

# Today

- Recap & questions from homework
- Coding the grid search algorithm

# Structured programming

- Sequence structure
- Selection structure (conditional, branches)
- Repetition structure (iteration, loops)

# R selection structures

**if single selection structure**

```
if ( condition ) {  
    expression  
}
```

**if-else double selection structure**

```
if ( condition ) {  
    expression1  
} else {  
    expression2  
}
```

**if-else if multiple selection structure**

```
if ( condition ) {  
    expression1  
} else if {  
    expression2  
} else {  
    expression3  
}
```

# R repetition structures in practice

## while sentinel control

```
while ( condition ) {  
  expression  
}
```

## for counter control

```
for ( i in 1:n ) {  
  expression  
}
```

## until sentinel control

```
while ( !condition ) {  
  expression  
}
```

## foreach vector control

```
for ( element in vector ) {  
  expression  
}
```

## do-while sentinel control (e.g. option 4)

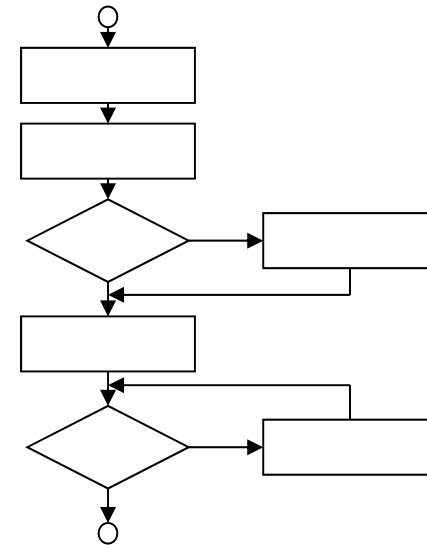
```
repeat {  
  expression  
  if ( !condition ) break  
}
```

## foreach vector control with lists

```
for ( object in list ) {  
  expression  
}
```

# Combining control structures

- Stacking
  - one after another
- Nesting
  - one inside another



These are all the programming tools you need to solve any problem!

Next: additional, powerful programming tools for convenience or to solve specific problems.

# Algorithms in data science

- Model algorithm
- Training algorithm
- Inference algorithm

# How can a model be an algorithm?

Model

$$y_i = \beta_0 + \beta_1 x_i$$

Algorithm (this version is atomic code)

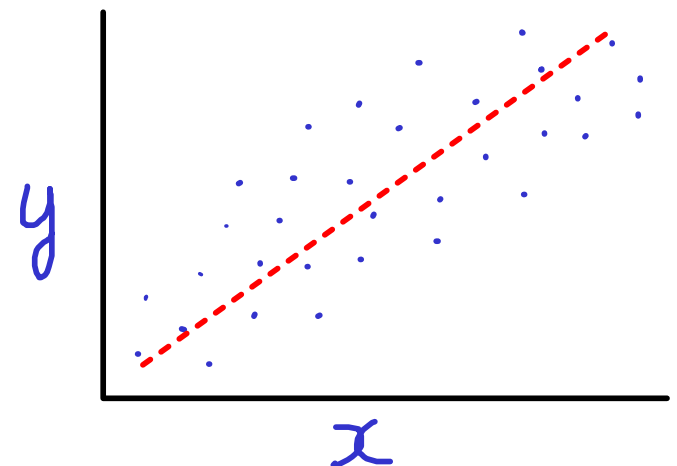
```
> for ( i in 1:n ) {  
>   y[i] = b_0 + b_1 * x[i]  
> }
```

Vectorized R code

```
> y <- b_0 + b_1 * x
```

Data table

<b>i</b>	<b>y</b>	<b>x</b>
1	28.4	10.2
2	47.6	15.7
...		
...		
85	35.1	12.9



# Training algorithm

aka model fitting, model calibration

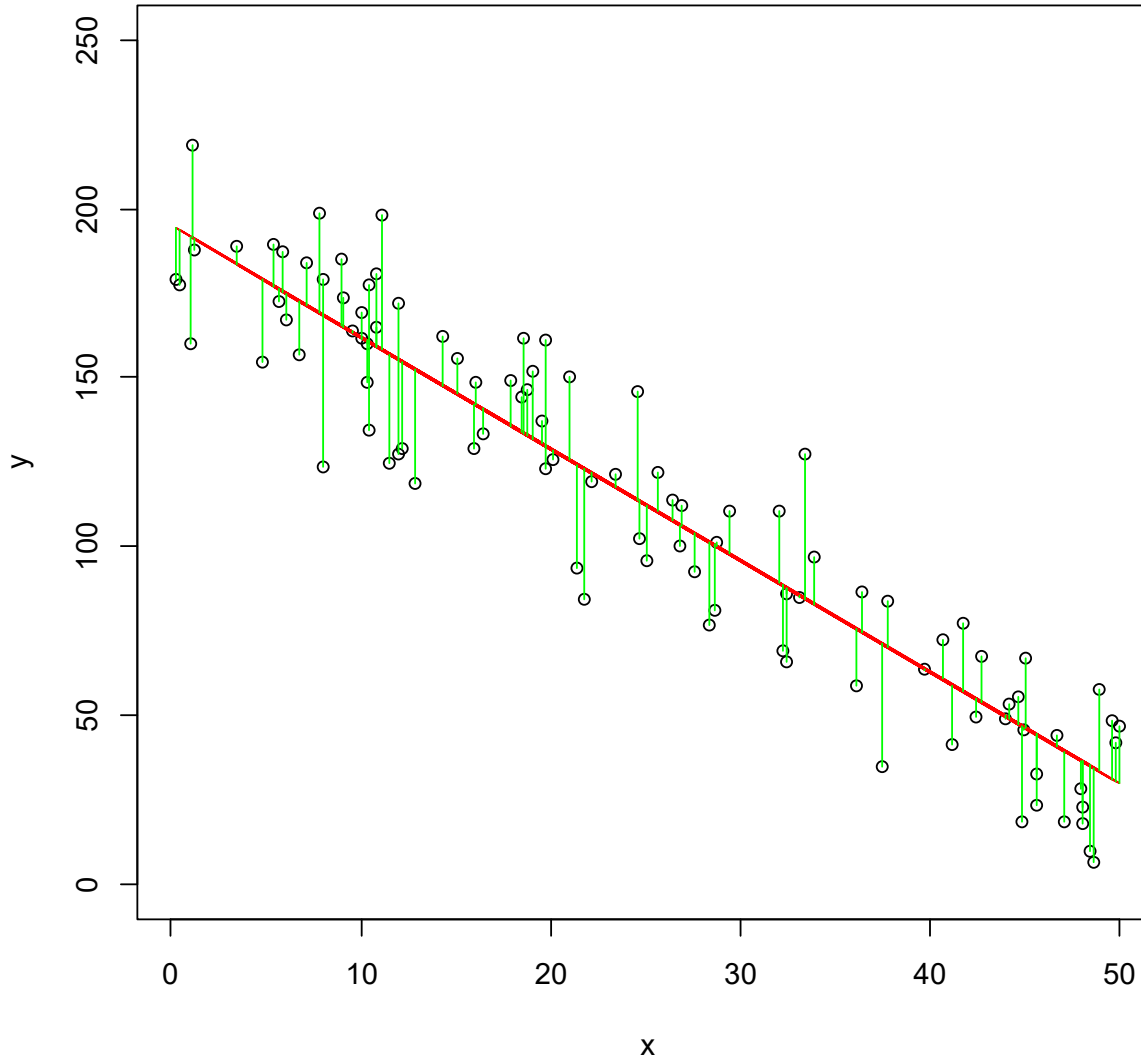


Big idea in data science

Legendre 1805: comet orbits, SSQ.



# Least squares training algorithm



Vary model **parameters**

$$y_i = \beta_0 + \beta_1 x_i + e_i$$

Minimize **distance**  
from data

$$ssq = \sum_i e_i^2$$

# Optimization algorithms

- Grid search
- Descent
- Monte Carlo
- Analytical or numerical

# Grid search algorithm

## Pseudocode

Read in data

Set up values of  $\beta_0$  and  $\beta_1$  to try

Set up storage for ssq,  $\beta_0$ ,  $\beta_1$

For each value of  $\beta_0$

    For each value of  $\beta_1$

        Calculate sum of squares

        Store ssq,  $\beta_0$ ,  $\beta_1$

Plot sum of squares profiles (ssq vs  $\beta_0$ , ssq vs  $\beta_1$ )

Report best ssq,  $\beta_0$ ,  $\beta_1$

Plot fitted model with the data

Initialization  
phase

Calculation  
phase

Termination  
phase

# Grid search algorithm

## Pseudocode

Read in data

Set up values of  $\beta_0$  and  $\beta_1$  to try

Set up storage for ssq,  $\beta_0$ ,  $\beta_1$

For each value of  $\beta_0$

    For each value of  $\beta_1$

        Calculate model predictions

        Calculate deviations

        Sum squared deviations

        Store ssq,  $\beta_0$ ,  $\beta_1$

Plot sum of squares profiles (ssq vs  $\beta_0$ , ssq vs  $\beta_1$ )

Report best ssq,  $\beta_0$ ,  $\beta_1$

Plot fitted model with the data

Top down  
refinement

# Grid search algorithm

## Pseudocode

Read in data

Set up values of  $\beta_0$  and  $\beta_1$  to try

Set up storage for ssq,  $\beta_0$ ,  $\beta_1$

For each value of  $\beta_0$

    For each value of  $\beta_1$

        Calculate model predictions

        Calculate deviations

        Sum squared deviations

        Store ssq,  $\beta_0$ ,  $\beta_1$

Plot sum of squares profiles (ssq vs  $\beta_0$ , ssq vs  $\beta_1$ )

Report best ssq,  $\beta_0$ ,  $\beta_1$

Plot fitted model with the data

Translate this to R  
code and use it to  
train the model  
with your data



