



# Measurement theory

## - for the interested student

Erland Jonsson

Department of  
Computer Science and Engineering  
Chalmers University of Technology

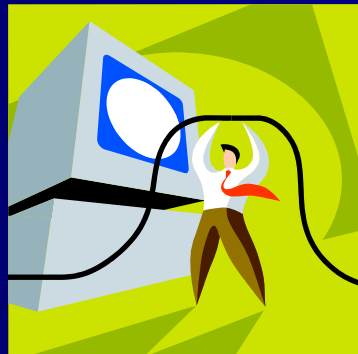


# Contents<sup>1</sup>

- What is measurement?
- Relational systems
- Scale of measurement
- Measurement scales
- Summary

1. This presentation is partly based on Norman E Fenton: Software Metrics, 1st. ed.

# What is measurement ?



# Definition of measurement

## ■ Definition:

- **Measurement** is the process of empirical, objective **encoding of some property** of a selected **class of entities** in a **formal system of symbols** (A. Kaposi based on Finkelstein)
- Cp **Metrology** is the field of knowledge concerned with measurement. Metrology can be split up into theoretical, methodology, technology and legal aspects.

# General requirements on measurement operations

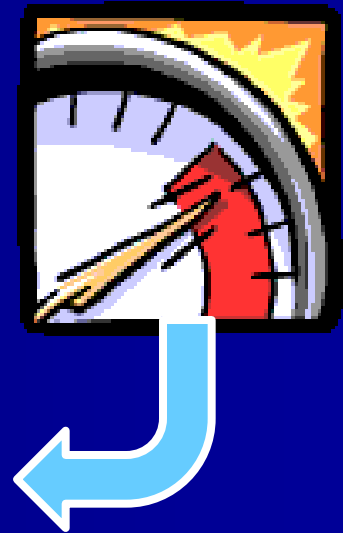
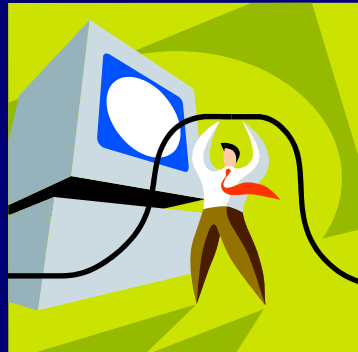
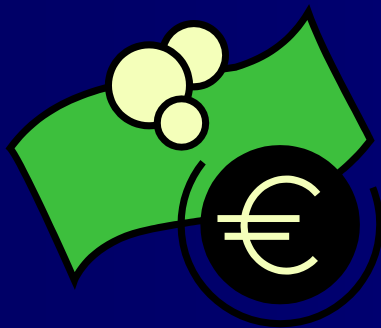
- Operations of measurement involve **collecting and recording data** from observation
- It **means identifying the class of entities** to which the measurement relates
- Measurements must be **independent of the views and preferences of the measurer**
- Measurements must **not be corrupted** by an **incidental, unrecorded circumstance**, which might influence the outcome

# Specific requirements on measurement operations

- Measurement must be able to **characterize abstract entities** as well as to describe properties of real-world objects
- The result of measurement may be captured in terms of **any well-defined formal system**, i.e. not necessarily involving numbers

# Relational systems

- from measurement theory



# Relational systems



- There are two types of relational systems:
  - the **empirical** relational system
  - the **formal** relational system
- These two relational systems gives the theoretical basis for **defining measurement scales**



# Empirical relational system



- Let  $A = \{a, b, c, \dots, z\}$  be the target set and  $\kappa$  the chosen key property
- Ex.  $A$  is the set of schoolchildren in a class and  $\kappa$  is the property of their height.
- Now let  $A = \{a, b, c, \dots, z\}$  be the model of  $A$  which describes each child in terms of the property height
- The empirical relational system comprises this model set together with all the operations and relations defined over the set

# Empirical relational system (con't)



- We can now attempt to describe the **empirical relational system** as an **ordered set**  
 $E = (A, R, O) = (A, \{r1, r2, r3\}, \{o\})$ , where
- $R$  is a set of relations:
  - $r1$  = taller than
  - $r2$  = the same height as
  - $r3$  = heads and shoulders above, and
- $O$  is a set of binary operations:
  - $o$  is the operator "standing on the head of"

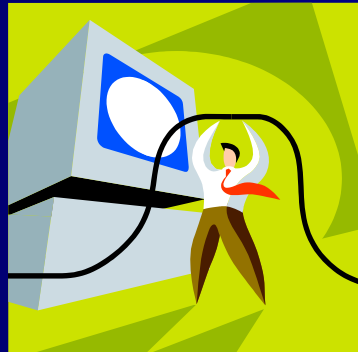
# Formal relational system



- We can now attempt to describe the **formal relational system** as a **nested set**  $F = (A', R', O')$
- The formal relational system  $F$  must be capable of **expressing all of the relations and operations** of the empirical relational system  $E$
- The mapping from  $E$  to  $F$  must actually represent all of the observations, preserving all the relations and operations of  $E$
- If this is true we say that the mapping  $A \rightarrow A'$  is a **homomorphism** and  $F$  is **homomorphic to**  $E$

# Scaling and scale types

- from measurement theory



# Scale of measurement



- Assume that:
  1. The set  $A$  models the target set  $\mathbf{A}$ , wrt to  $\kappa$
  2. We have the empirical system  $E = (A, R, O)$  and the formal system  $F = (A', R', O')$
  3.  $m$  is a homomorphic mapping from  $E$  to  $F$
- Then  $S = (E, F, m)$  is called the **scale of measurement** for the key property  $\kappa$

# Scale of measurement



- Now if  $F$  is defined over some subset of real numbers, then:
  - measurement maps the key property of each object of the target set into a number
  - further, if the mapping is **homomorphic** then:
    1. the **measured data will be representative** of the key property of the corresponding object, and
    2. empirical **relations and operations** on the properties **will have correct representations** on the corresponding numbers

# Scale of measurement



- The **homomorphism** assures that these **formal conclusions, drawn in the number domain** will have **corresponding conclusions in the empirical domain** and thus that the purpose of the measurement is fulfilled
- Or in more general terms:  
Our theoretical conclusions will be valid to the real world and let us draw corresponding conclusions for it
- A homomorphism is seldom unique, e.g cost can be expressed in EUROS or in SEK

# Measurement scales



- Measurement theory distinguishes five types of **scale**:
  - **nominal** scale
  - **ordinal** scale
  - **interval** scale
  - **ratio** scale
  - **absolute** scale
- Here they are given in an ascending order of "**strength**", in the sense that each is permitting less freedom of choice and imposing stricter conditions than the previous one



# Nominal scale



- The **nominal scale** can be used to denote membership of a class for purposes such as **labelling** or colour matching
- There are **no operations** between **E** and **F**
- The **only relation is equivalence**
- One-to-one mapping

# Ordinal scale



- The **ordinal scale** is used when measurement expresses **comparitive judgement**
- The scale is preserved under any montonic, transformation:  
$$x \geq y \Leftrightarrow \phi(x) \geq \phi(y),$$
where  $\phi$  is an admissible transformation
- Used for grading goods or rating candidates

# Interval scale



- The **interval scale** is used when **measuring "distance"** between pairs of items of a class according to the chosen attribute
- The scale is preserved under positive linear transformation:  
$$\phi(x) = \alpha m + \beta, \text{ where } \alpha > 0$$
- Used for measuring e.g. temperature in centigrade or Fahrenheit (but not Kelvin) or calendar time

# Ratio scale



- The **ratio scale** denotes the **degree** in relation to a standard. It must preserve the origin.
- It is the most frequently used scale
- The scale is preserved under the transformation:  
$$\phi(x) = \alpha m, \text{ where } \alpha > 0$$
- Used for measuring e.g. mass, length, elapsed time and temperature in Kelvin

# Absolute scale



- The **absolute scale** is a ratio scale which includes a "standard" unit.
- The scale is only preserved under the identity transformation:  
$$\phi(x) = x,$$
which means that it is not transformable
- Used for **counting items** of a class

# Meaningfulness



- **Meaningfulness** means that the scale measurement should be appropriate to the type of property measured, such that once measurement has been performed – and data expressed on some scale - **sensible conclusions can be drawn** from it
- Example 1: Point A is twice as far as point B (meaningless, since distance is a ratio scale, but position is not)
- Example 2: Point A is twice as far from point X as point B (is meaningful)

# Summary

- We have given a brief and heuristic overview of a few concepts from measurement theory
- We have described a number of scales
- We have defined "scale of measurement" as a homomorphic mapping from an empirical relational system to a formal relational system