



# COMP3430 / COMP8430

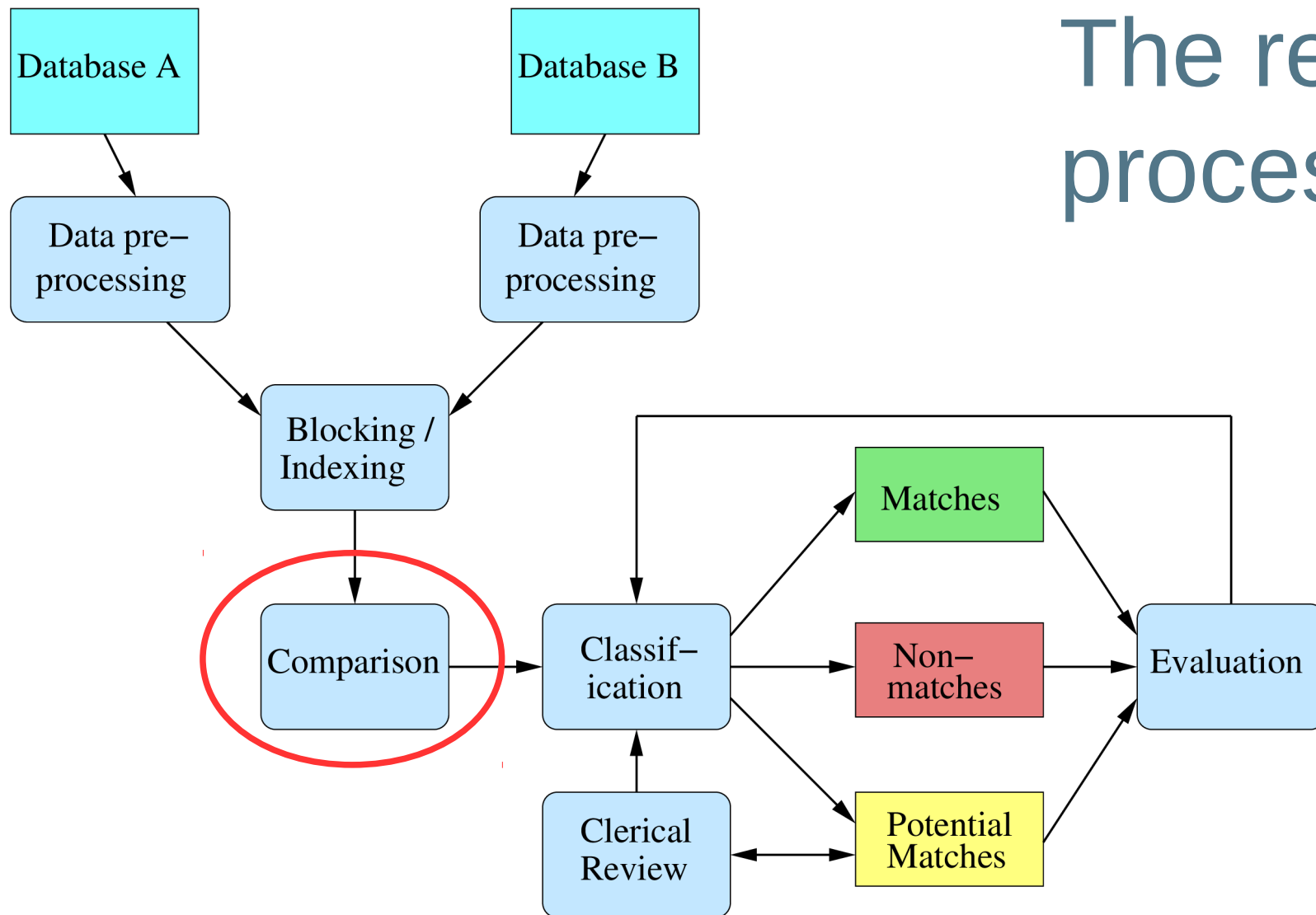
## Data wrangling

Lecture 15: Record pair comparison (1)  
(Lecturer: Peter Christen)



# Lecture outline

- Comparing records for record linkage
- Similarity and distance functions
- Basic comparison functions
- Numerical and other comparison functions



# The record linkage process

# Comparing record pairs (1)

- The blocking process generates groups / clusters of records
- From each block, record pairs are generated
  - For a linkage of two databases, all records from database A are paired with all records from database B from blocks that have the same BKV
  - For the deduplication of a single database, all unique record pairs are formed from each block (a record is not compared with itself)
- Record pairs are compared based on their common available attributes (fields)
  - These are commonly names, addresses, dates, phone numbers, etc.
  - They contain variations and errors (even after cleaning), or can be missing or out-of-date

# Comparing record pairs (2)

- Exact comparison of attribute values will not provide good linkage results
  - Even true matching record pairs often contain different attribute values
  - For example:  
['peter', 'paul', 'meier', '2/21 main st', 'acton', 'act', '2601']  
['peter', 'p', 'meyer', '21 main street', 'acton', 'act', '2602']
- Approximate comparison functions are required
  - To calculate similarities between attribute values, not only 'is the same or is different'
  - They need to be appropriate for the content of a certain attribute  
(text: names, addresses, dates, phone numbers; numerical: ages, salaries)

# Similarities and distances (1)

- Approximate matching functions generally calculate a numerical similarity value
  - $sim = 0$ : Two values are completely different ('peter' and 'david')
  - $sim = 1$ : Two values are exactly the same ('peter and peter')
  - $0 < sim < 1$ : Two values are *somewhat* similar ('peter' and 'pedro')
- For the same pair of values, different functions calculate different similarities
- Some functions calculate distances
- Distances can be converted into similarities
  - $sim = 1/dist$ , with  $sim = 1$  if  $dist = 0$
  - $dist = 1-sim$ , if  $0 \leq dist \leq 1$

# Similarities and distances (2)

- Distance functions (or distance metrics) have several properties:
  - $\text{dist}(\text{val1}, \text{val1}) = 0$  Distance from an object to itself is always 0
  - $\text{dist}(\text{val1}, \text{val2}) \geq 0$  Distances are always positive
  - $\text{dist}(\text{val1}, \text{val2}) = \text{dist}(\text{val2}, \text{val1})$  Distances are symmetric
  - $\text{dist}(\text{val1}, \text{val2}) + \text{dist}(\text{val1}, \text{val3}) \geq \text{dist}(\text{val2}, \text{val3})$   
Triangular inequality must hold
- Not all approximate matching functions are proper metric distances
  - Triangular inequality does not hold for certain functions
  - Some functions are not symmetric (for example, those that calculate if one attribute value is included in another, like 'pete' and 'peter')

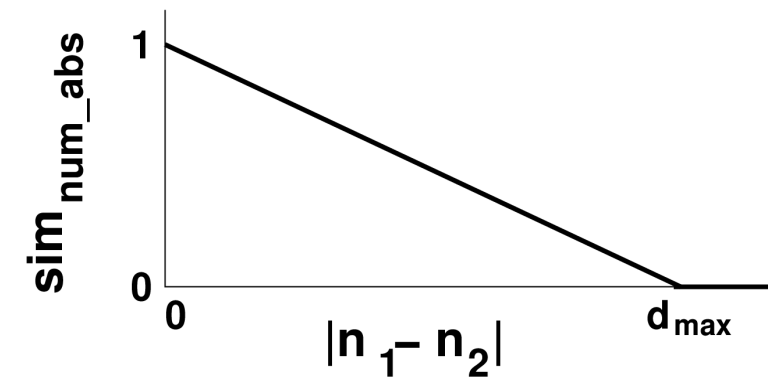
# Basic comparison functions

- **Exact** comparison:
  - $s_{\text{exact}}(val1, val2) = 1$  if  $val1 = val2$ , 0 otherwise
  - $val1$  and  $val2$  can be strings, numbers, etc.
- **Truncate** string comparison (x characters the same at beginning)
  - For string values only
  - $s_{\text{trunc}}(val1, val2) = 1$  if  $val1[:x] = val2[:x]$ , 0 otherwise
  - Similar for testing if the end is the same
- **Phonetic** encoded comparisons
  - For strings only
  - $s_{\text{encode}}(val1, val2) = 1$  if  $\text{encode}(val1) = \text{encode}(val2)$ , 0 otherwise
  - $\text{encode}()$  is a phonetic encoding function as discussed previously



# Numerical comparison functions (1)

- For numerical values, we also want to have a comparison that calculates a similarity between 0 and 1
- We set a *maximum absolute difference* allowed, or a *maximum percentage difference* allowed
  - If two values differ more their similarity will be 0
- For absolute maximum difference of  $d_{max}$  and two values  $n_1$  and  $n_2$ :
  - If  $abs(n_1 - n_2) \geq d_{max}$  :  $sim_{num\_abs} = 0$
  - If  $abs(n_1 - n_2) < d_{max}$  :  $sim_{num\_abs} = 1 - (abs(n_1 - n_2) / d_{max})$

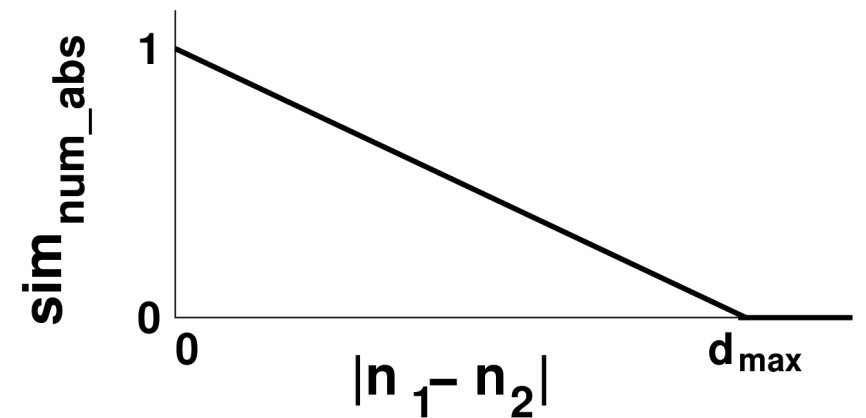


# Numerical comparison functions (2)

- Similar for maximum percentage difference
  - Similarity for income (salary) differences of maximum 5% is more suitable compared to a maximum difference of \$10,000
  - Similarity of age difference by 10% is better than maximum age difference of 5 years (young compared to old people)

- **Question:** Calculate similarities for absolute maximum difference of  $d_{\max} = 5$ ,  $n_1 = 42$  and  $n_2 = \{37, 38, 40, 41, 49\}$

*Then calculate percentage differences assuming these are ages*



# Date and time comparison

- Dates are often used when records are compared
  - Comparing dates as strings is not a good idea: 31/12/1999 versus 01/01/2000, 24/11/2017 versus 24/01/2017
  - Dates can be converted into number by counting the number of days since a certain fix date, then calculate numerical similarity between day numbers
- Specific issue with how dates are recorded
  - Sometimes day and month numbers are swapped: US versus (almost) the rest of the world, for example 12/07/2000 versus 07/12/2000
- Time values also are modulo
  - 23:59 is more similar to 00:01 than to 13:59