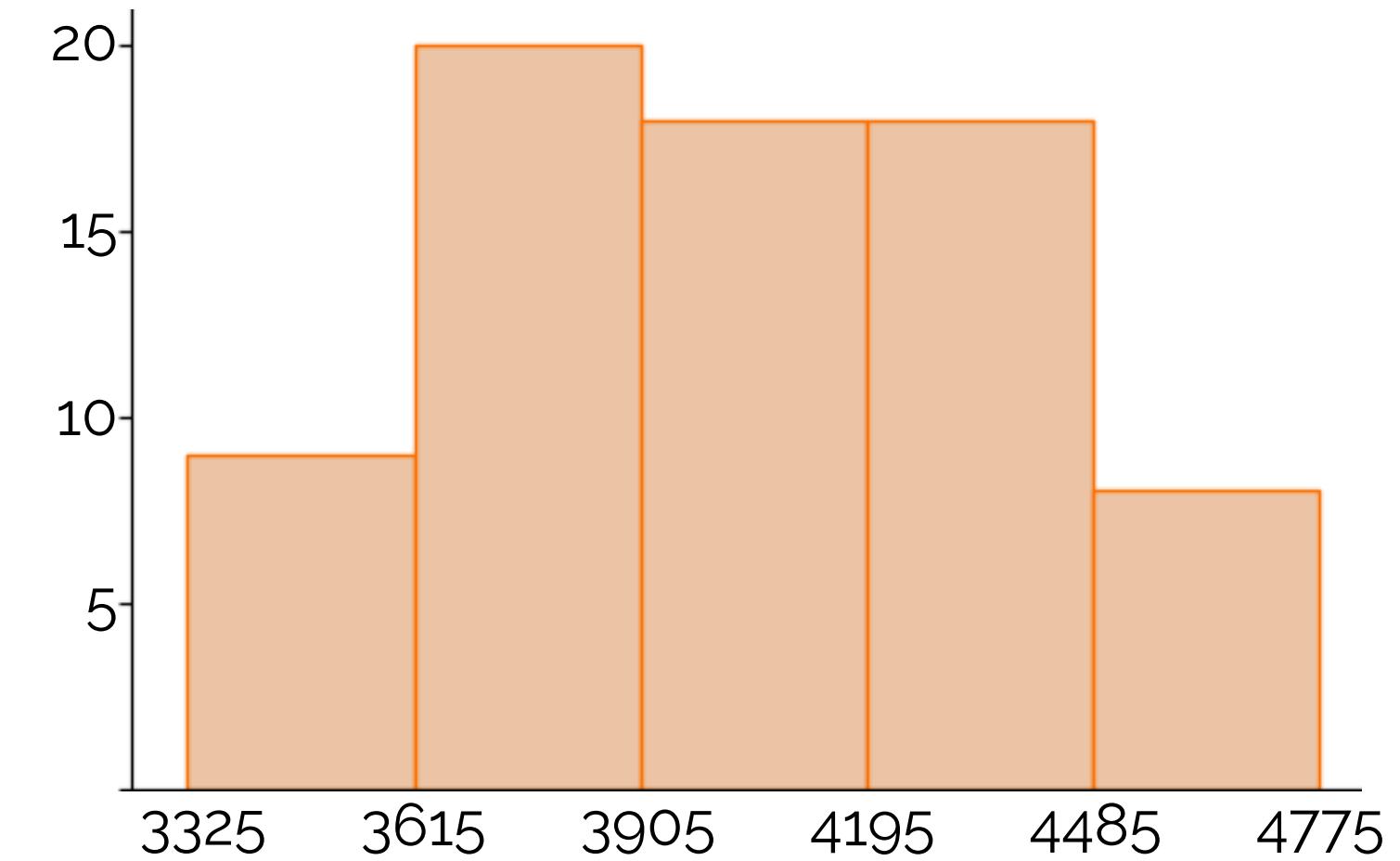
Speci	Penguin
Island	Island in the Palmer Archipelago
Bill	Length of the bill
Bill depth	Depth of the bill
Flippe	Length of the flipper
Body	Body mass of the penguin
Sex	Male or female
Year	Year of collection

Body mass (g)	Frequency	Proportion
[3325...3615)	9	0.123
[3615...3905)	20	0.274
[3905..4195)	18	0.247
[4195...4485)	18	0.247
[4485...4775)	8	0.11
<b>TOTAL</b>	<b>73</b>	<b>1</b>

The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

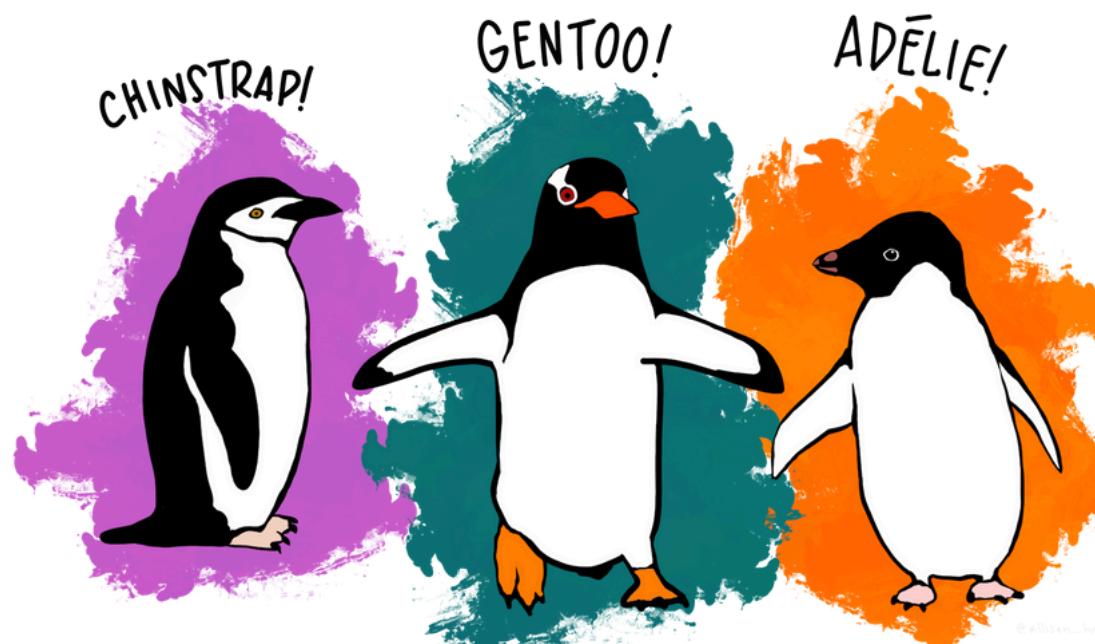
73 male Adelie penguins  
min body mass = 3325 g  
max body mass = 4775 g

## HISTOGRAM



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# NUMERIC VARIABLES



8 variables (n = 344 penguins)

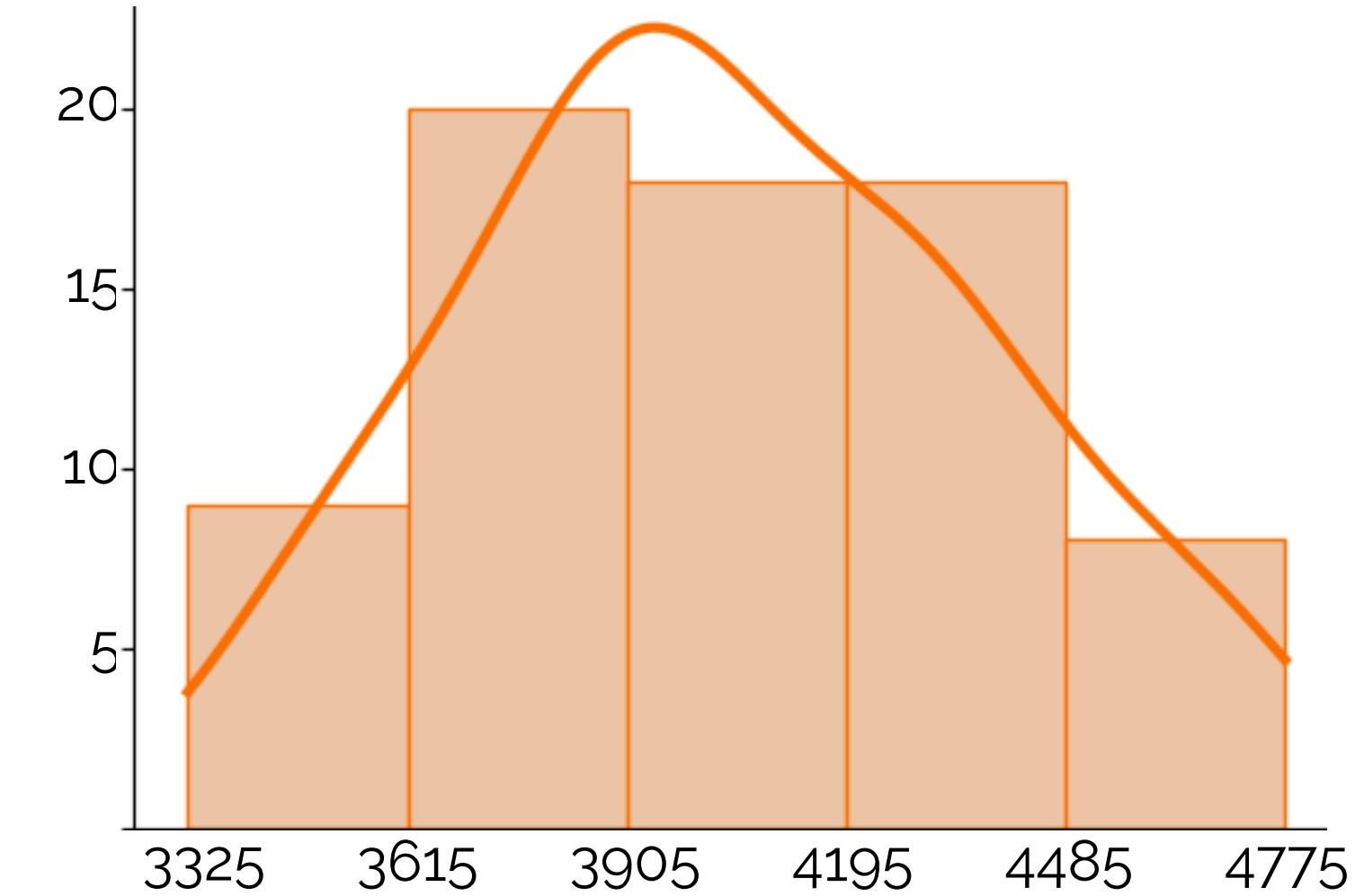
Speci	Penguin
Island	Island in the Palmer Archipelago
Bill	Length of the penguin's bill
Bill depth	Depth of the penguin's bill
Flippe	Length of the penguin's flipper
Body	Body mass of the penguin
Sex	Male or female
Year	Year of collection

Body mass (g)	Frequency	Proportion
[3325...3615)	9	0.123
[3615...3905)	20	0.274
[3905..4195)	18	0.247
[4195...4485)	18	0.247
[4485...4775)	8	0.11
<b>TOTAL</b>	<b>73</b>	<b>1</b>

The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

73 male Adelie penguins  
min body mass = 3325 g  
max body mass = 4775 g

## KERNEL DENSITY (PLOT)



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

QUANTILES

MEDIAN

RANGE  
&  
IQR

MODE

VARIANCE  
&  
STD DEV

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

QUANTILES

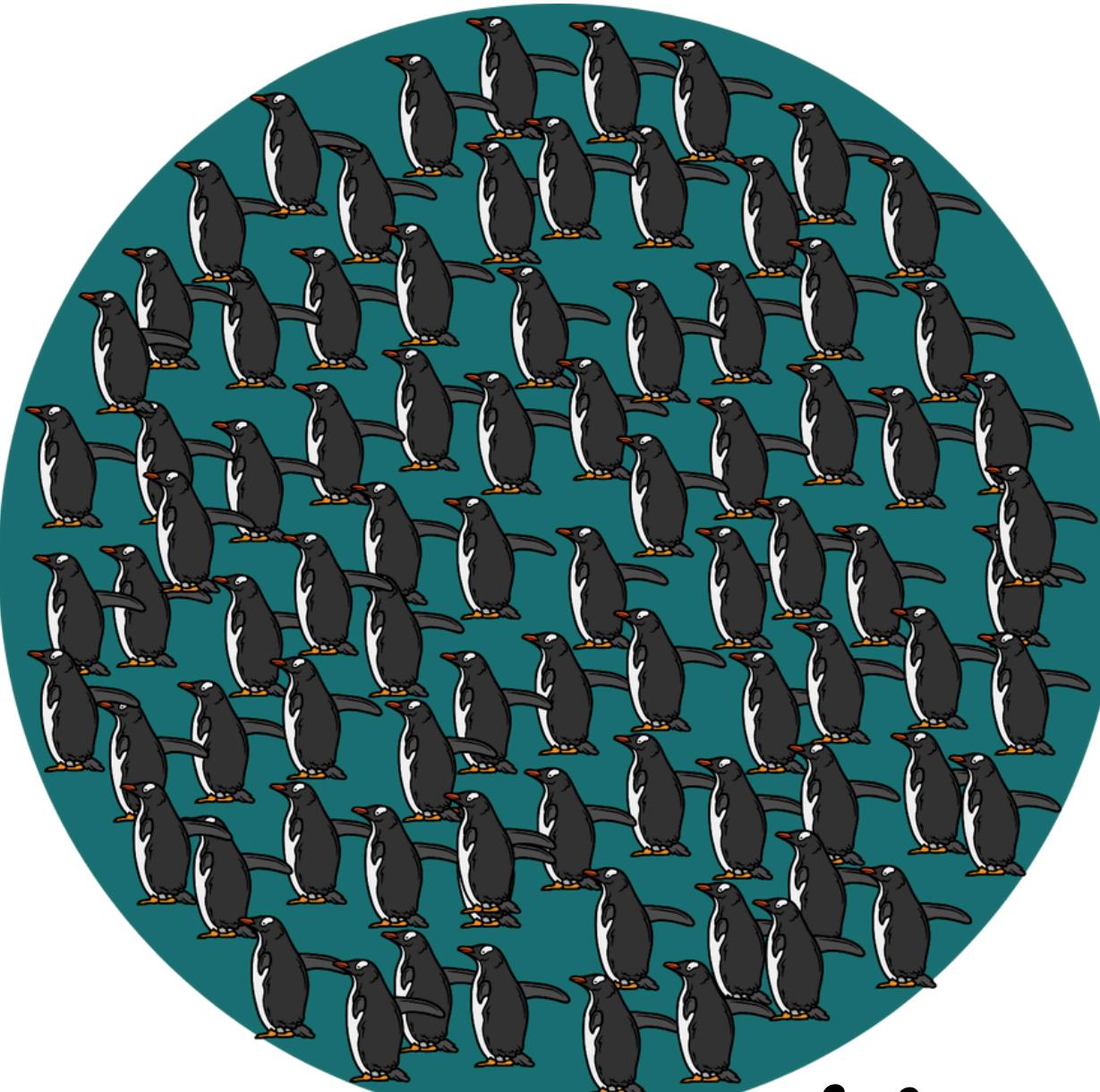
MEDIAN

RANGE  
&  
IQR

MODE

VARIANCE  
&  
STD DEV

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY



POPULATION  $\mu$

MEAN

QUANTILES

MEDIAN

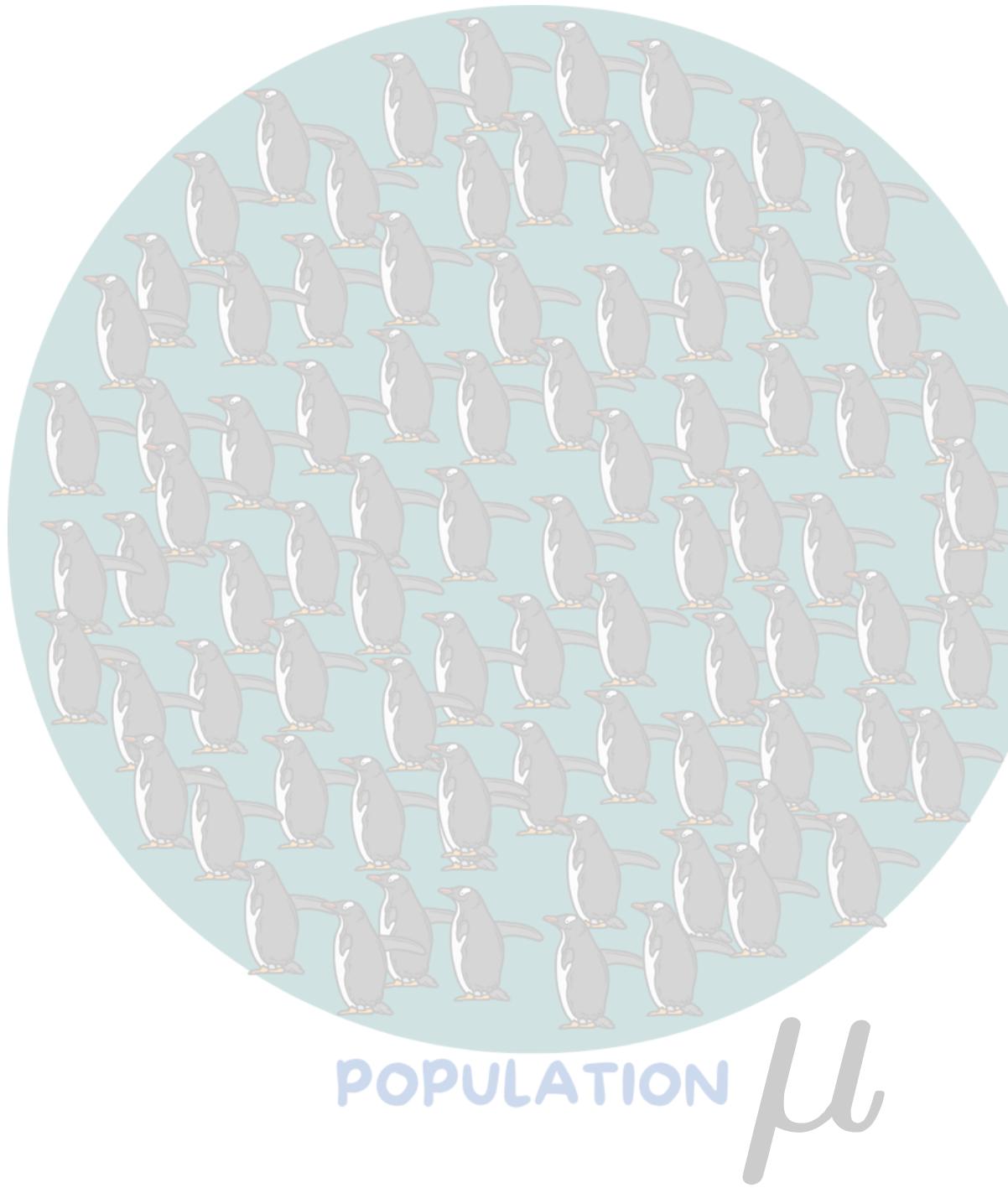
RANGE  
&  
IQR

MODE

VARIANCE  
&  
STD DEV

$$\mu = \frac{\sum x}{N}$$

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY



MEAN

QUANTILES

MEDIAN

RANGE  
&  
IQR

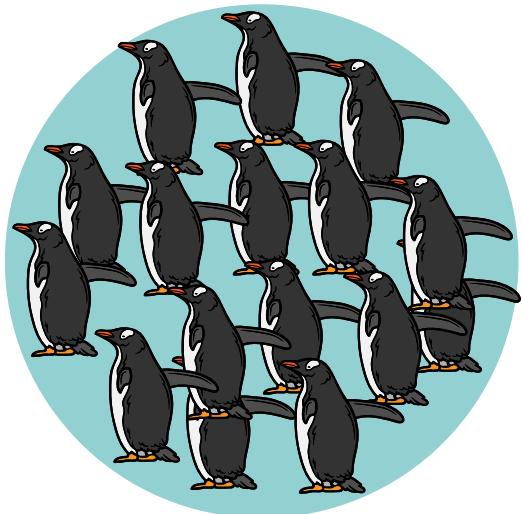
MODE

VARIANCE  
&  
STD DEV

$$\mu = \frac{\sum x}{N}$$

# ESTIMATES OF LOCATION

## MEASURE OF CENTRAL TENDENCY



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

MEAN

QUANTILES

MEDIAN

RANGE  
&  
IQR

MODE

VARIANCE  
&  
STD DEV

# ESTIMATES OF LOCATION

## MEASURE OF CENTRAL TENDENCY

MEAN

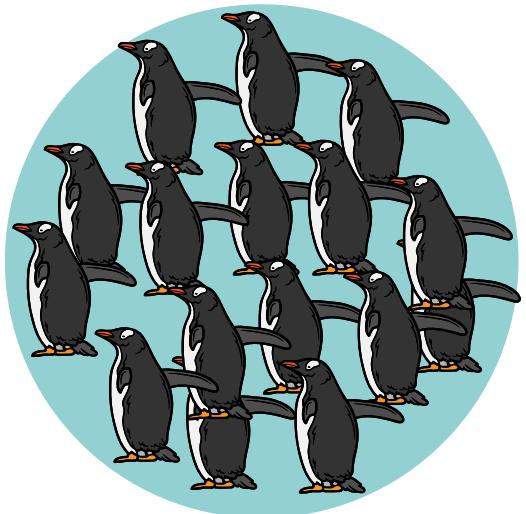
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



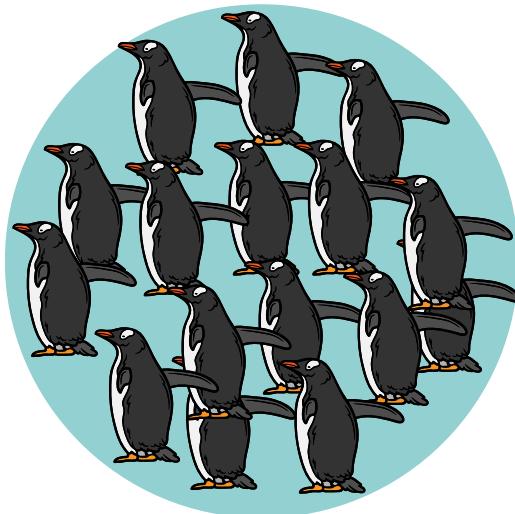
SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

[10, 28, 28, 33, 54]

$$\bar{x} = \frac{10 + 28 + 28 + 33 + 54}{5} = 30.6$$

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

MEAN

QUANTILES

MEDIAN

RANGE  
&  
IQR

MODE

VARIANCE  
&  
STD DEV

MEAN OF CATEGORICAL VARIABLE?

[Male, Female, Female, Male, Female, Female]

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

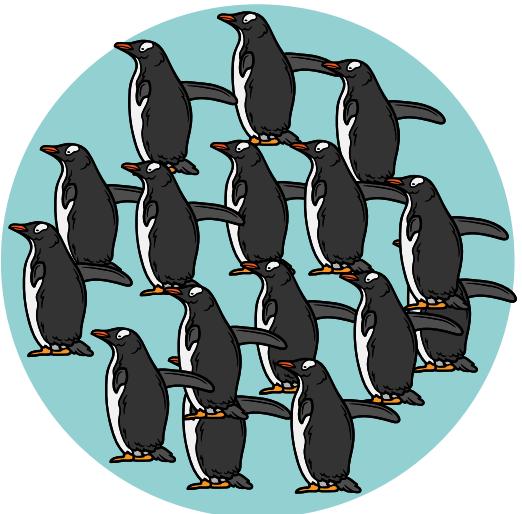
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

## MEAN OF CATEGORICAL VARIABLE?

[Male, Female, Female, Male, Female, Female]

[0, 1, 1, 0, 1, 1]

$$\bar{x} = \frac{0 + 1 + 1 + 0 + 1 + 1}{6} = 0.66\ldots$$

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

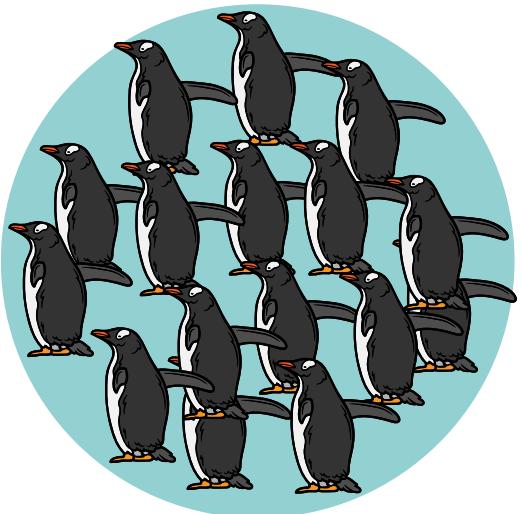
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

## MEAN OF BINARY VARIABLE > PROPORTION

[Male, Female, Female, Male, Female, Female]

[0, 1, 1, 0, 1, 1]

$$\bar{x} = \frac{0 + 1 + 1 + 0 + 1 + 1}{6} = 0.66\ldots$$

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

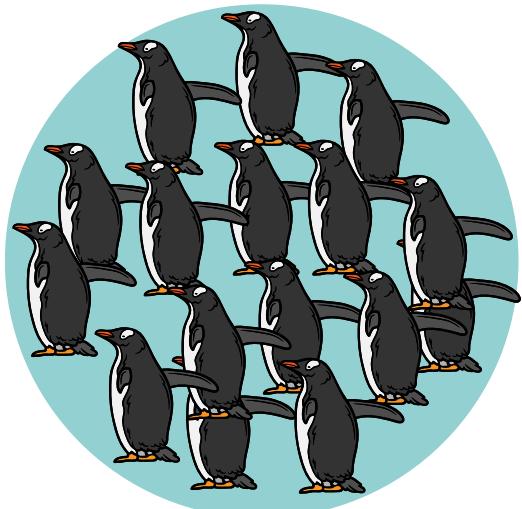
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

[10, 28, 28, 33, 54]

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

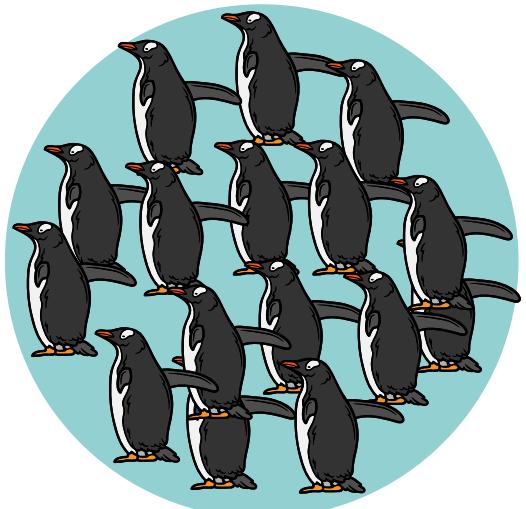
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

[10, 28, 28, 33, 54]

$Med = 28$

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

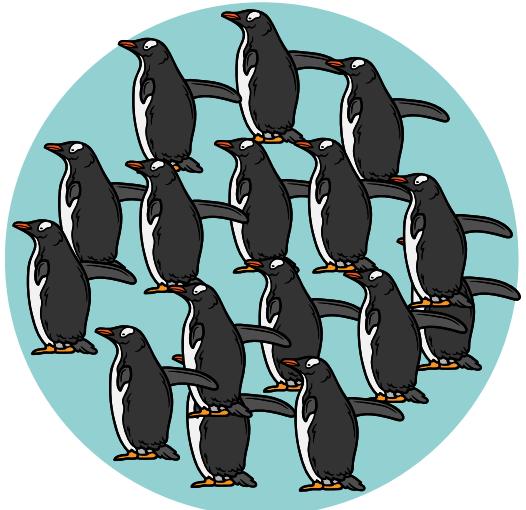
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

[10, 28, 28, 33, 54, 59]

# ESTIMATES OF LOCATION

## MEASURE OF CENTRAL TENDENCY

MEAN

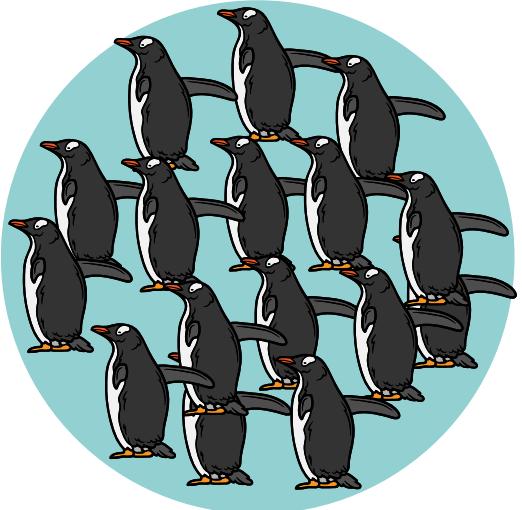
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

Middle value of ordered observations (50% below, 50% above)

[10, 28, 28, 33, 54, 59]

$$Med = \frac{28 + 33}{2} = 30.5$$

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY



$$\bar{x} = \frac{\sum x}{n}$$

MEAN

MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV

Mean:

- sensitive to outliers
- “balance” point

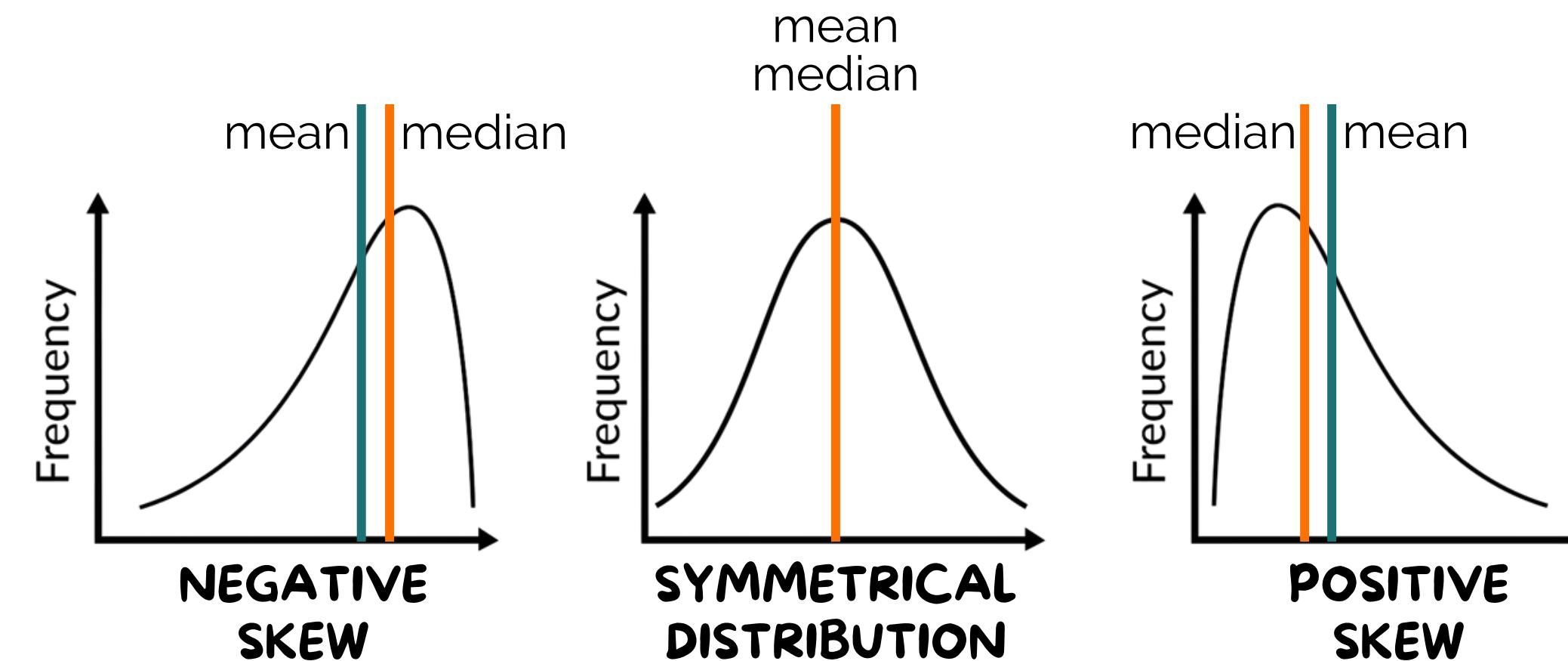
Median:

- not sensitive to outliers
- cuts data in half

[10, 28, 28, 33, 54]

$$\bar{x} = \frac{10 + 28 + 28 + 33 + 54}{5} = 30.6$$

$$Med = 28$$



# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

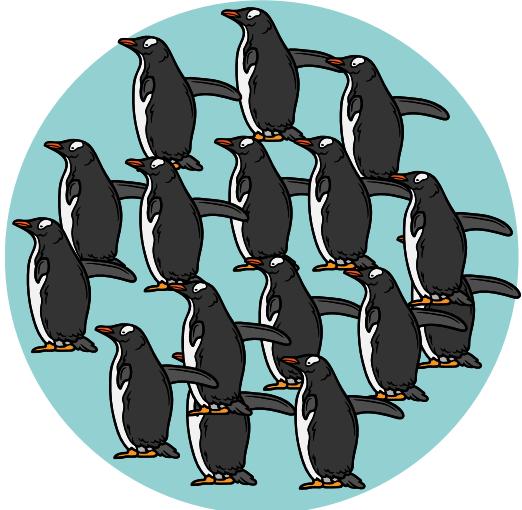
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

The observation with the highest frequency

[10, 28, 28, 33, 54]

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

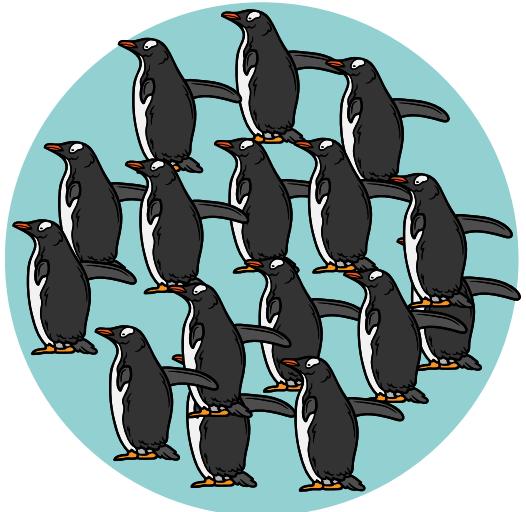
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

The observation with the highest frequency

[10, 28, 28, 33, 54]

*Mode* = 28

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

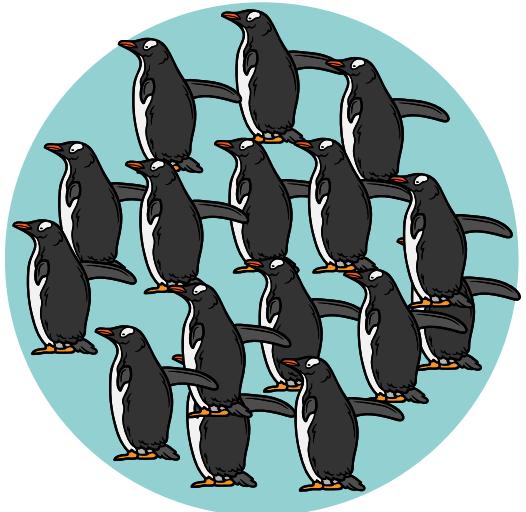
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

The observation with the highest frequency

[10, 27, 28, 33, 54]

*Mode* = ?

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

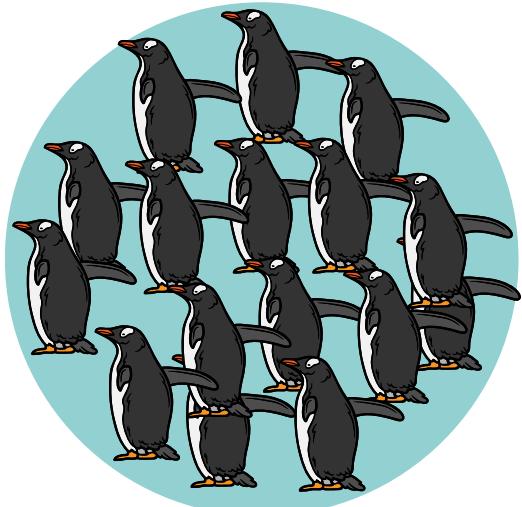
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

The observation with the highest frequency

[10, 27, 28, 54, 54]

*Mode* = 54

Not suitable for small datasets

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY

MEAN

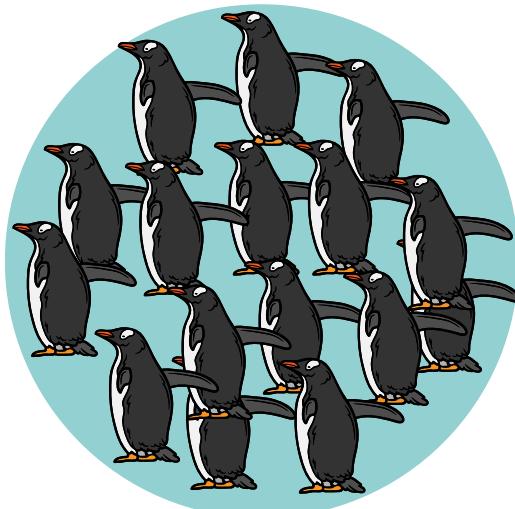
MEDIAN

MODE

QUANTILES

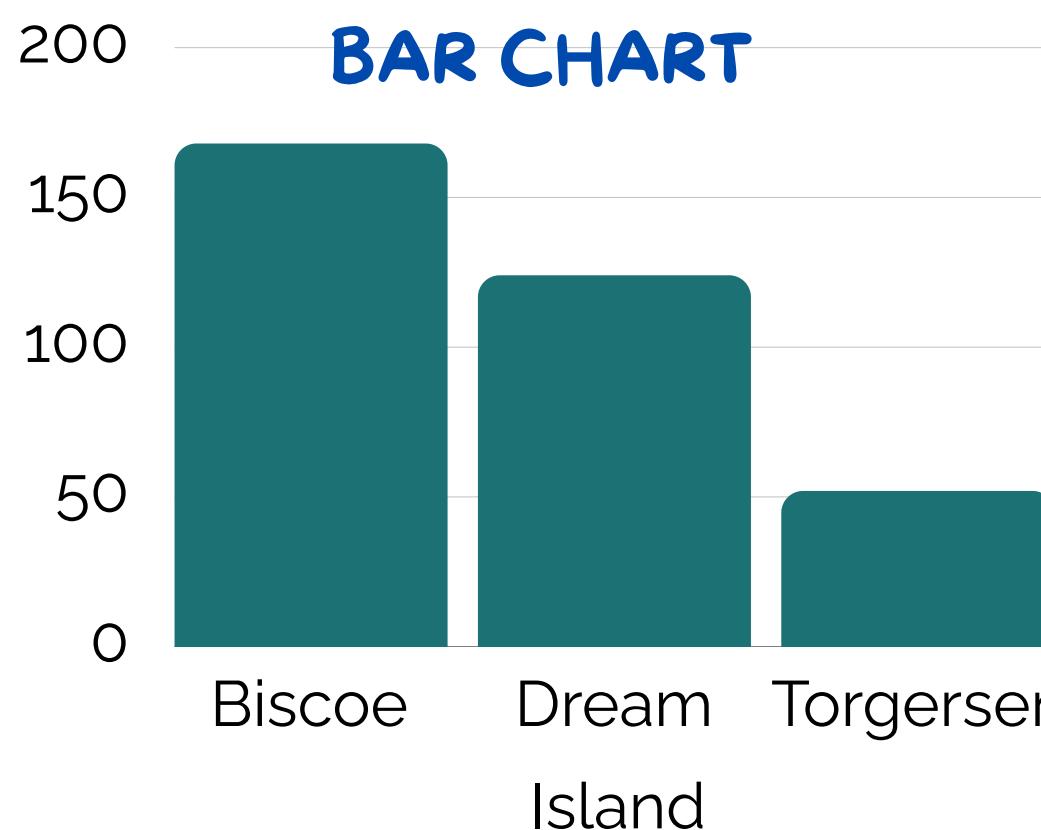
RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

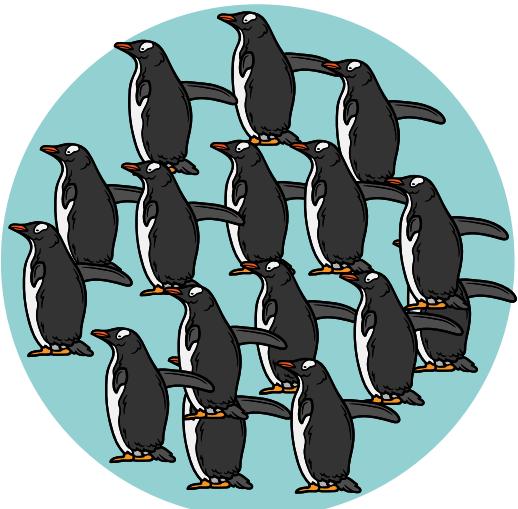


The observation with the highest frequency

*Mode = Biscoe*

These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

Mean:

- sensitive to outliers
- “balance” point

Median:

- not sensitive to outliers
- cuts data in half

Mode:

The observation with the highest frequency

MEAN

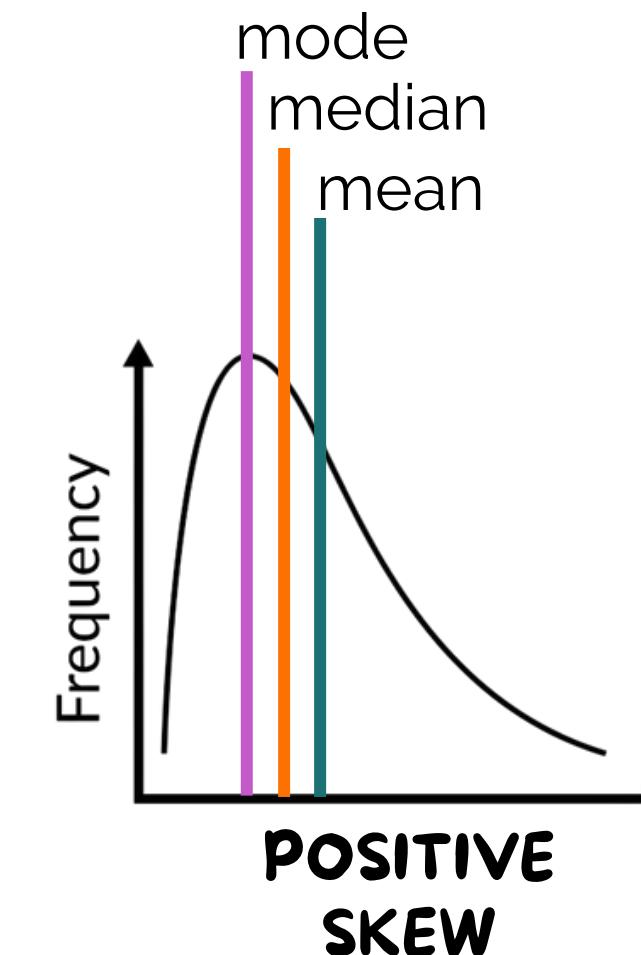
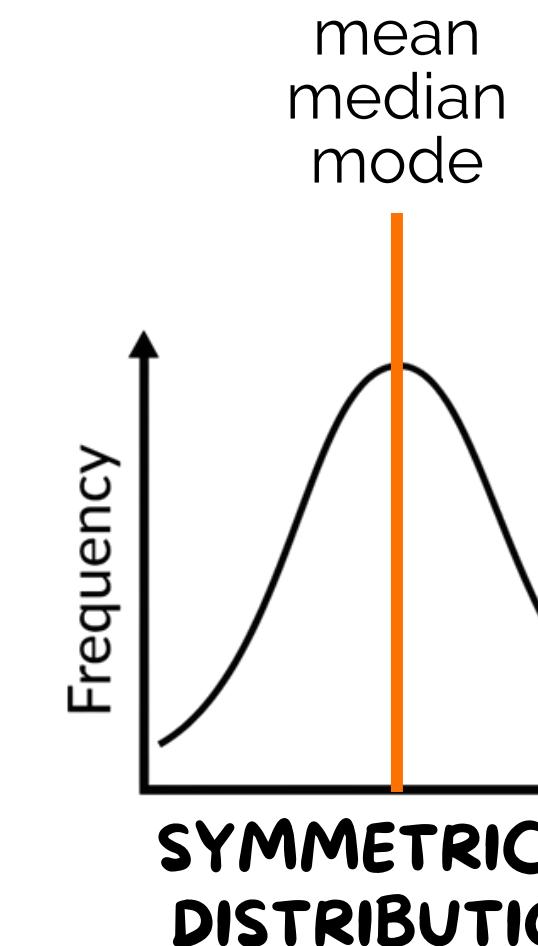
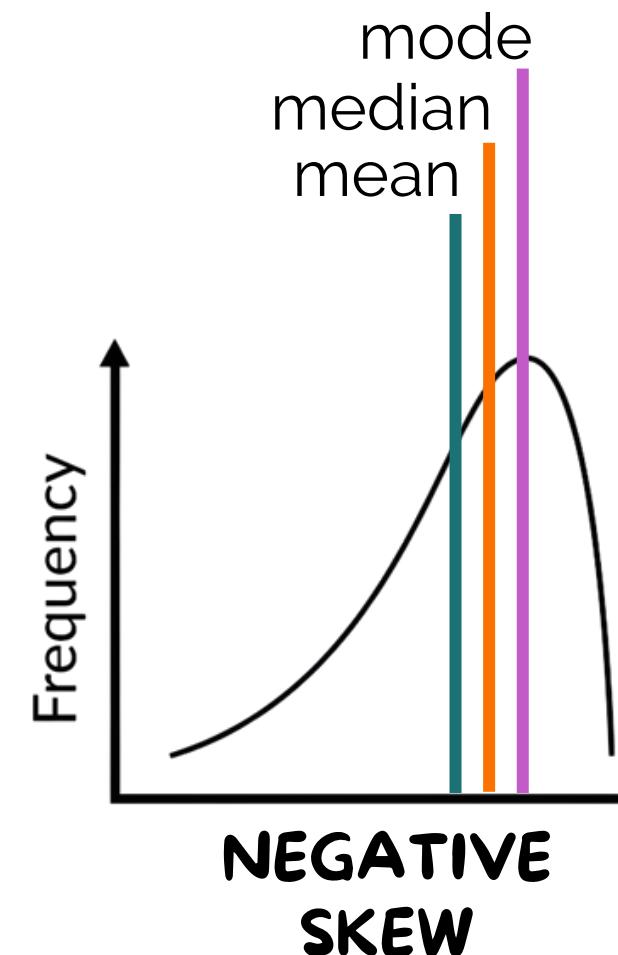
MEDIAN

MODE

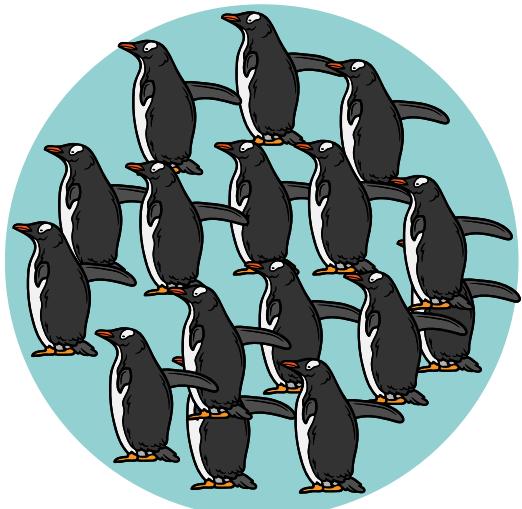
QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

Mean:

- sensitive to outliers
- “balance” point

Median:

- not sensitive to outliers
- cuts data in half

Mode:

The observation with the highest frequency

MEAN

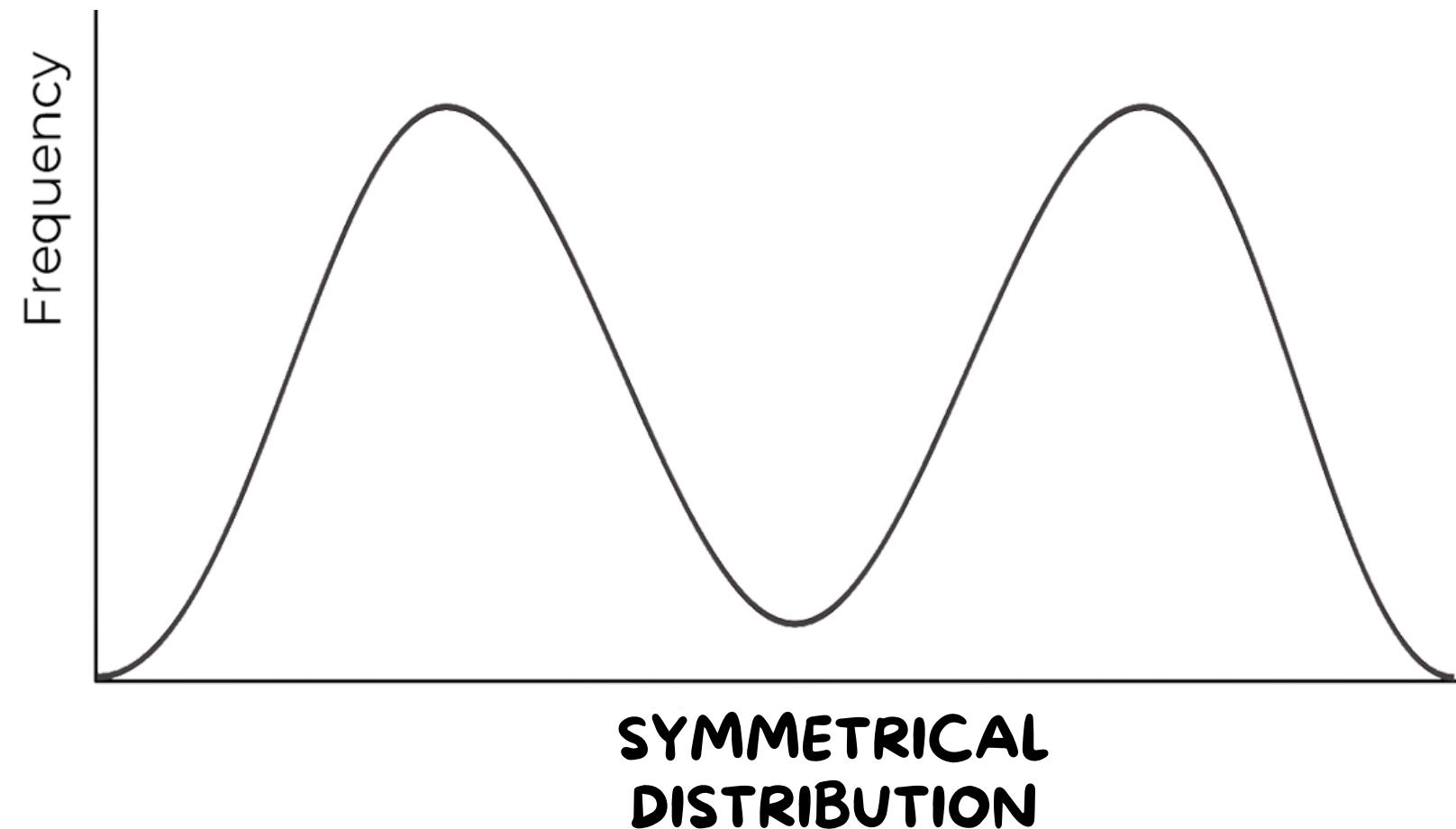
MEDIAN

MODE

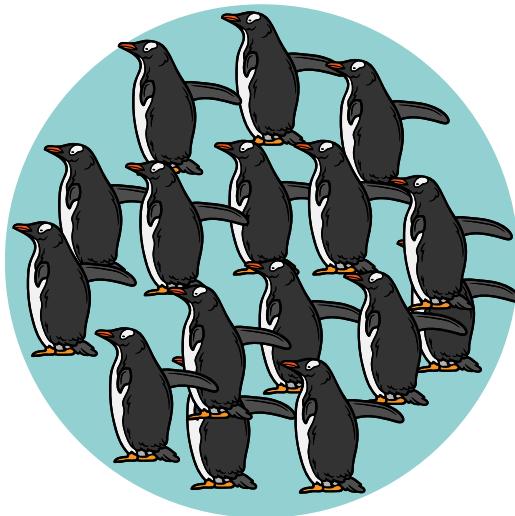
QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



# ESTIMATES OF LOCATION MEASURE OF CENTRAL TENDENCY



SAMPLE

$$\bar{x} = \frac{\sum x}{n}$$

Mean:

- sensitive to outliers
- “balance” point

Median:

- not sensitive to outliers
- cuts data in half

Mode:

The observation with the highest frequency

MEAN

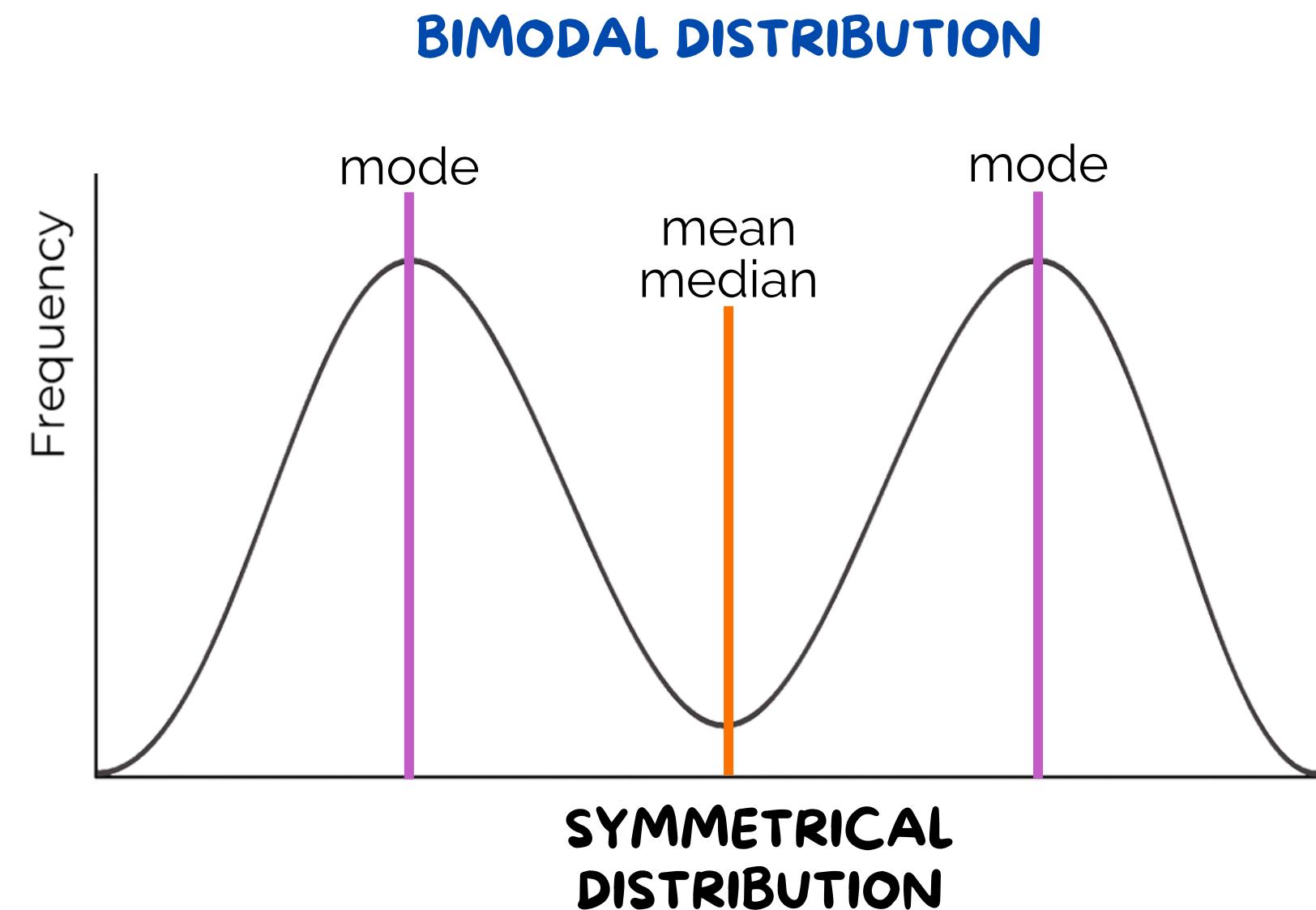
MEDIAN

MODE

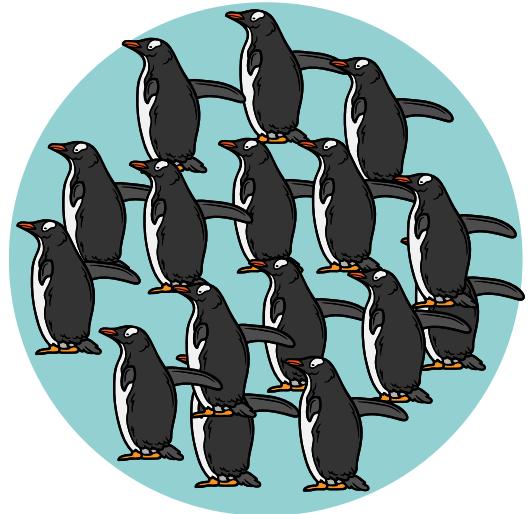
QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



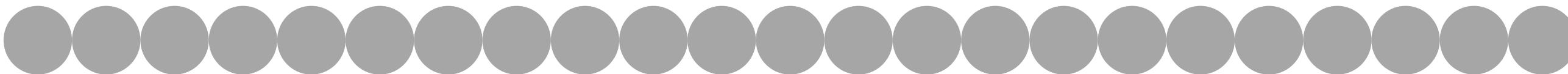
# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION



SAMPLE

[4, 7, 8, ..., 178, 180, 189]

$n = 23$



MEAN

MEDIAN

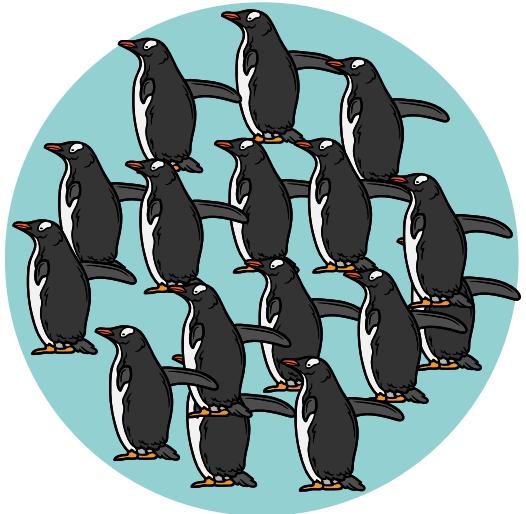
MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV

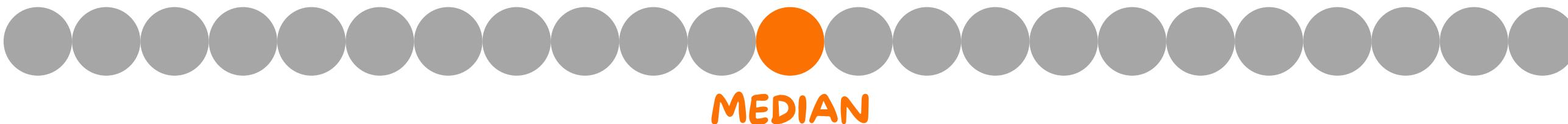
# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION



SAMPLE

[4, 7, 8, ..., 178, 180, 189]

$n = 23$



MEAN

MEDIAN

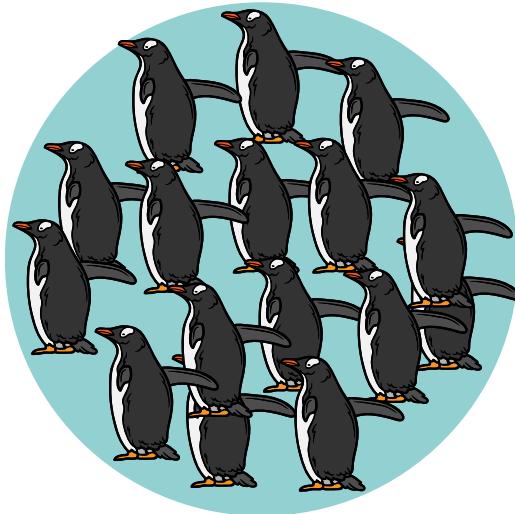
MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV

# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION



SAMPLE

MEAN

MEDIAN

MODE

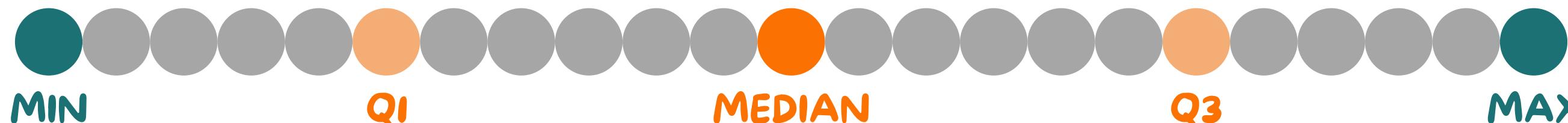
QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV

[4, 7, 8, ..., 178, 180, 189]

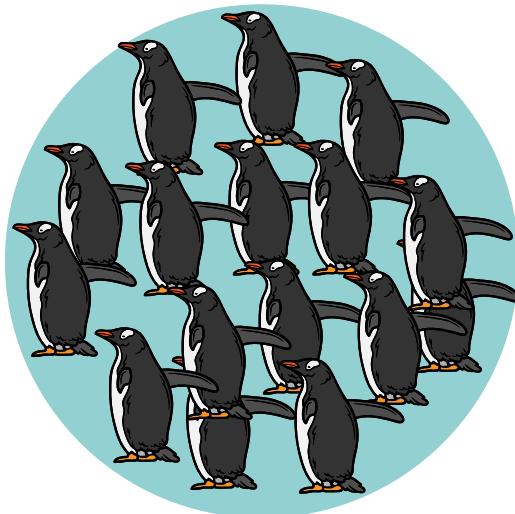
$n = 23$



First quartile (Q1) : 25% (1/4)  
of observations below

Third quartile (Q3) : 75% (3/4)  
of observations below

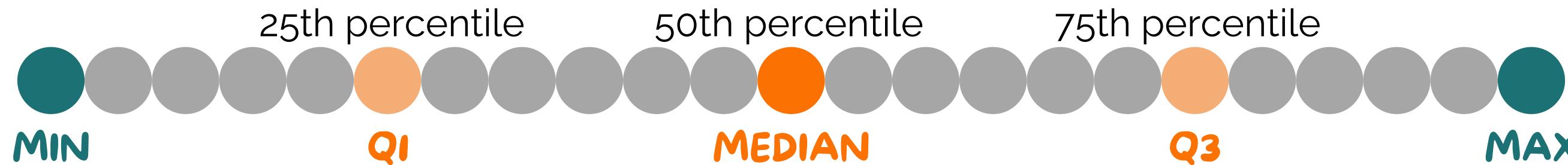
# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION



SAMPLE

[4, 7, 8, ..., 178, 180, 189]

$n = 23$



First quartile (Q1) : 25% (1/4)  
of observations below

Third quartile (Q3) : 75% (3/4)  
of observations below

MEAN

MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV

# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION

MEAN

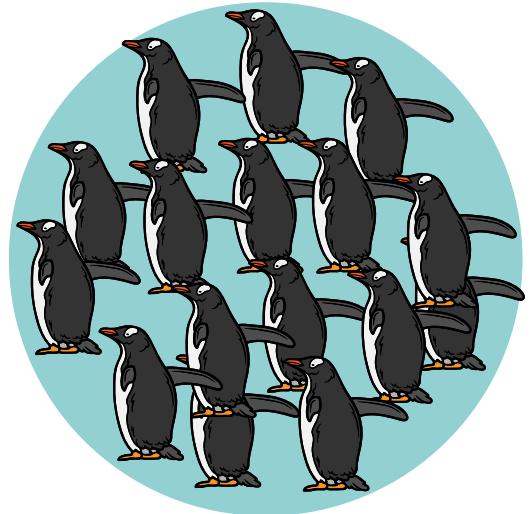
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

[2, 2, 5, 6, 9, 10, 13]

2 2 5 6 9 10 13

# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION

MEAN

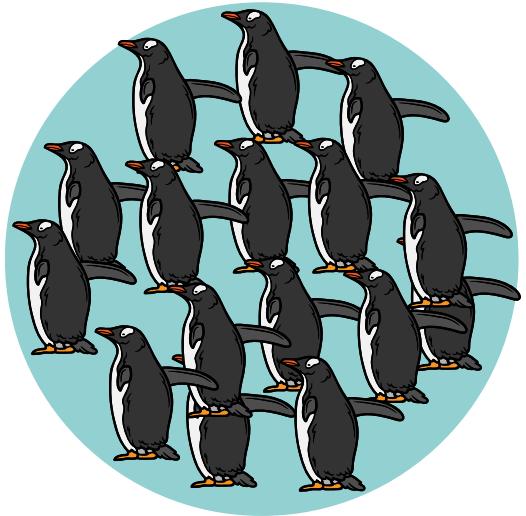
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

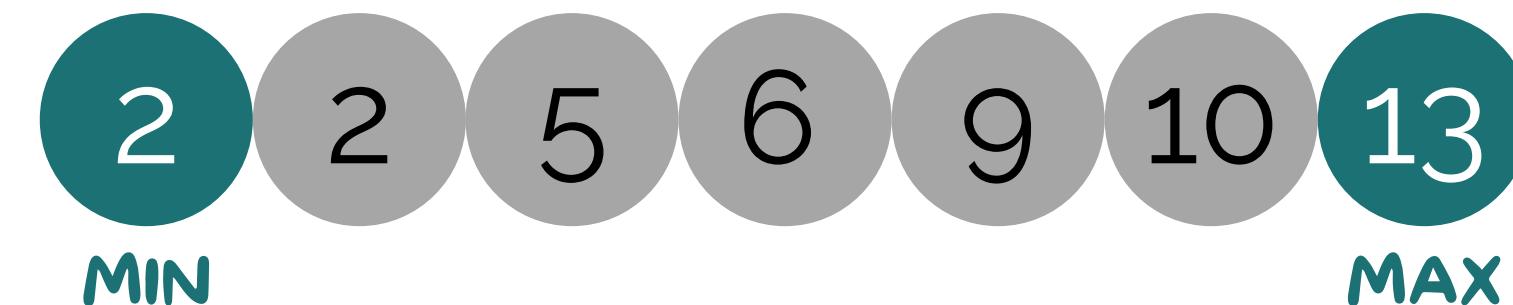
VARIANCE  
&  
STD DEV



SAMPLE

[2, 2, 5, 6, 9, 10, 13]

Range: MAX - MIN = 13 - 2 = 11



# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION

MEAN

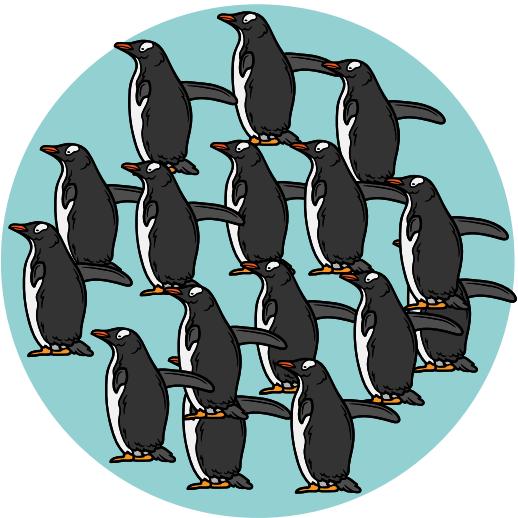
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV

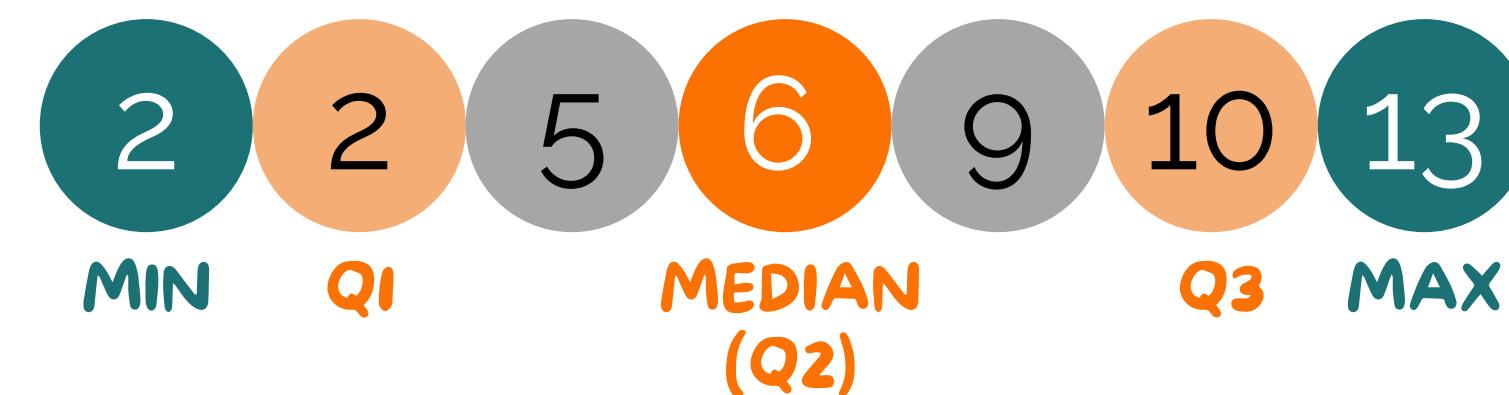


SAMPLE

[2, 2, 5, 6, 9, 10, 13]

Range: MAX - MIN = 13 - 2 = 11

IQR: Q3 - Q1 = 10 - 2 = 8



# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION

MEAN

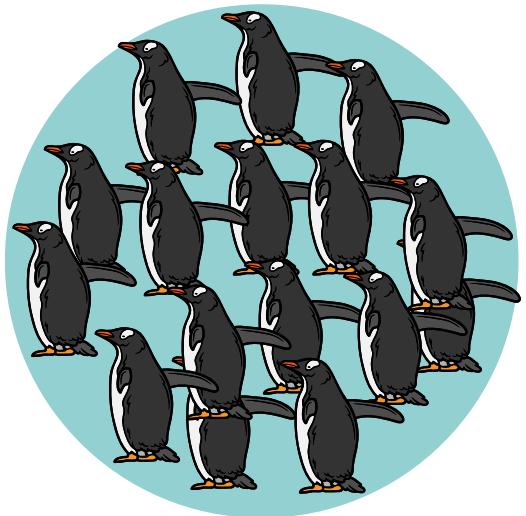
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV

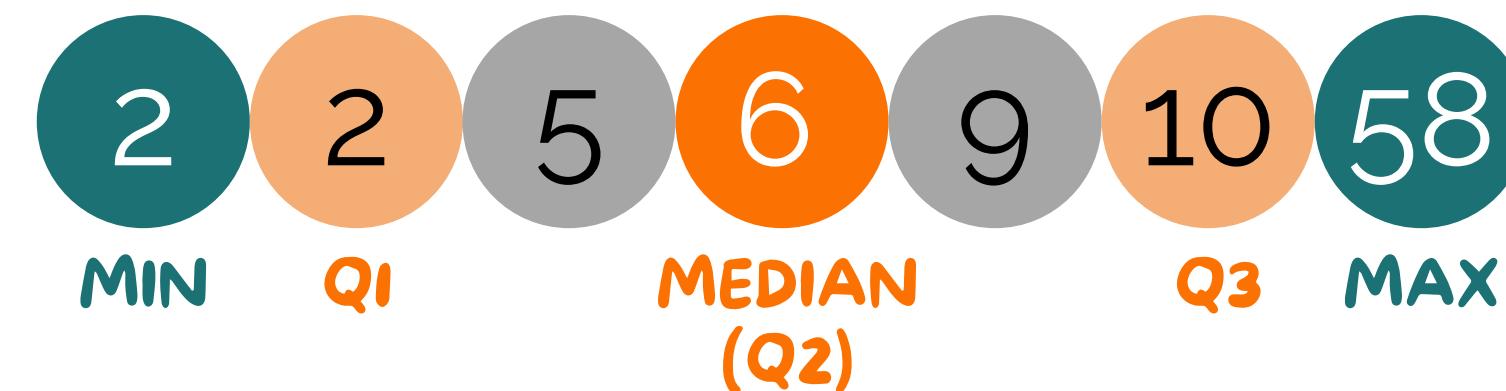


SAMPLE

[2, 2, 5, 6, 9, 10, 58]

Range:  $\text{MAX} - \text{MIN} = 58 - 2 = 56$  Range is sensitive to outliers

IQR:  $\text{Q3} - \text{Q1} = 10 - 2 = 8$  The middle 50% of the ordered data  
Not sensitive to outliers



# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION

MEAN

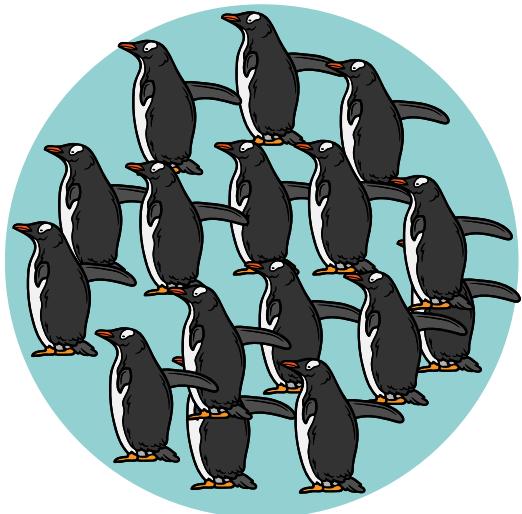
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

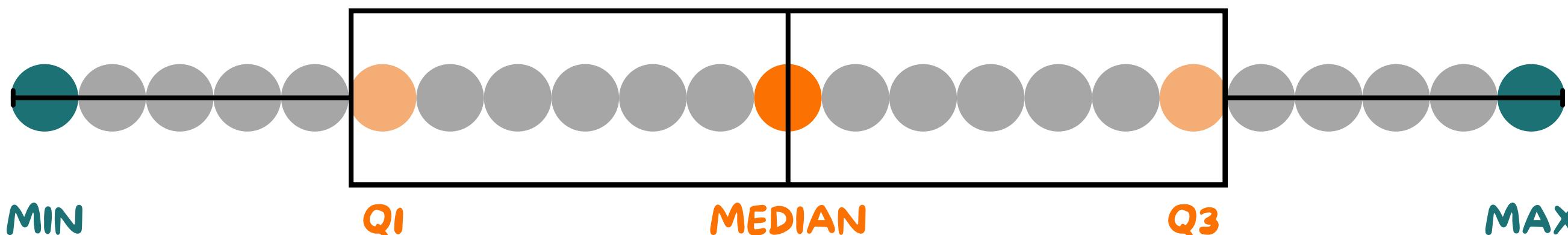
VARIANCE  
&  
STD DEV



SAMPLE

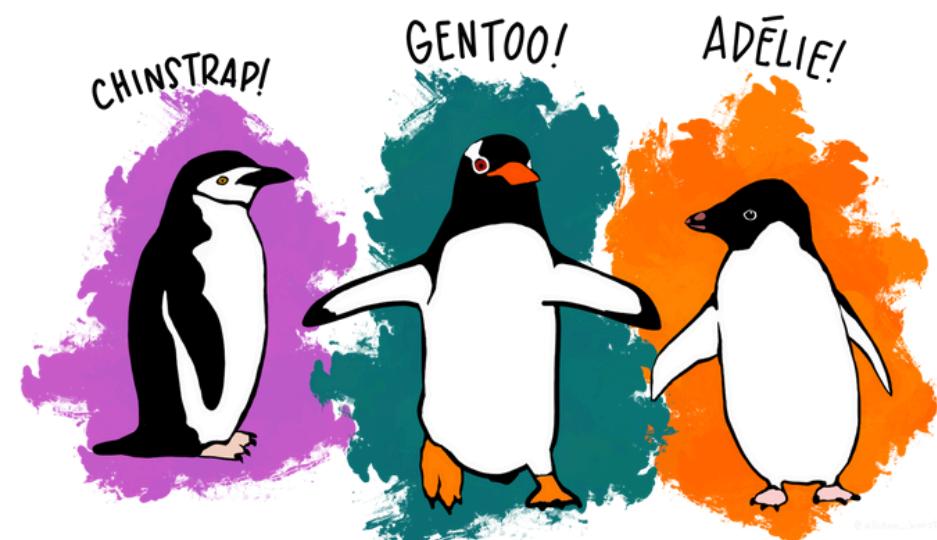
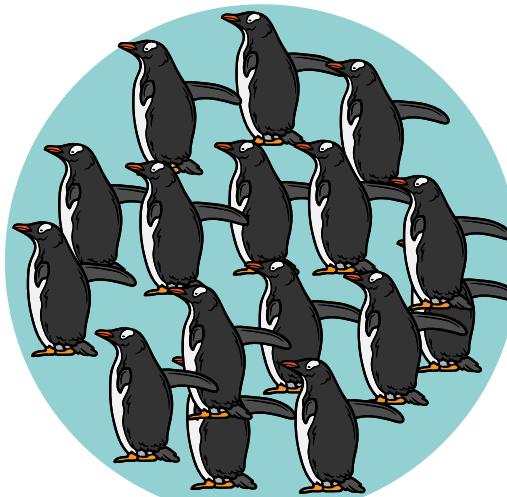
$n = 23$

BOXPLOT



The box-and-whisker plot was first introduced in 1970 by John Tukey

# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION



SAMPLE

MEAN

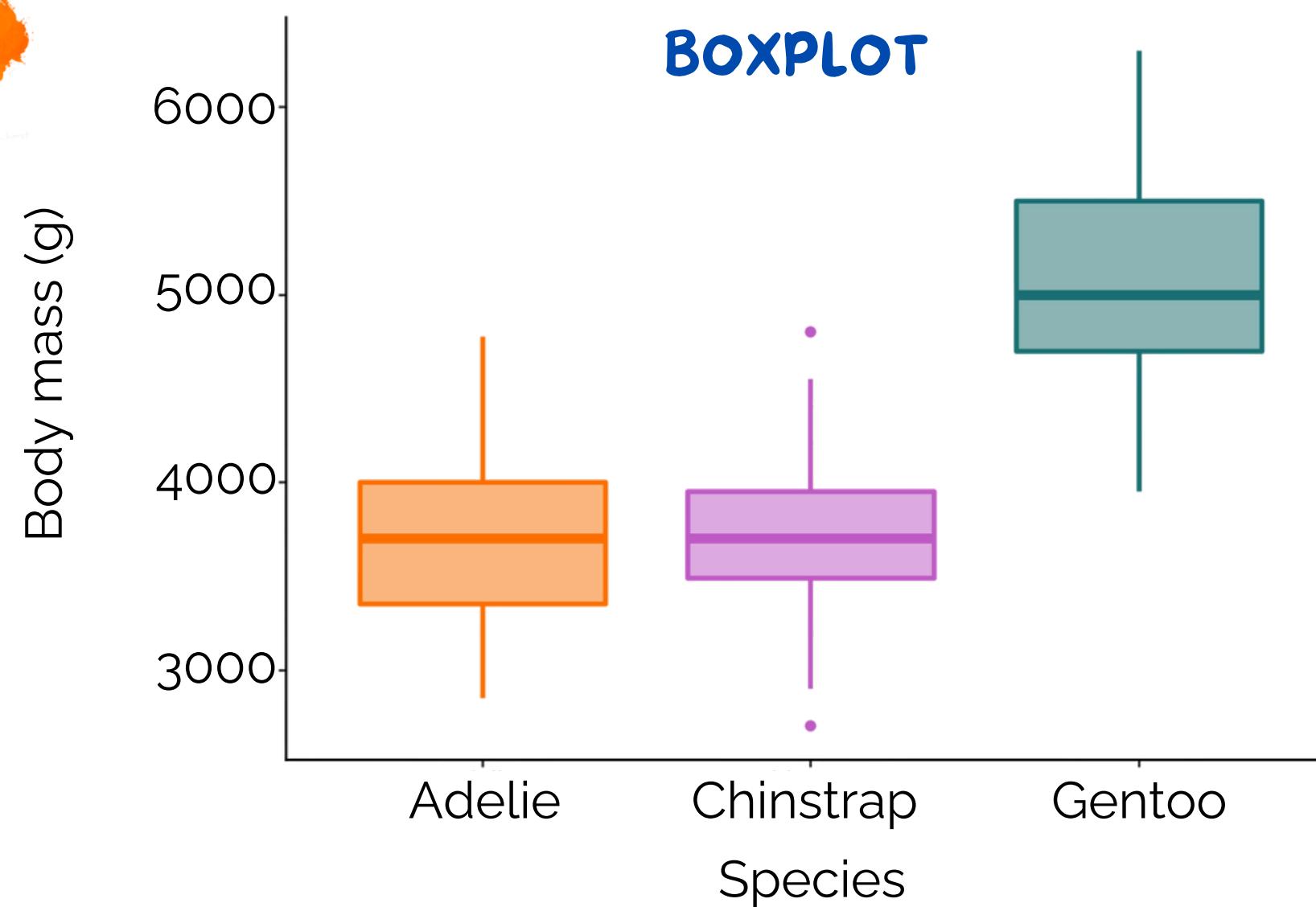
MEDIAN

MODE

QUANTILES

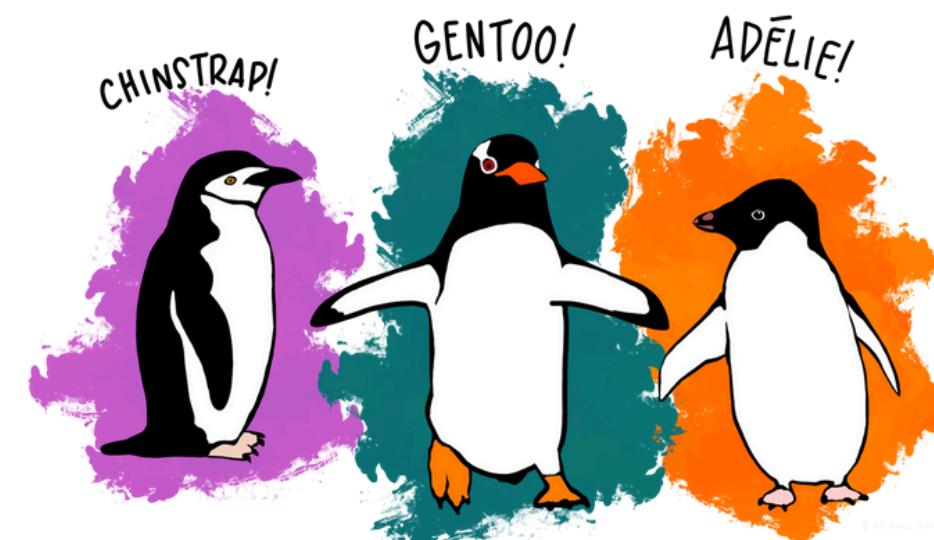
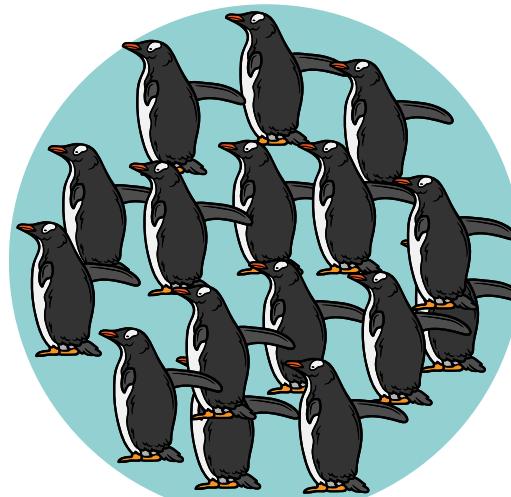
RANGE  
&  
IQR

VARIANCE  
&  
STD DEV

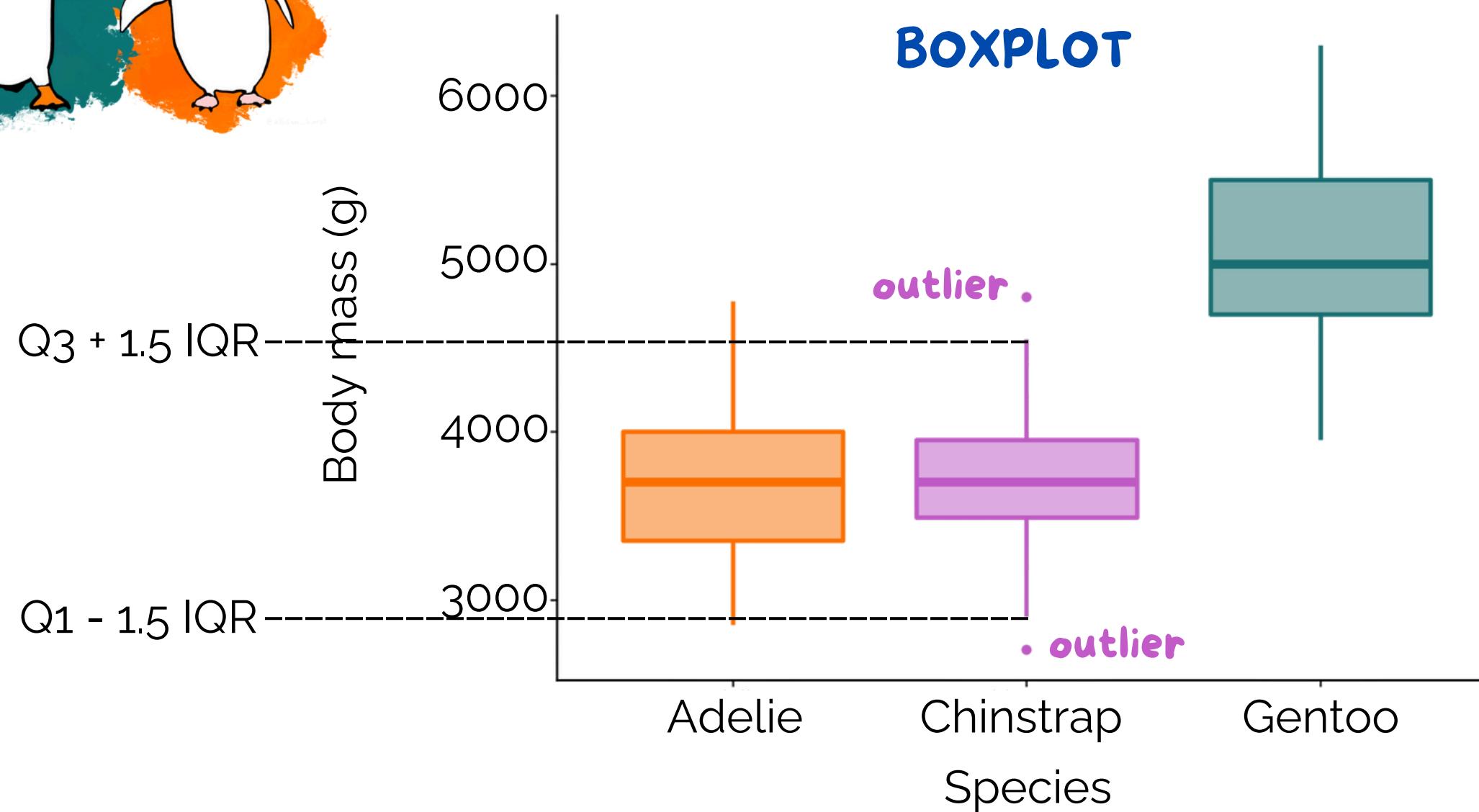


These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION



SAMPLE



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION

MEAN

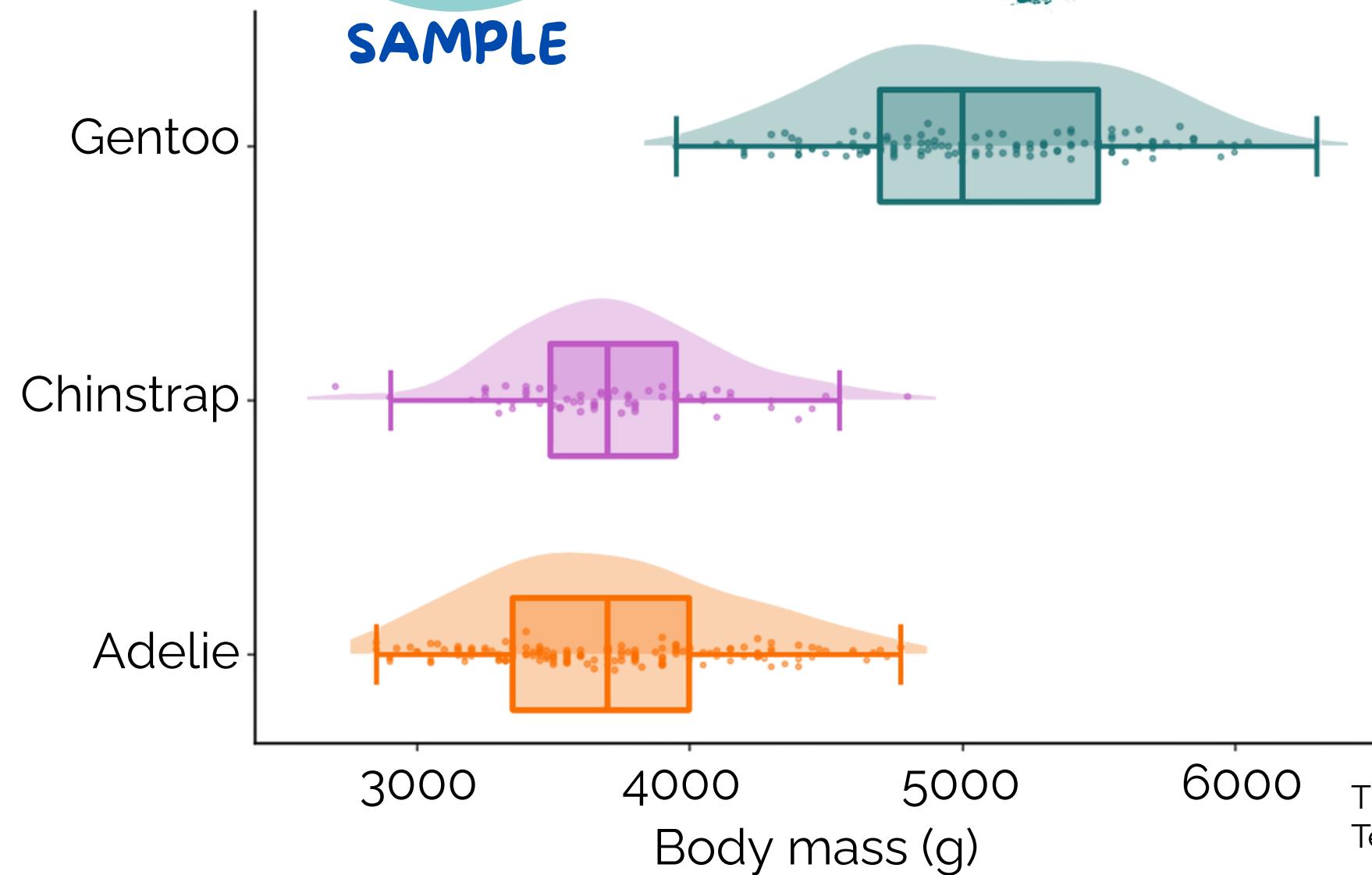
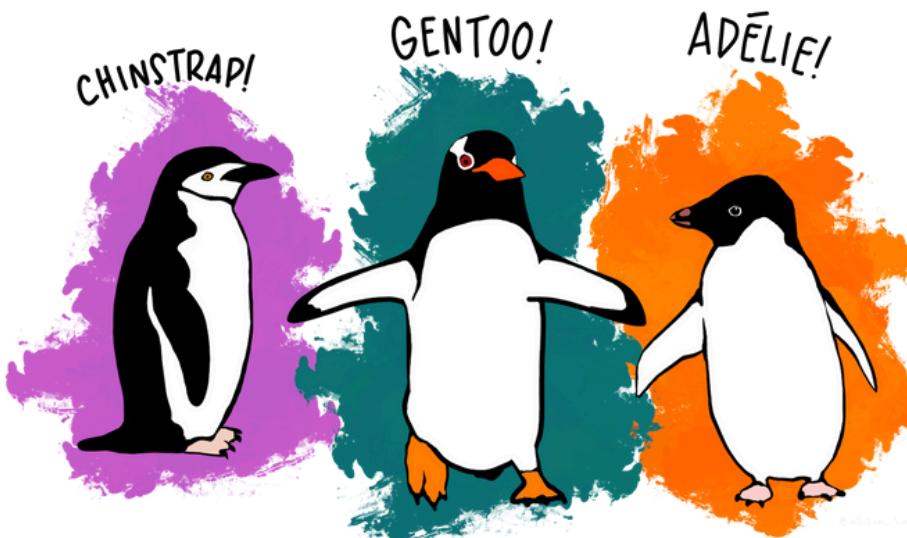
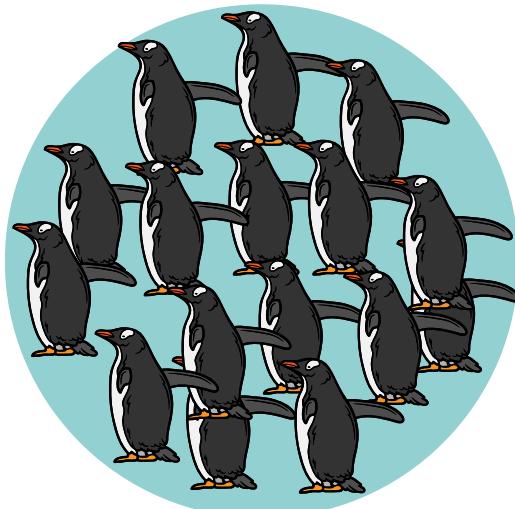
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION

MEAN

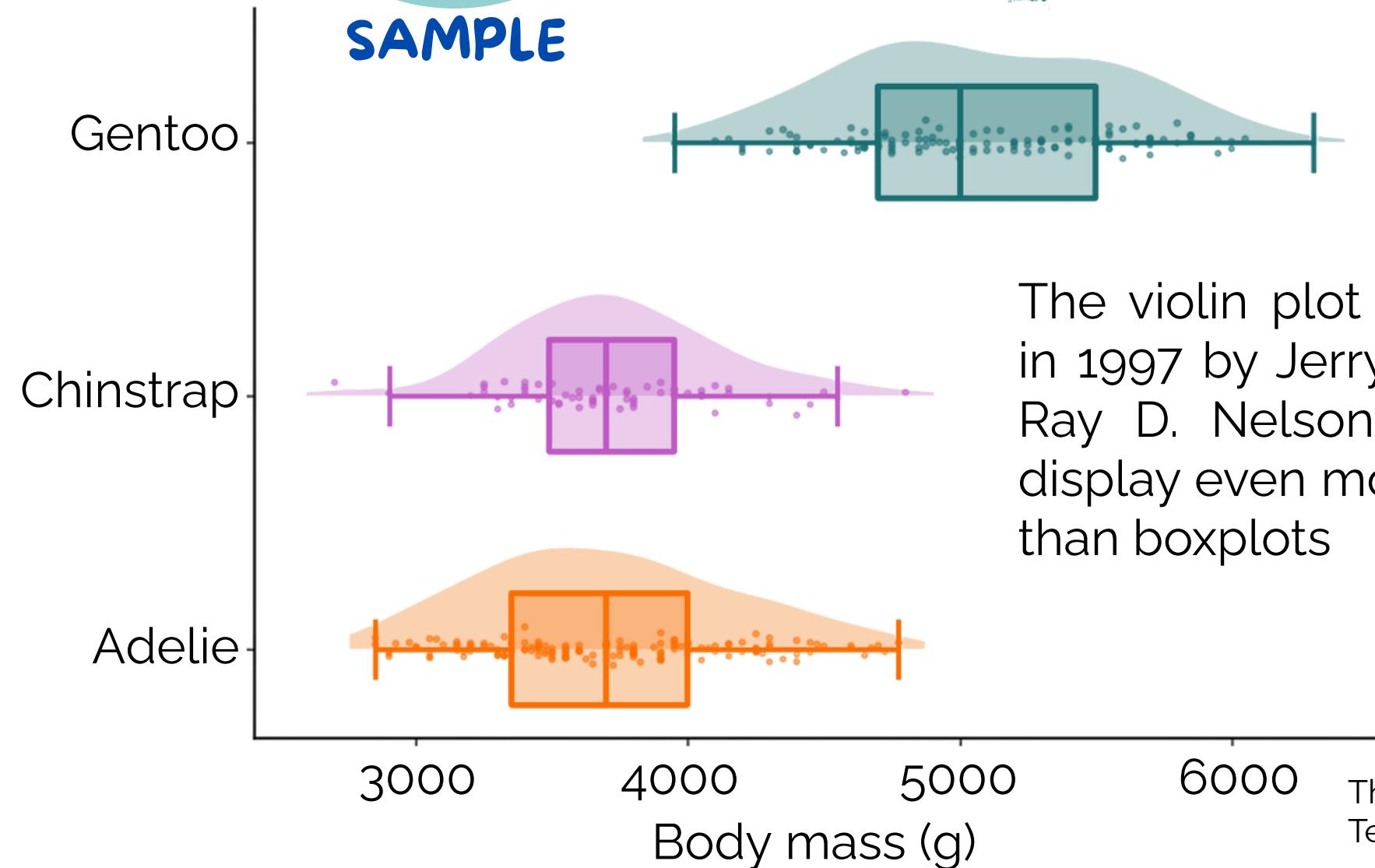
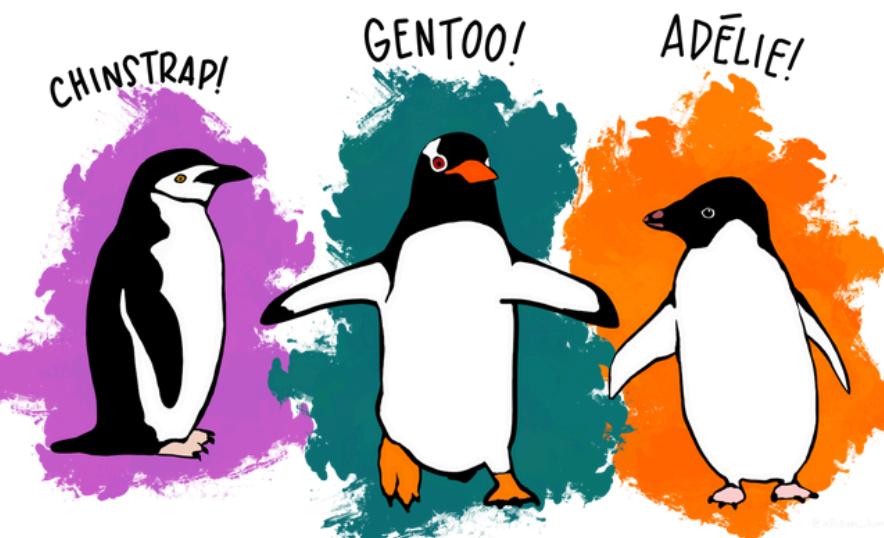
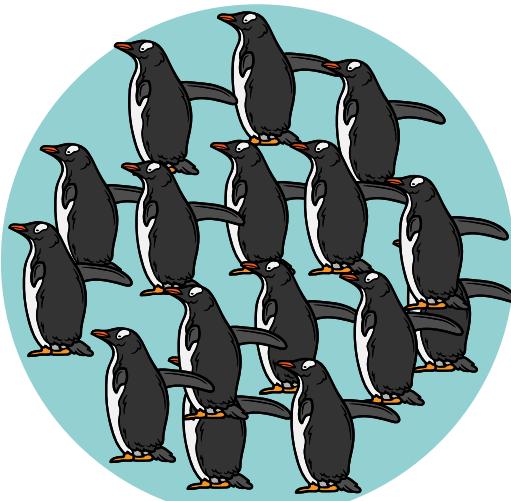
MEDIAN

MODE

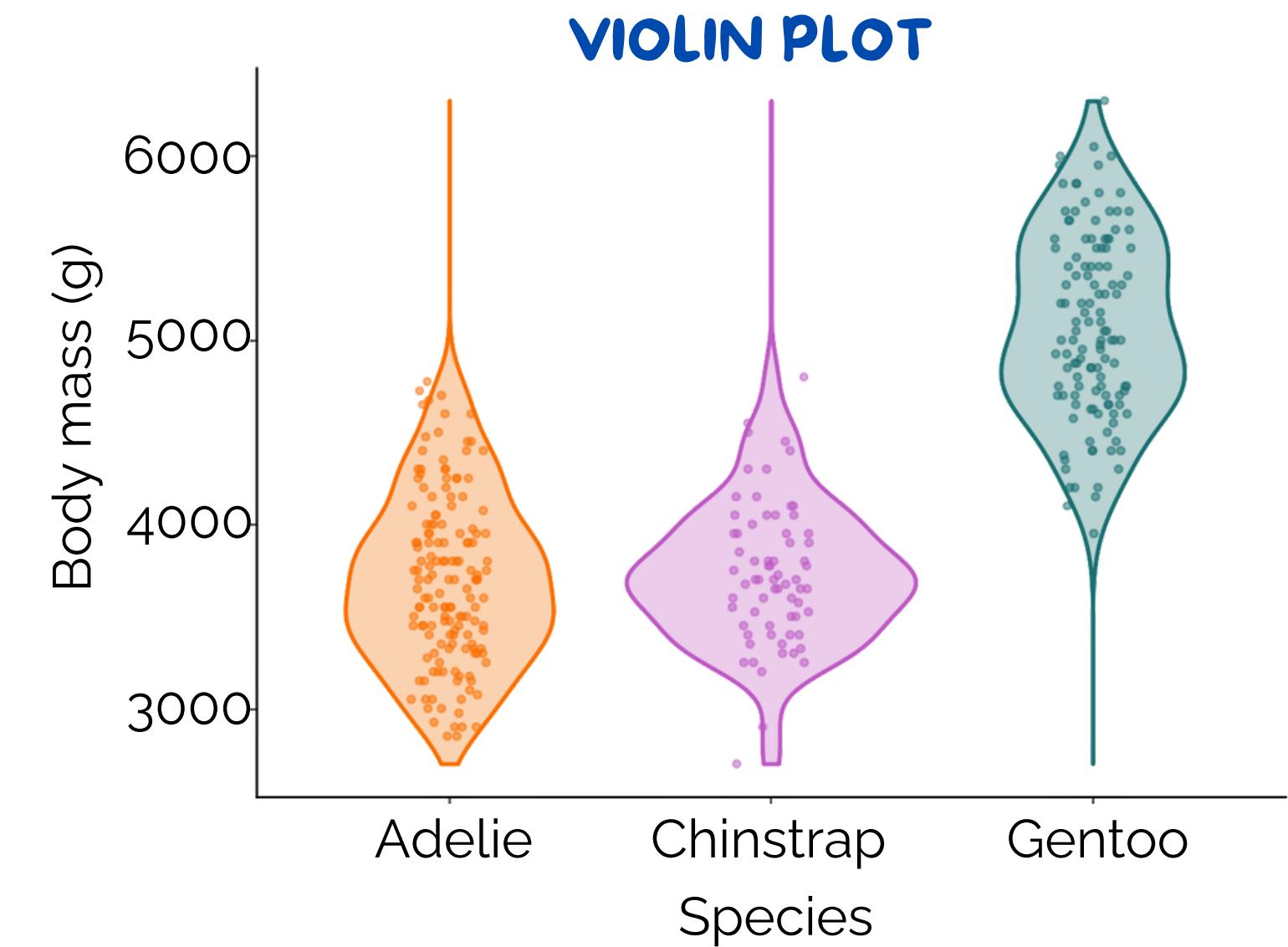
QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



The violin plot was proposed in 1997 by Jerry L. Hintze and Ray D. Nelson as a way to display even more information than boxplots



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# ESTIMATES OF LOCATION DESCRIBING THE DISTRIBUTION

MEAN

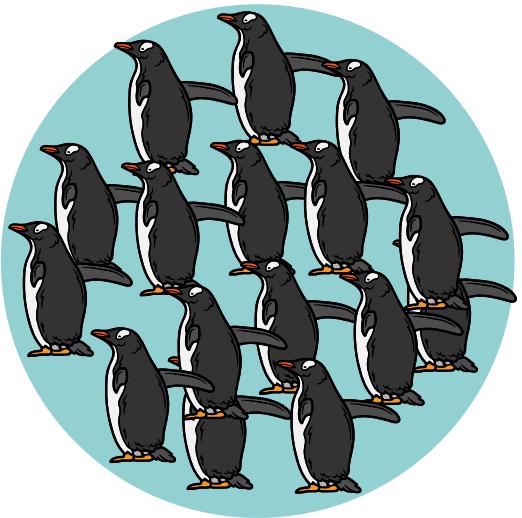
MEDIAN

MODE

QUANTILES

RANGE  
&  
IQR

VARIANCE  
&  
STD DEV



SAMPLE

$$\bar{x} = \frac{\sum_{i=1}^n x_i}{n}$$

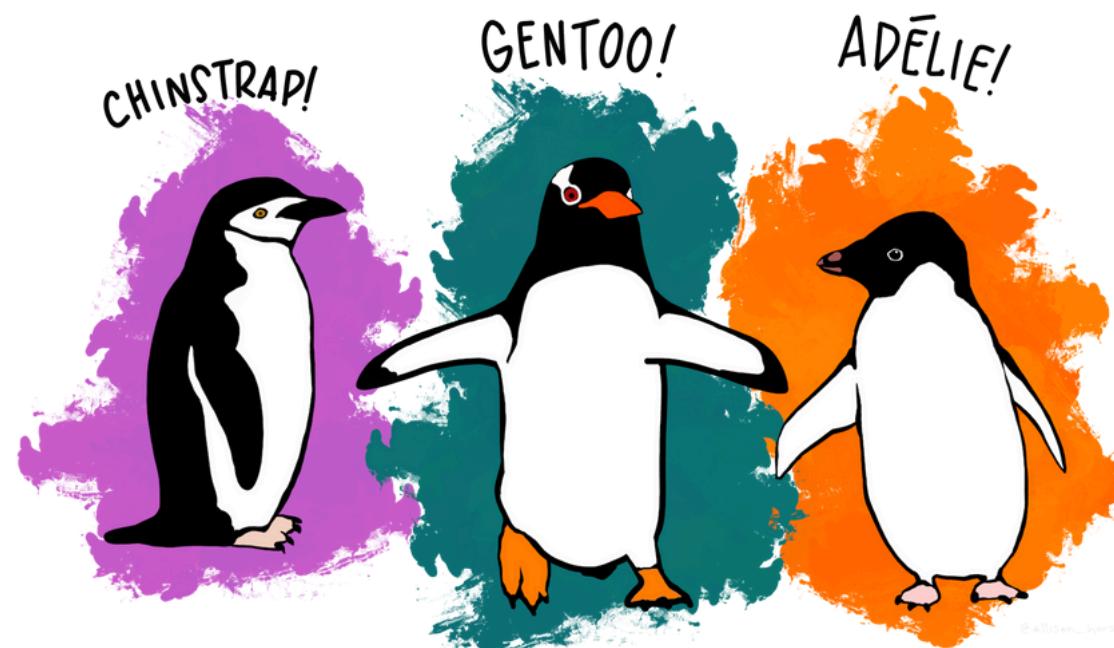
$$s^2 = \frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n - 1}$$

VARIANCE

$$s = \sqrt{s^2} = \sqrt{\frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n - 1}}$$

STANDARD DEVIATION

# DATA VISUALIZATION



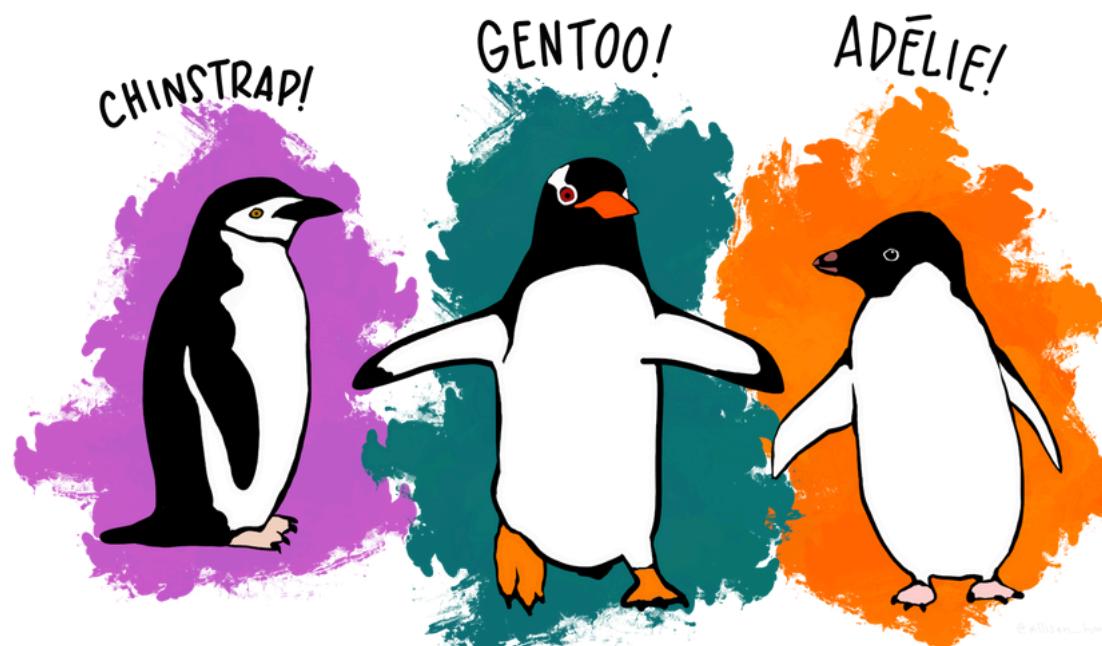
The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

8 variables (n = 344 penguins)

<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

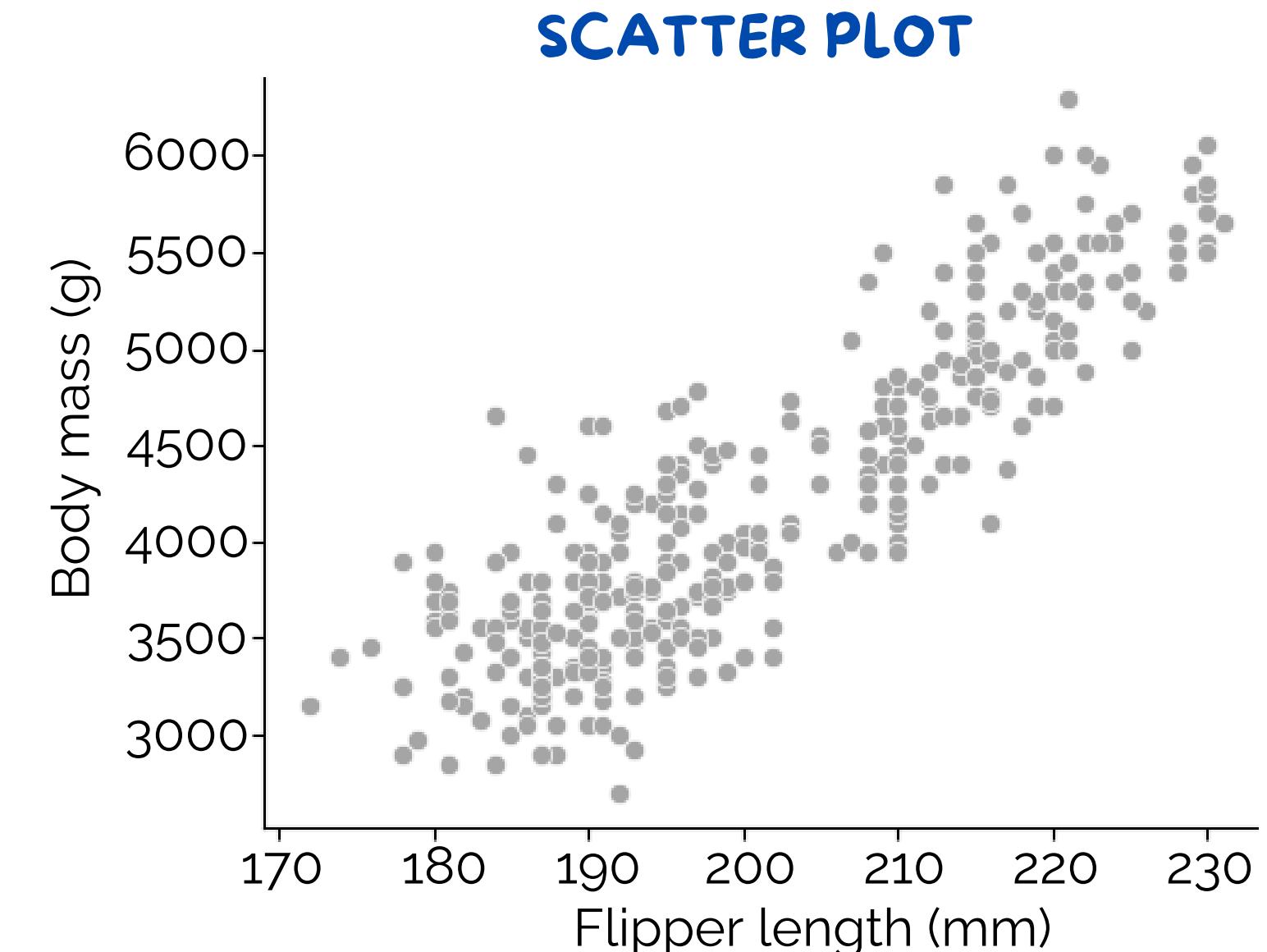
# DATA VISUALIZATION



8 variables (n = 344 penguins)

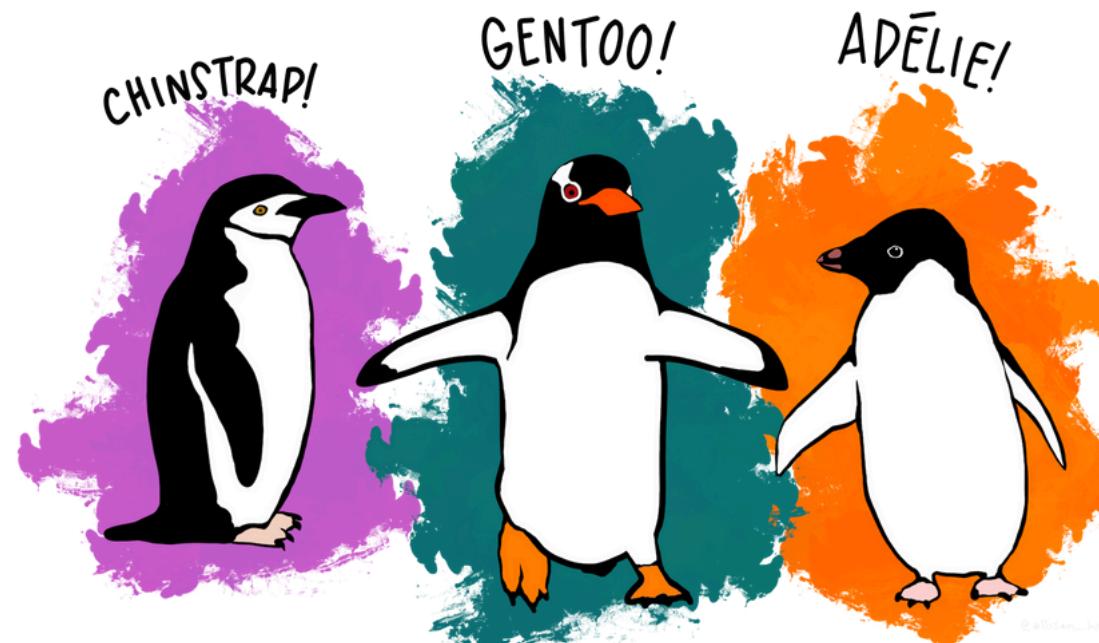
<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# DATA VISUALIZATION

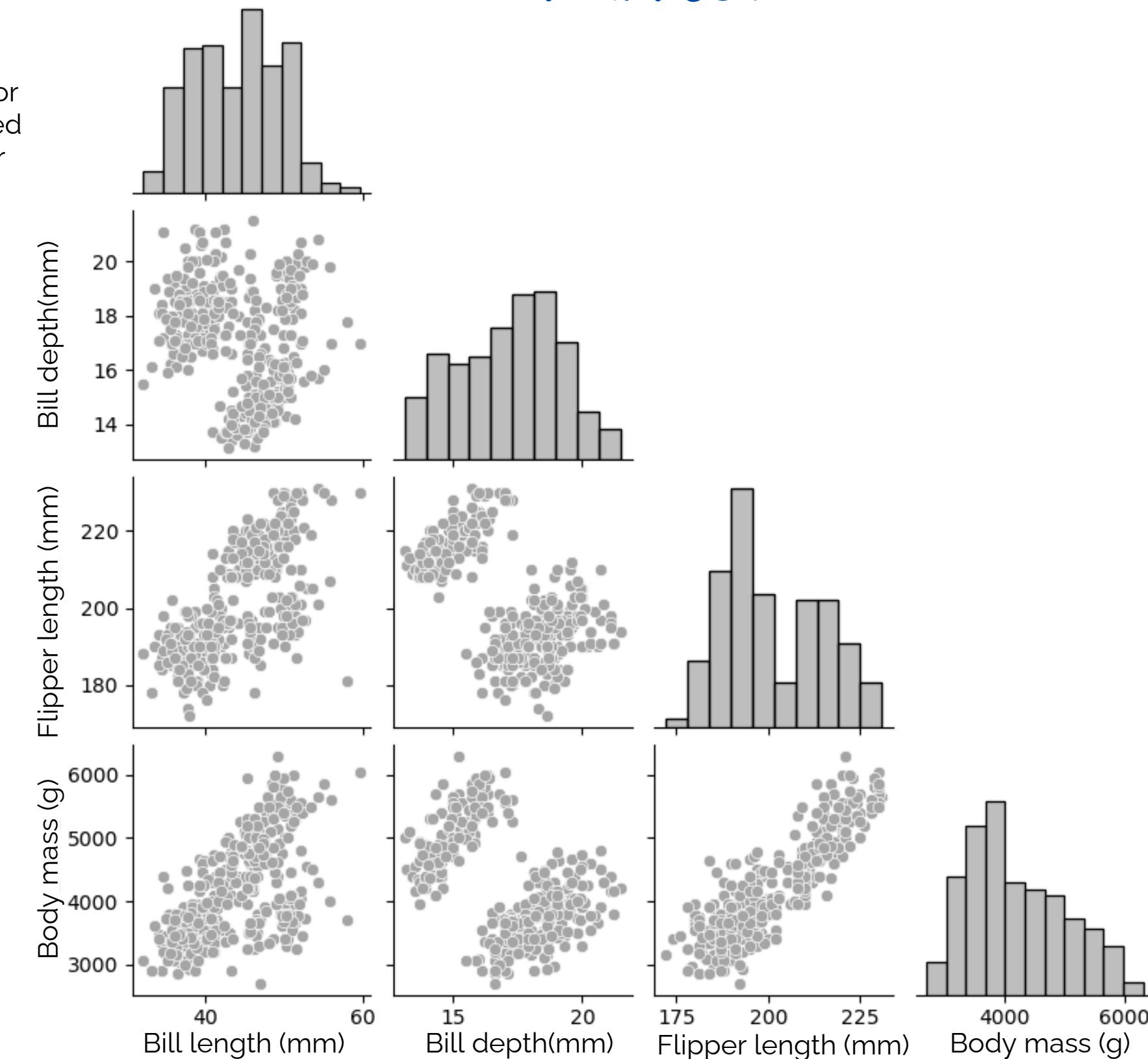


8 variables (n = 344 penguins)

<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

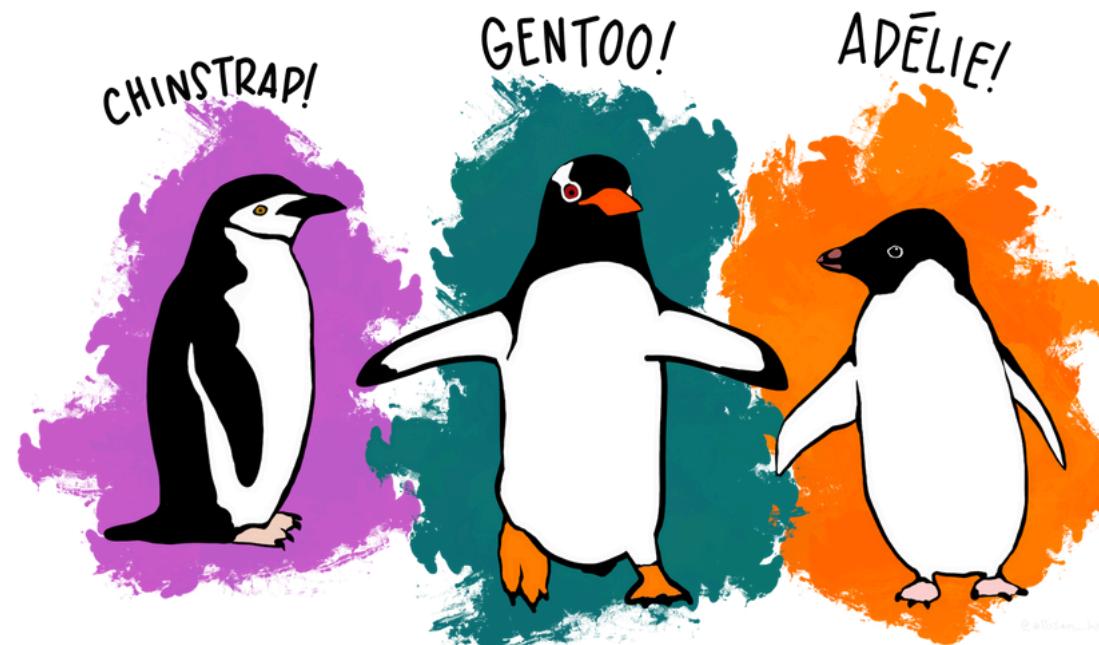
The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

## PAIRPLOT



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

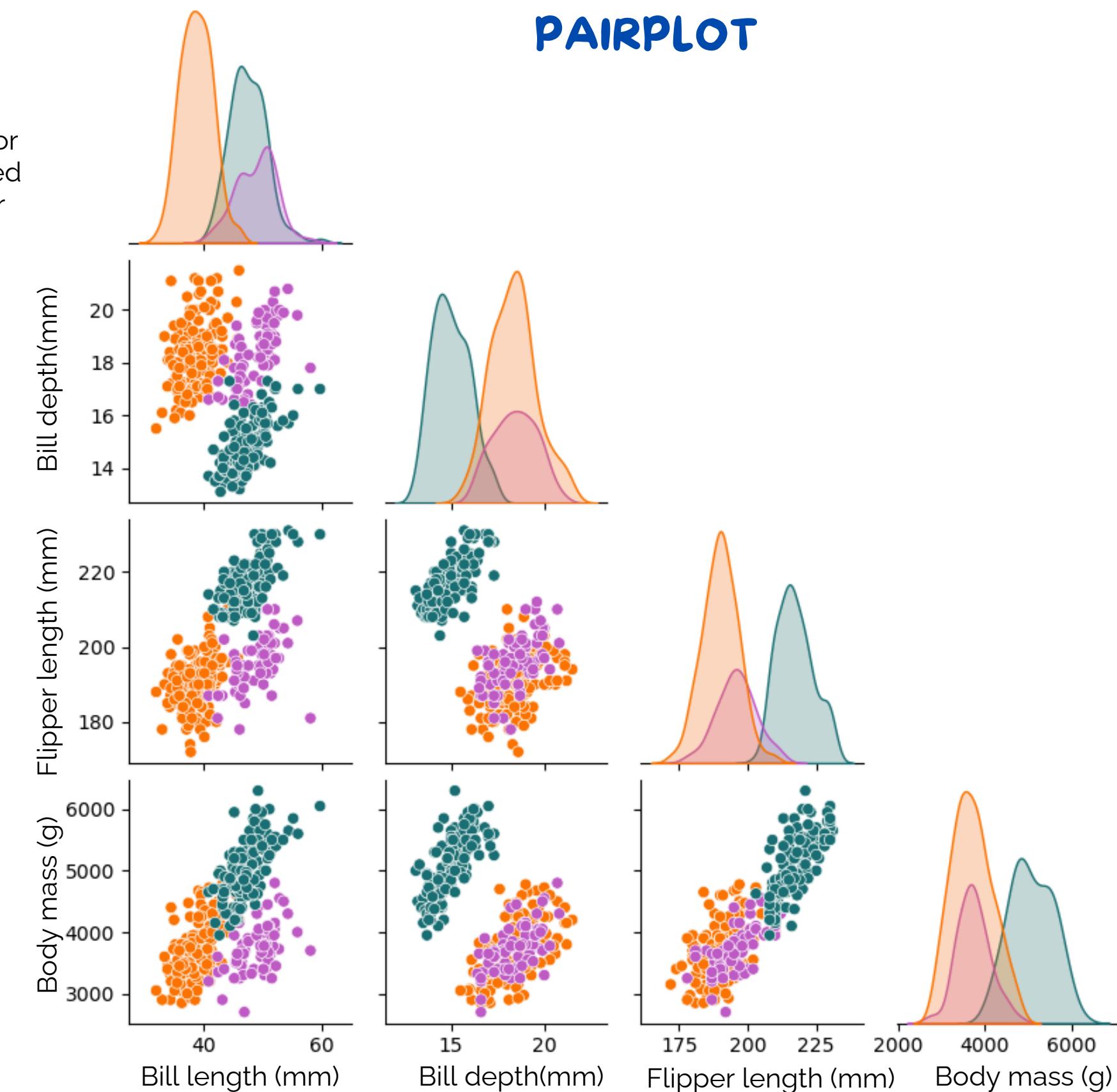
# DATA VISUALIZATION



8 variables (n = 344 penguins)

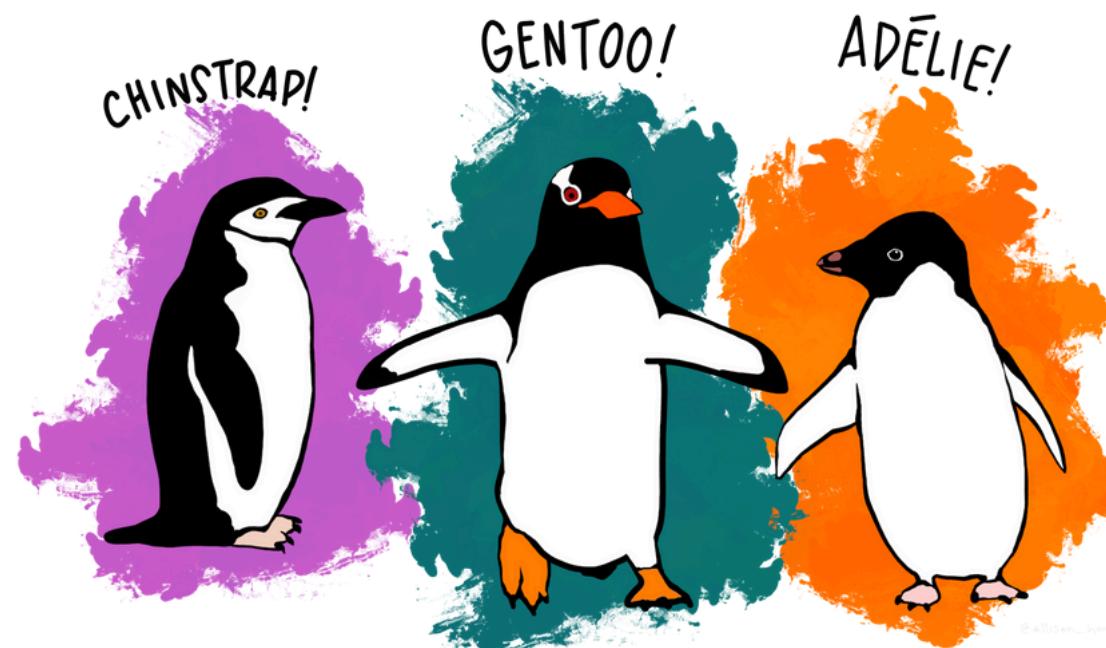
<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

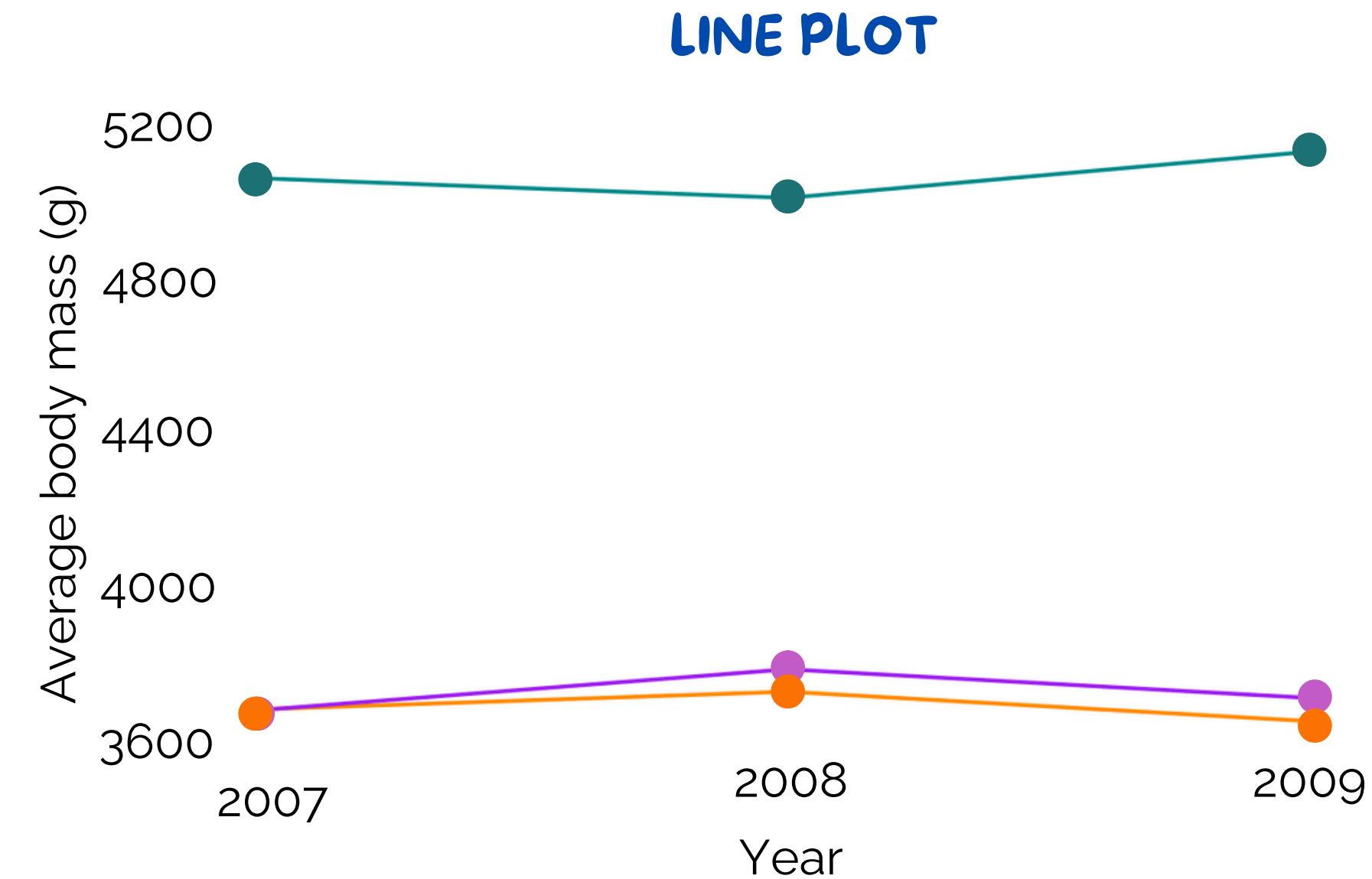
# DATA VISUALIZATION



8 variables (n = 344 penguins)

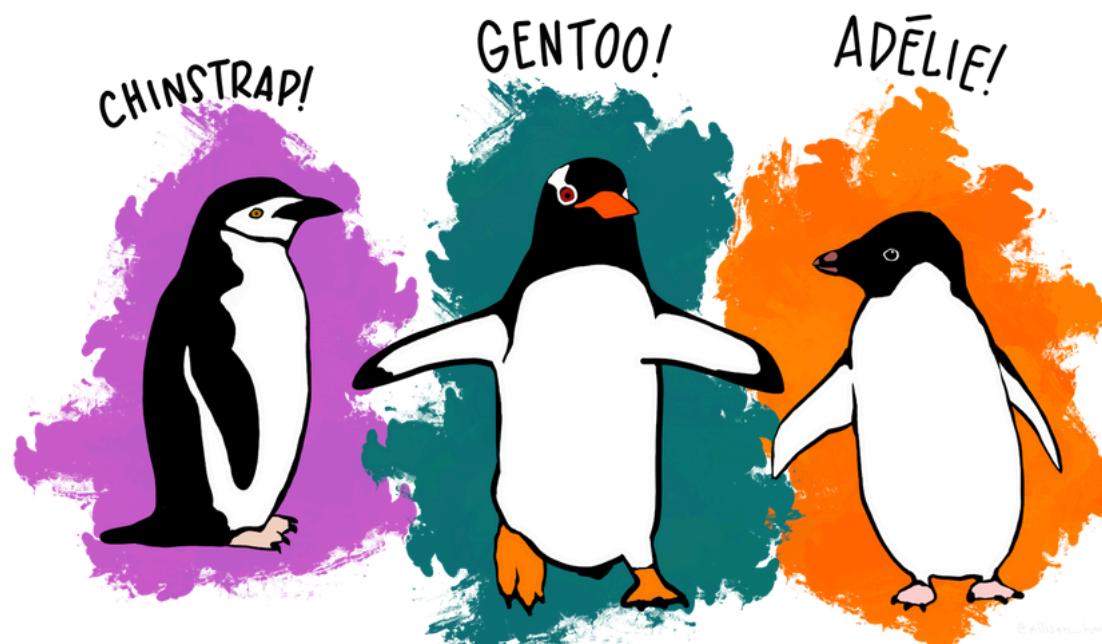
<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

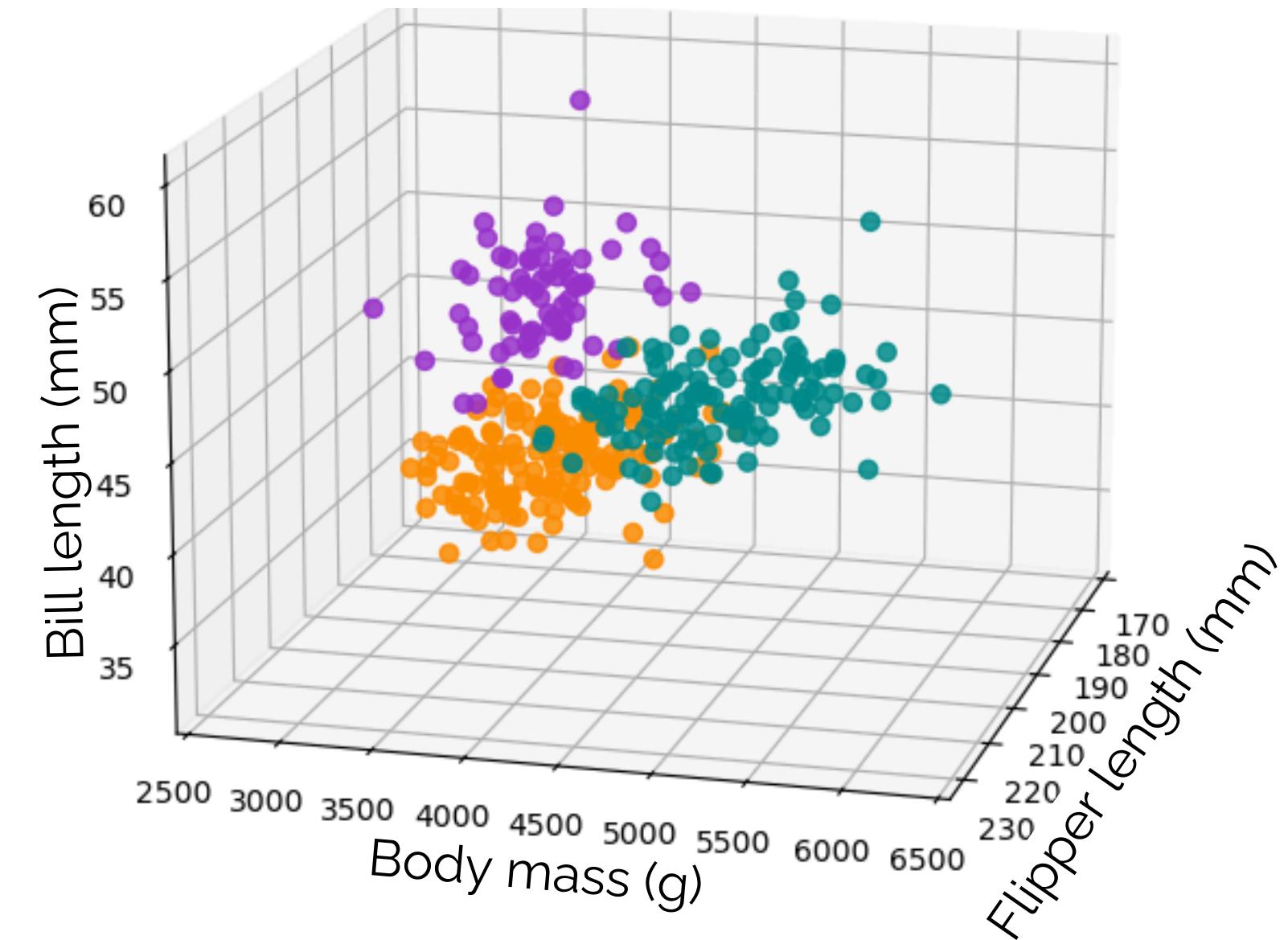
# DATA VISUALIZATION



8 variables (n = 344 penguins)

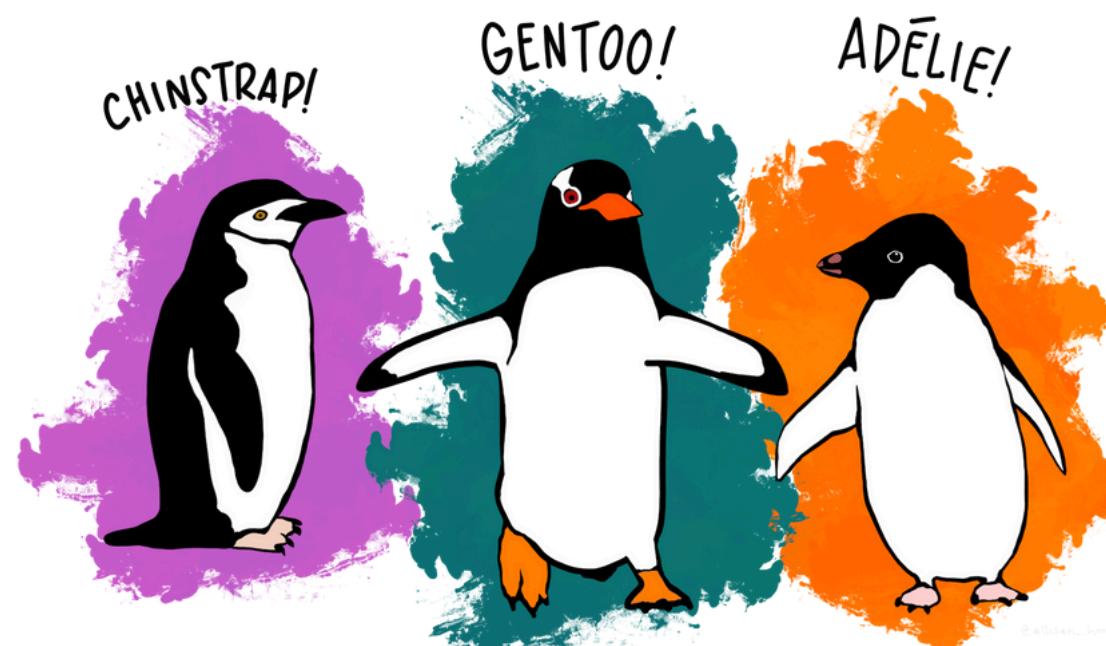
<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.

# DATA VISUALIZATION

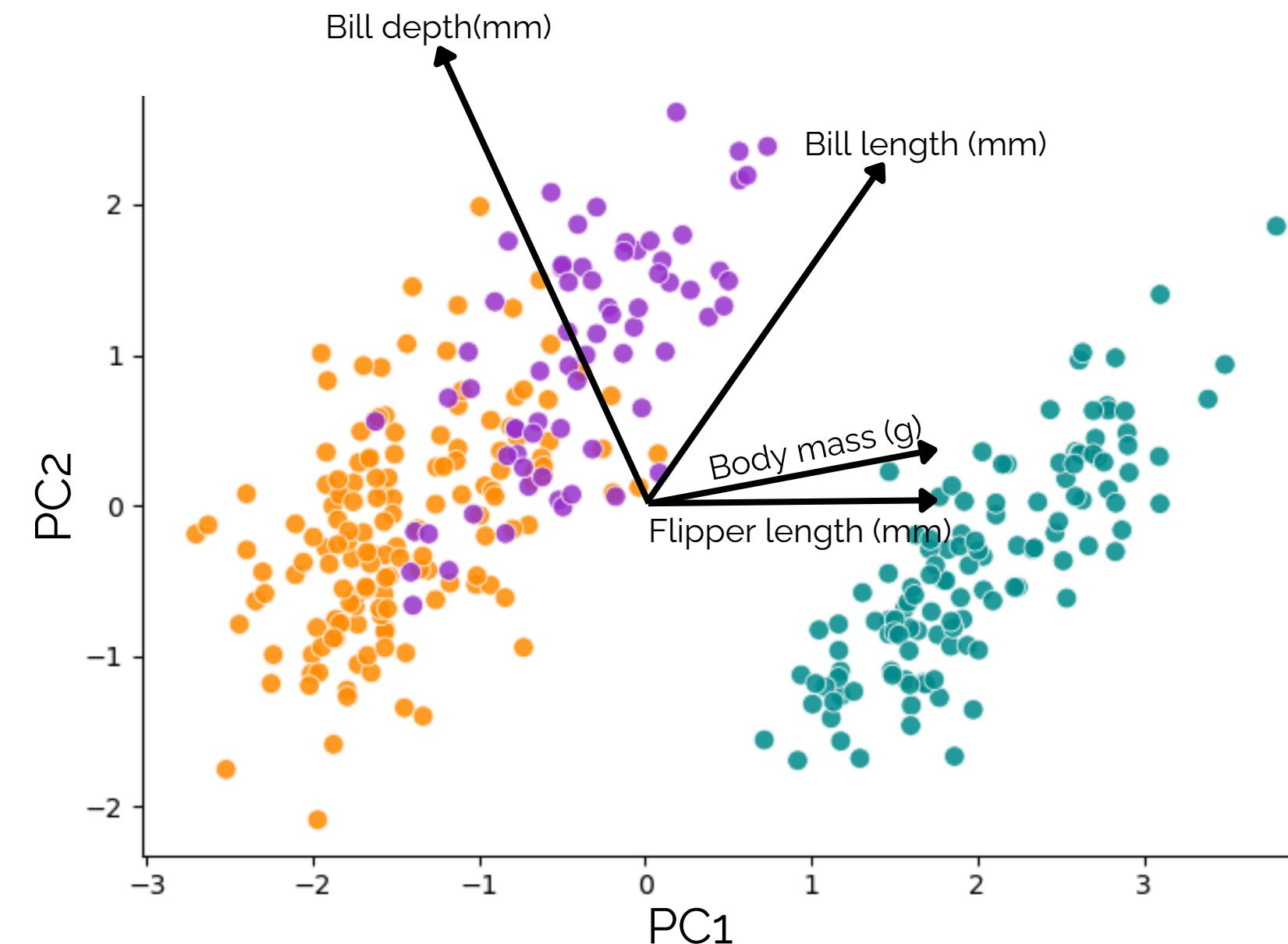


8 variables (n = 344 penguins)

<b>Species</b>	Penguin species (Adélie, Chinstrap, Gentoo)
<b>Island</b>	Island in the Palmer Archipelago where observed
<b>Bill length (mm)</b>	Length of the penguin's bill (mm)
<b>Bill depth (mm)</b>	Depth (thickness) of the penguin's bill (mm)
<b>Flipper length (mm)</b>	Length of the penguin's flipper (mm)
<b>Body mass (g)</b>	Body mass of the penguin (g)
<b>Sex</b>	Male or female (some values missing)
<b>Year</b>	Year of observation (2007–2009)

The **palmerpenguins** data contains size measurements for three penguin species observed on three islands in the Palmer Archipelago, Antarctica.

## DIMENSIONALITY REDUCTION



These data were collected from 2007 - 2009 by Dr. Kristen Gorman with the Palmer Station Long Term Ecological Research Program, part of the US Long Term Ecological Research Network.