

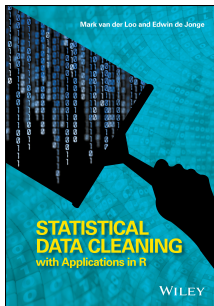
# Imputation

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ENBES|EESW 2019



# Try the code

```
03valid/impute.R
```



# Imputing data

## Need to specify

- Imputation method
- Variable(s) to impute
- Variables used as predictor

## Imputation's goal

Easy to experiment, robust enough for production.

## Imputation interface

```
impute_<model>(data, imputed_variables ~ predictors, ...)
```



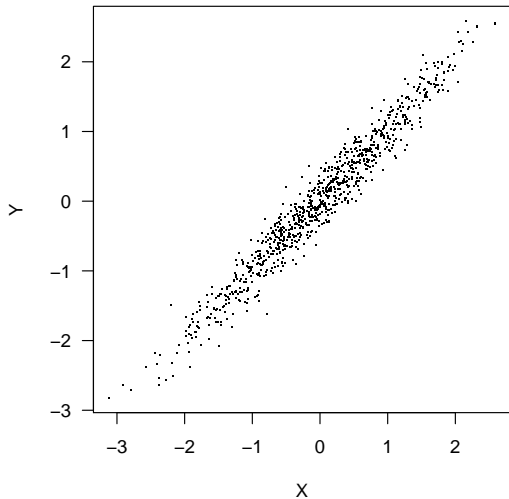
# Imputing data with simulation

<model>	description
proxy	copy (transformation of) other variable(s)
median	(group-wise) median
rlm, lm, en	(robust) linear model, elasticnet regression
cart, rf	Classification And Regression Tree, RandomForest
em, mf	EM-algorithm (multivariate normal) missForest
knn	k nearest neighbours
shd, rhd	sequential, random, hot-deck
pmm	predictive mean matching
impute_model	use pre-trained model

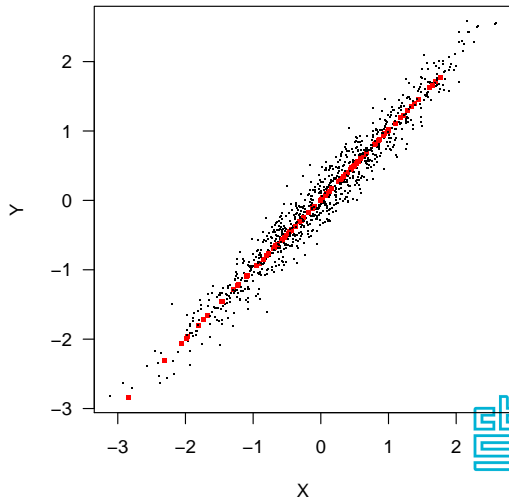


# Imputation of the mean

10% missing in Y

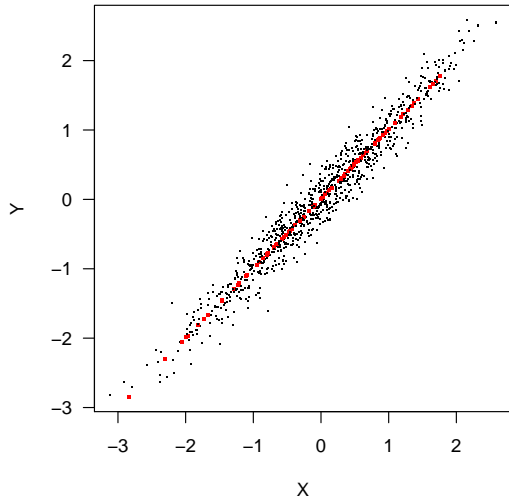


Imputation with model  $Y = a + bX$

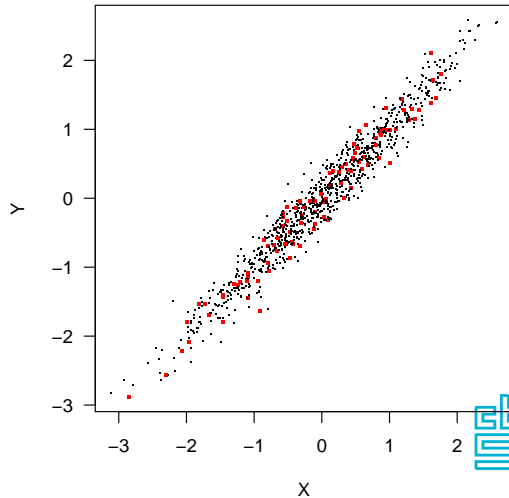


# Adding a random residual

Imputation with model  $Y = a + bX$



Imputation with  $Y = a + bX + e$



# Adding a random residual with simulation

## Example

```
impute_rlm(companies, other.rev ~ turnover  
           , add_residual = "normal")
```

## Options

- “none”: (default)
- “normal”: from  $N(0, \hat{\sigma})$
- “observed”: from observed residuals



# Chaining methods

## Example

```
companies %>%  
  impute_lm(turnover ~ staff + profit) %>%  
  impute_lm(turnover ~ staff)
```





# Assignment

1. Read `errors_located.csv` (`stringsAsFactors=FALSE`)
2. Make a separate data frame, selecting columns 11–14 (`staff-vat`)
3. Implement the following imputation sequence:
  - Impute turnover by copying the vat variable (`impute_proxy`)
  - Impute staff with a robust linear model based on `staff.costs`
  - Impute staff with a robust linear model based on `total.costs`
  - Impute profit as `total.rev - total.costs` (`impute_proxy`)
  - Impute everything else using `missForest` (formula: `. ~ .`)

