## Data Cleaning with applications in R

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- ► PhD Molecular Physics (2008)
- ▶ In Official Statistics (methodology) since 2007
- Research interests:
  - Statistical Computing (Mostly R and C)
  - Data cleaning
  - Network analyses (just started last year)
- Author, with Edwin de Jonge



#### R Packages

dcmodify deductive extremevalues errorlocate gower hashr lintools lumberjack rspa simputation stringdist tinytest validate validatetools

### Contents

- ▶ Day 1
  - ▶ Statistical value chain and data validation
  - ► Error localization
- ▶ Day 2
  - ► Imputation methods
  - Methods for deductive correction
  - Monitoring

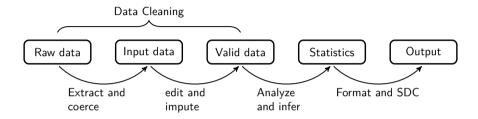


### Value Chains

### Porter's value chain (1985)

The idea of the value chain is based on the process view of organizations, the idea of seeing a manufacturing (or service) organization as a system, made up of subsystems each with inputs, transformation processes and outputs.

### Statistical Value Chain



#### Notes

- ► This part only pertains to the data processing stage. Collection, design, dissemination is not included.
- ▶ The fixed points are well-defined statistical products.

- 1. Raw Data is data as it arrives
  - Can differ in quality/source: survey/admin/big data
- 2. **Input data** satisfies technical demands:
  - ► File type is known and can be read
  - Variables are of correct type (number/date/text/categorical...)
  - Records identified with statistical objects
  - Variables identified with statistical properties

#### 3. Valid data satisfies domain knowledge constraints

- ► Age cannot be negative
- ▶ Someone under 15 yrs old cannot have income from work
- ▶ mean economic growth/decline does not exceed 5% in a certain sector
- **.**..

#### Justification

Invalid data leads to invalid statistical results.

- 4. **Statistics** are the target output values (aggregates) describing the population characteristic of interest.
  - Economic growth
  - Unemployment
  - ▶ Income distribution
  - GDP
  - **.** . . .

#### Note

Statistics also need to satisfy domain knowledge constraints.

- 5. Output are statistics, formatted and annotated for publication
  - ► Figures, tables
  - Definitions
  - •

### The SVC: Remarks

- Actual data processing is not necessarily linear across the chain
- ▶ In production architectures a more flexible model is often used where the definition of interfaces between processing steps play a crucial role. The chain shown here is a general example covering most steps in some way.
- ► The general idea scales really well.