



# EXPERIENTIAL-BASED REASONING CASE-BASED REASONING

**(Part VII – Evaluation)**

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# PART 7 – CBR SYSTEM EVALUATION



# CBR System Evaluation



# CBR system evaluation

- Technical Criteria
  - Definitional issues
  - Development issues
  - Execution issues
- Ergonomic criteria
  - Development issues
  - Execution issues



# Technical criteria: definitional issues (1)

- Case representation
  - Ability to handle structured domains
  - Expressiveness
    - ◆ Kind of attributes
    - ◆ Default values
  - Missing / do not care / uncertain values
  - Negative examples
- Case library organisation
  - Kind of indexing
  - Retrieval techniques



## Technical criteria: definitional issues (2)

- Assessing similarity
  - Techniques available
  - Automatic modification of the similarity measure
  - How is similarity computed between:
    - ◆ Numeric values
    - ◆ Symbol values
    - ◆ String values
  - Kind of weights
  - Knock-out attributes: filtering attributes
    - ◆ For instance, one attribute with weight equal to the sum of all other attributes
  - Use of thresholds
  - Incorporation of declarative knowledge



## Technical criteria: definitional issues (3)

- Adaptation, evaluation and learning cases
  - Handling case adaptation
  - Handling case evaluation
  - Handling case learning
- Background knowledge
  - Techniques
    - ◆ Categories, weights, decision trees, rules
    - ◆ Models, prototypes, formulas, taxonomies, ordering, ontologies
  - When it is used
    - ◆ Retrieval
    - ◆ Adaptation



# Technical criteria: development issues

- Supporting noisy data in the cases of the case library
- Supporting incomplete data in the cases of the case library
- Performance
  - Building speed for application development
- Consistency
  - Independence of order of the input cases
- Effectiveness
  - Input data minimisation
  - Cost functions
  - System optimisations over time
- Adaptability
  - Explicitly data generalisation
  - Automatic data purging





# Technical criteria: execution issues (1)

- Supporting noisy data in the new cases
- Supporting incomplete data in the new cases
- Flexibility
  - Different modes of consultation
  - Ability to correct previous input case
- Performance
  - Competence
  - Efficiency
    - ◆ Retrieval time
    - ◆ Memory / disk space consumption



## Technical criteria: execution issues (2)

- Correctness
  - Testing of identical cases
  - Testing of similar but not identical cases
  - Testing several similarity measures
  - Integration of techniques to improve the case retrieval
    - ◆ Derivation of additional features
    - ◆ Change/select the order of attribute consultation
    - ◆ Change the missing values handling
- Completeness
  - Coping with the complete domain of application
  - Easiness to detect non solvable new cases



## Technical criteria: execution issues (3)

- Consistency
  - Stability over time (same output when using same input)
  - Sensitivity to the order of input cases
- Effectiveness
  - Optimisation of order/number of interactions (effective index learning)
  - Optimisation of correctness over time (effective case learning)



# Ergonomic criteria: development issues

- Control of application development
  - Incorporation of background knowledge
  - Degree of domain expert control over the application complexity
- Validation and testing
  - Automatic / manual facilities to test and validate
- Knowledge and data acquisition / maintenance
  - Coping with domains with frequent updates (incremental operation)
  - Supporting automatic long-term optimisation



# Ergonomic criteria: execution issues (1)

- User acceptance
  - Explainability and modelling support
    - ◆ Self-generation of explanations
      - ◆ Decisions, conclusions, features
    - ◆ Good documentation
    - ◆ On-line help
    - ◆ Domain modelling through knowledge integration
  - Comprehensibility (logical flow reasoning)
  - User interface
    - ◆ User friendly
    - ◆ Customisation of the user interface
    - ◆ Supporting different kinds of user
    - ◆ Supporting additional multimedia data
    - ◆ Improving users' motivation and acceptance



## Ergonomic criteria: execution issues (2)

- Organisational and human impacts of the technology
  - Appealing to capture experience preventing from a loss of *know how*
  - Easiness of domain experts training
  - Easiness of user training
- Outside world interface
  - Import / export data facilities
    - ◆ Data bases
    - ◆ ASCII/XML files
    - ◆ Shared multi-user access
  - Communication with other programs (APIs)



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