

Knowledge and Data System Comprehensive Exam Syllabus

Effective: January 2018

NOTE: This PhD comprehensive exam will have questions on

- A. Database Systems
- B. Information Retrieval
- C. Data Mining

It will be sufficient for students to select questions from **any 2** of the three topics, in order to score up to a maximum of 100 points.

A. Database Systems

Topics

1. *DBS and DBMS concepts:* technology, capabilities, design DBMS, DBS, data model, schema vs. instances. ANSI/SPARC three level schema architecture, data independence, logical data structure vs. physical storage structures.
2. *Database administration functions:* DBA responsibilities, DBMS performance measurement and evaluation.
3. *Data Models and DB Design:* Data modeling, structures (abstraction, sets, representation), constraints (domain, referential, functional dependencies, assertions, triggers), operations, primary data models (E-R, network, relational, semantic, object-oriented), design methodologies.
4. *Relational DB theory:* Normalization and normal forms (1,2,3 BCNF, 4) lossless join and dependency preserving decomposition.
5. *DBMS language and interfaces:* Data definition language, data manipulation language, query languages, view definition languages, storage definition languages, SQL, relational algebra, datalog, QBE, high-level and graphical user interfaces and interface building tools.
6. *Query Processing:* Logical and physical query plans, join techniques (NLF, SMJ, HF), cost-based query evaluation, concurrent queries, ACID properties, and Transactions.
7. *Database Normalization:* Informal design guidelines for Relation Schemas, functional dependencies, Normal Forms based on Primary Keys, Second and Third Normal Forms, and Boyce-Codd Normal Form.

References

1. Ramez Elmasri and Shamkant B. Navathe. Fundamentals of Database Systems (Ed. 7), Pearson, 2016. ISBN: 978-0133970777 (Chapters 1–11 and Chapter 14)

B. Information Retrieval

Topics

1. *IR Models*: Boolean Retrieval, Fuzzy Set based, Vector Space and hybrid models.
2. *Evaluation of IR Systems*: Recall, Fall out and Precision, Performance Averaging, RB-Precision, Normalized Recall.
3. *Relevance Feedback*: Probabilistic and Deterministic approaches. Bayes Classification, Perceptron Convergence Alg., Multi-level relevance and Generalized Perceptron Convergence Alg.
4. *Automatic Indexing*: Single term indexing. Term relationships and keyword classification, term phrase construction.

References

1. G. Salton, Automatic Text Processing, Addison-Wesley, 1989. (Ch. 8, sections 8.1-8.4, Ch. 9, Ch. 10).
2. C. D. Manning, P. Raghavan and M. Schuetz, Introduction to Information Retrieval, Cambridge University Press, 2008 (Ch. 1, Ch. 2.1, 2.2, Ch. 6.2, Ch. 6.3, Ch. 8.1 - 8.4, Ch.9, Ch. 9.1.1, Ch. 11.1 - 11.3, (exclude 11.3.1), 11.3.2).

C. Data Mining

Topics

1: Top 10 Algorithms in Data Mining

2: Decision Tree Construction

- The Concept Learning System (CLS)
- ID3/C4.5 and C4.5 software
- CART
- Backtracking vs greedy algorithms
- Advanced topics and remaining issues:
 - c4.5rules: decompose a decision tree into rules
 - Cubist

3: Association Analysis

- A mathematical model for association analysis
- Large itemsets and association rules
- Apriori: constructs large itemsets with minisup by iterations
- Interestingness of Discovered Association Rules
- Association analysis vs. classification
- [Machine Learning Software in Java](#) at the University of Waikato
- **Additional topics:**
 - Quantitative Association Rules
 - Multiple-Level Association Rules
- Association Analysis with One Scan of Databases

4: Clustering

- Clustering: unsupervised learning
- k -means: iterative distance-based clustering
- Incremental clustering/classification: pros and cons
- Steps in COBWEB to construct a clustering tree
- DBSCAN: Density-Based Clustering
- How to combine clustering and classification?
- How to measure the quality of clustering?
- Outlier analysis

5: Rule Induction, kNN and GA

- Classification rules
- 1R ("1-rule")
- c4.5rules vs c4.5
- Rule Induction by Covering
- PRISM: Constructing correct and "perfect" rules
- Rule induction algorithms in Weka
- Divide-and-Conquer vs Separate-and-Conquer
- Lazy vs eager learning
- The k -nearest neighbor algorithm
- Genetic algorithms (GA)

- Feature Selection
- 6: Bayesian Methods
- Conditional probability
 - Bayes theorem
 - Maximum A Posteriori (MAP)
 - Naive Bayes Classifier
 - Belief networks
 - Network topology
 - The Naive Bayes algorithm in Weka
 - Online streaming feature selection: features to arrive one by one
- 7: Dealing with Noise and Real-Valued Attributes (3 Lectures)
- Artificial vs. real-world databases
 - The Monk's Problems: An example
 - Sources of Noise
 - Erroneous values
 - Missing values (?)
 - Misclassifications
 - Contradictory data
 - Redundant data
 - Don't Care (#) values
 - Incomplete attributes and uneven data distribution
 - Noise Handling
 - Preprocessing
 - Pre-pruning
 - Post-pruning
 - Dealing with unusual examples when deduction of induction results
 - Cross validation
 - Dealing with contradictions and redundancy
 - Expansion of Don't Care values
 - Handling of ? values
 - Stopping criteria to avoid overfitting
 - Overfitting vs underfitting
 - Occam's Razor
 - Truncation of rules - TRUNC
 - "No match" and "multiple match" when deduction of induction results
 - Measure of fit
 - Estimate of probability
 - Dealing with real-valued attributes: Discretization
 - Random noise vs systematic noise
 - Impact of noise handling
- 8: Data Mining from Very Large Databases
- A. Why large databases?
 - B. Data partitioning
 - C. Sampling techniques
 - D. Subspacing

- E. Windowing in C4.5
- F. Integrative windowing
- G. Bagging, boosting, and their differences
- H. Boosting in C5.0
- I. Random forest
- J. Incremental batch learning
- K. Aggregation of rules from different data sources

References:

1. Xindong Wu and Vipin Kumar (Eds), [*The Top Ten Algorithms in Data Mining*](#), Chapman & Hall/CRC, 2009, ISBN 978-1-4200-8964-6.
2. Jiawei Han, Micheline Kamber and Jian Pei, [*Data Mining: Concepts and Techniques*](#), Third Edition, Morgan Kaufmann, 2011, ISBN 978-0123814791.
3. Pang-Ning Tan, Michael Steinbach, and Vipin Kumar, [*Introduction to Data Mining: Concepts and Techniques*](#), Addison Wesley, 2006, ISBN: 0-321-32136-7.