

# Simple Linear Regression

## Prediction

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# Topics



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- Predict the response given a value of the predictor variable

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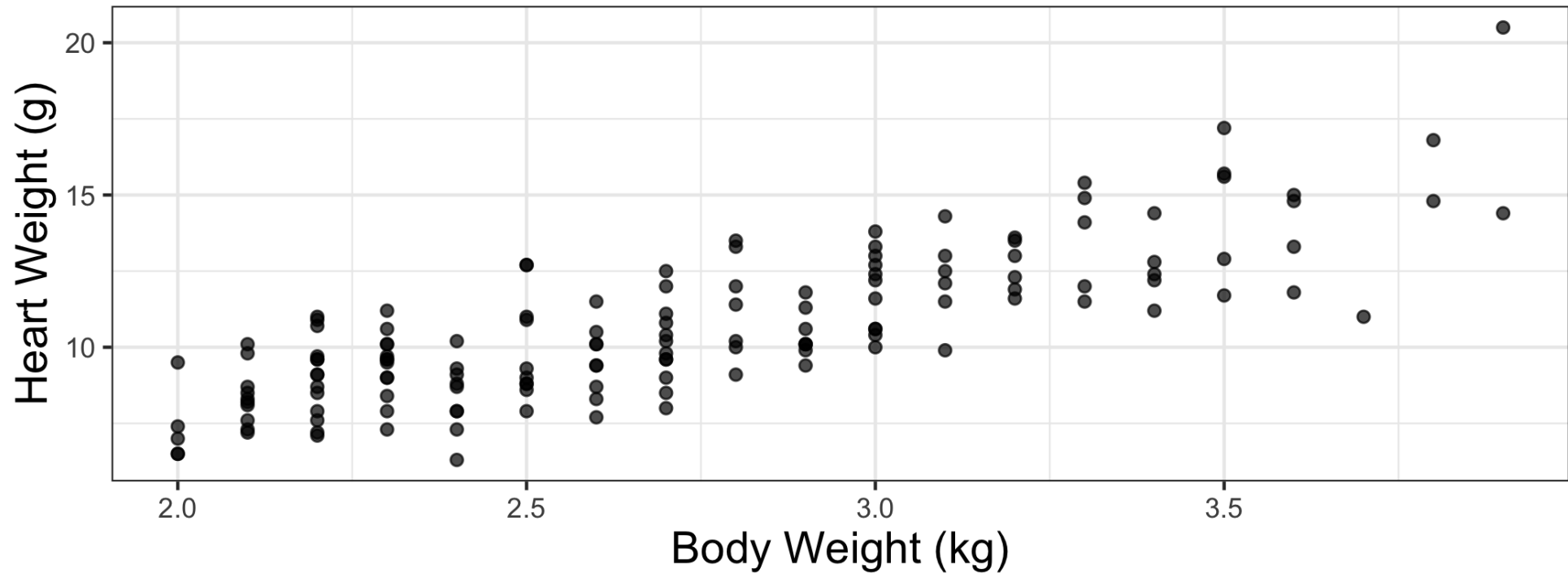
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- Use intervals to quantify the uncertainty in the predicted values

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- Predict the response given a value of the predictor variable
- Use intervals to quantify the uncertainty in the predicted values
- Define *extrapolation* and why we should avoid it

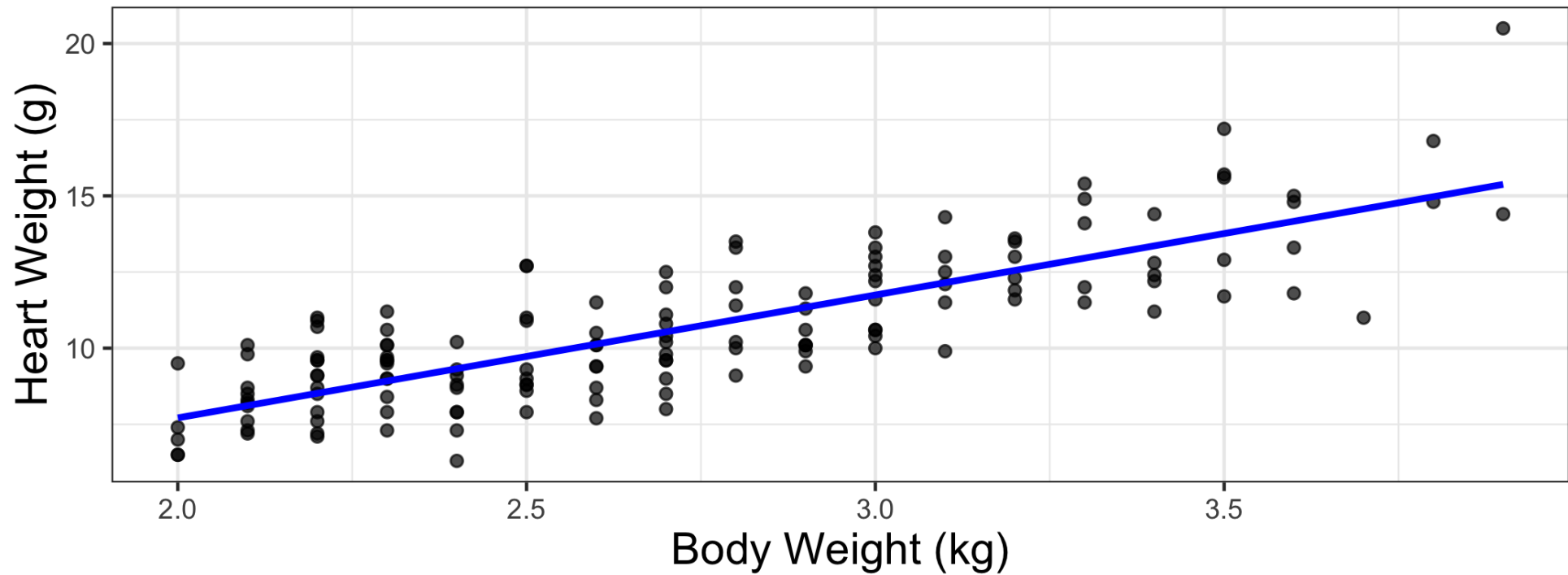
# Cats data

The data set contains the heart weight (**Hwt**) and body weight (**Bwt**) for 144 domestic cats.



# Cats data

We want to fit a model so we can use a cat's body weight to predict how much its heart weighs.





# The model

$$\hat{Hwt} = -0.357 + 4.034 \times Bwt$$

term	estimate	std.error	statistic	p.value
(Intercept)	-0.357	0.692	-0.515	0.607
Bwt	4.034	0.250	16.119	0.000

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Predict the response for an individual observation with a value of the predictor equal to  $x_0$

# Calculating a predicted value

My cat Mindy weighs about 3.18 kg (7 lbs).

Based on this model, about how much does her heart weigh?



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Based on this model, about how much does her heart weigh?



$$\begin{aligned}\hat{Hwt} &= -0.357 + 4.034 \times \mathbf{3.18} \\ &= \mathbf{12.471} \text{ g}\end{aligned}$$

# Uncertainty in predictions

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Confidence interval for the mean response

$$\hat{y} \pm t_{n-2}^* \times \mathbf{SE}_{\hat{\mu}}$$



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Prediction interval for an individual observation

$$\hat{y} \pm t_{n-2}^* \times \mathbf{SE}_{\hat{y}}$$

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We are 95% confident that mean heart weight for the subset of cats that weigh 3.18 kg is between 12.143 g and 12.801 g.

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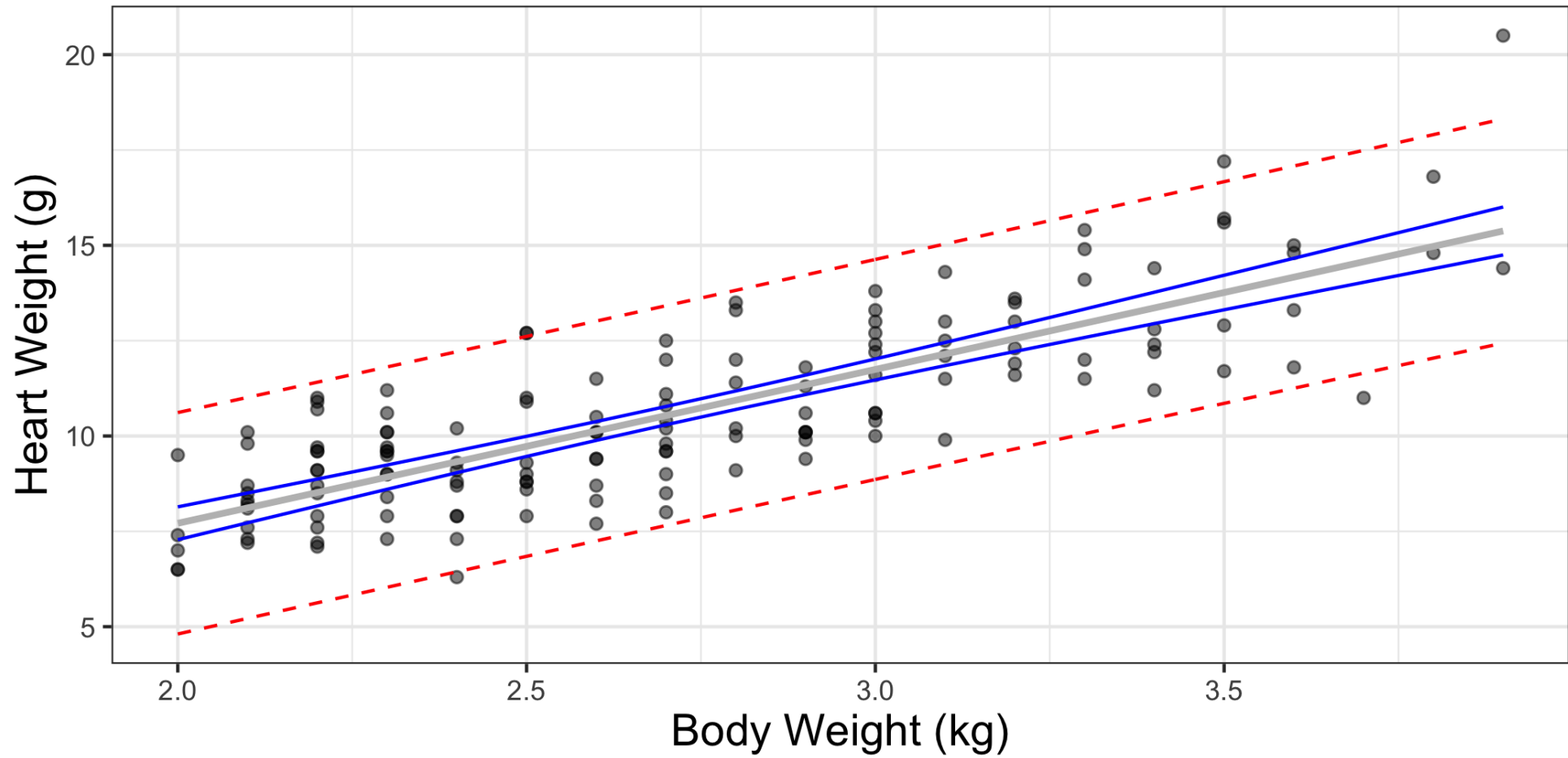
The 95% **prediction interval** for an *individual* cat (Mindy) that weighs 3.18 kg is

fit	lwr	upr
12.472	9.582	15.362

We can predict with 95% confidence that Mindy's heart weighs between 9.582 g and 15.362 g.

# Comparing intervals

— Confidence interval for mean — Prediction interval for individual



# Caution! Extrapolation

We should not use the model to predict for values of  $X$  far outside the range of values used to fit the model.

This is called **extrapolation**.

# Predict Andy's heart weight?

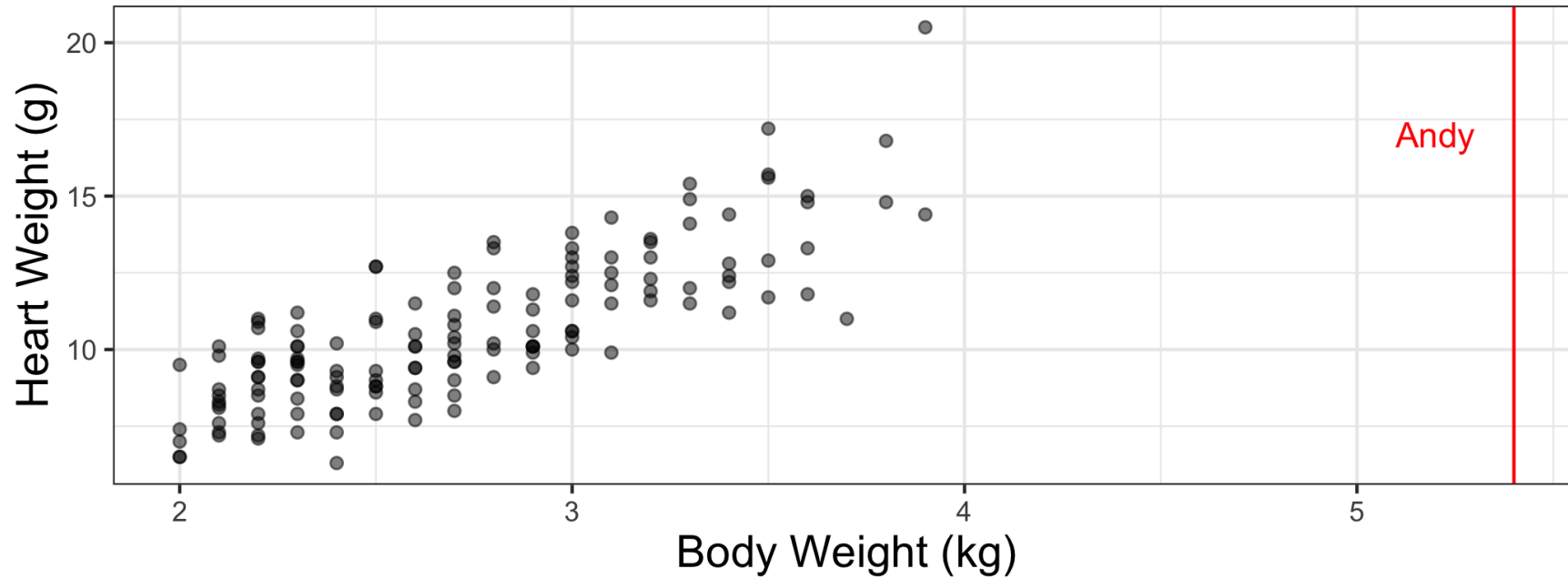
My cat Andy weighs about 5.44 kg (12 lbs).

Should we use this regression model to predict how much his heart weighs?

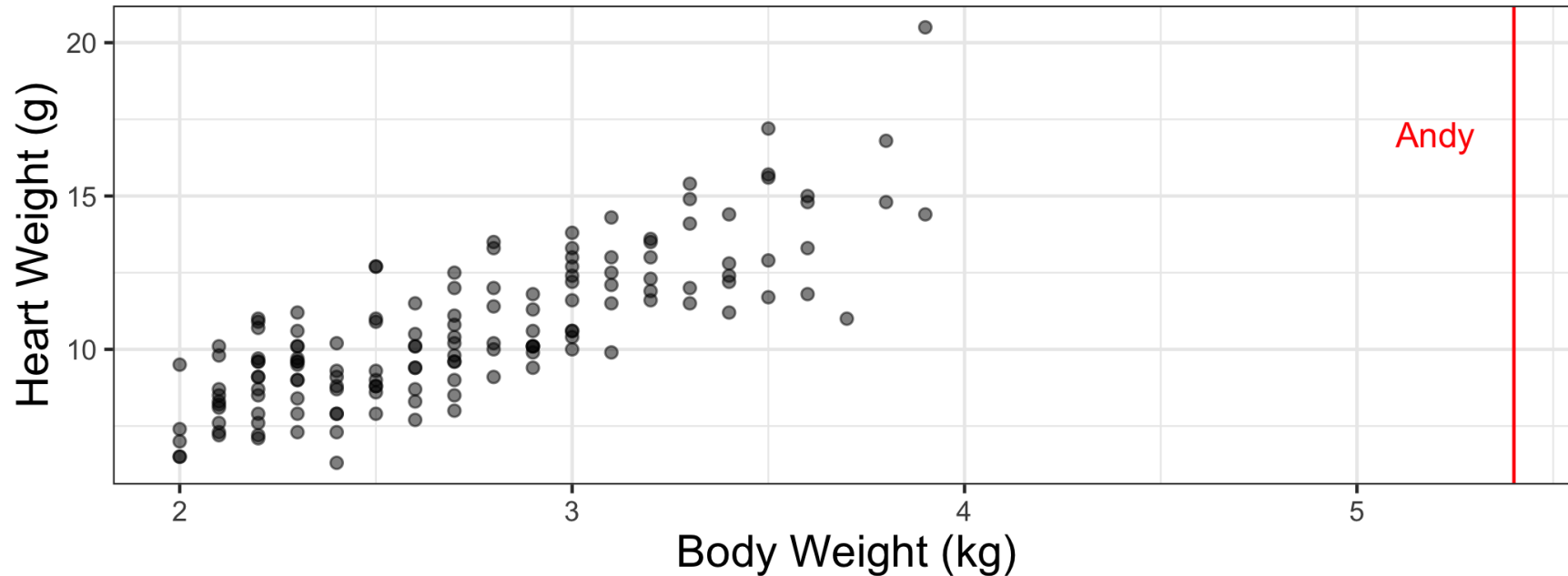




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We should not use this model to predict Andy's heart weight, since that would be **extrapolation**.

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- Used intervals to quantify the uncertainty in the predicted values
  - Confidence interval for the mean response
  - Prediction interval for individual response
- Defined **extrapolation** and why we should avoid it