

Taxonomy of Data Interestingness

Association rule mining

- What
 - Barket basket analysis, Its a non supervised ML method. uses support and confidence as default measure
- Literature
 - Apriori - frequent items mining — Huge no. of rules and may not be strong rules.
 - FP Growth - Frequent pattern tree. Divide and conquer method — Increase in FP- Tree size exponentially increases time.
 - FP-based ARM for Ontology / Identifying : Known, Unexpected, Novel rules — No semantics in the generated rules..
 - Fuzzy association rule mining / context sensitive fuzzy clustering — No structural relationships.
 - Distance based association rule mining / CLARNS / Concept hierarchy / CBPNARM — Positive and negative rules - KB
 - AMIE / AMIE improved — Horn rules among predicates. — Only labelled data is used.
 - Ontology & hypergraphs are used to discover latent AR. — Ontology helps to prune and filter the rules.
 - Generalized and hierarchical AM — User knowledge is required & Only precise knowledge is used.
 - WARM - Weighted ARM — Uses inductive logic programming

Interestingness metrics

- What
 - Prune or rank the discovered rule.
 - statistical, ML, data mining techniques..
 - Three categories [29].
 - 1. Rules that are both unexpected and actionable.
 - 2. Rules that are both unexpected and not actionable.
 - 3. Rules that are actionable but expected.

Metrics in Data mining for interestingness

- Objective measures — Support, Confidence, Based on probability and based on form of rules.
- Subjective measures — Unexpectedness, Actionability, Surprisingness & Novelty
 - Interest factor
 - Gini Index — Treats both positive and negative facts as same.
- Semantic measures — Utility and Actionability

Ontology

Both helps to understand the current trend and methods followed for interesting facts generation.

- What
 - Explicit, formal specification of a shared conceptualization
 - $O = (TBOX + ABOX, G)$
- Why
 - Semantic structuring
 - Same semantics across data points

Ontology-Based Methods

- Information theory based measure — Ontology-guided generalization
- Annotation dataset
- Distinct characteristics — Cross ontology relationships
- Integrated rule information content (IRIC) — Ontology - ARM
- Only concentrate on learning TBOX from incomplete ABOX. — SWARM. Common behavioral patterns
- Learning based semantic search algorithm. — ODIS- ontology driven information system.
- Multi ontology / semantic support / annotation inconsistency / Post mining and filtering — Others
- Inductive logic programming (ILP) . — SEGS & g-SEGS
 - Only use labelled data
 - Hierarchy schema is not used.
 - ILP enrich the ontology.
- PCA confidence measure. — Partial completeness assumption (PCA).
- Semantic similarity based
 - Least common ancestor (LCA).
 - Depth of ontology hierarchy.
 - Common and non-common ancestors.
 - Ontology
 - Crisp ontology (CO)
 - Fuzzy FCA (FFCA) — Uses common feature of concepts.
 - Fuzzy Ontology (FO)

Evaluation methods

- Manual
 - Comparing obtained via manually extracted. — Indicating the expectations
 - Domain experts evaluations
- Statistical
 - Relation learning recall & Relation learning precision — Precision, Recall, F-measure
 - Chi-Square
 - Learning Accuracy....
- Multi ontology
 - Instance-based / Match concepts of multiple ontology
- Other measures
 - Ground truth association
 - True rule set