

# Statistic Methods in Data Mining

## Introduction

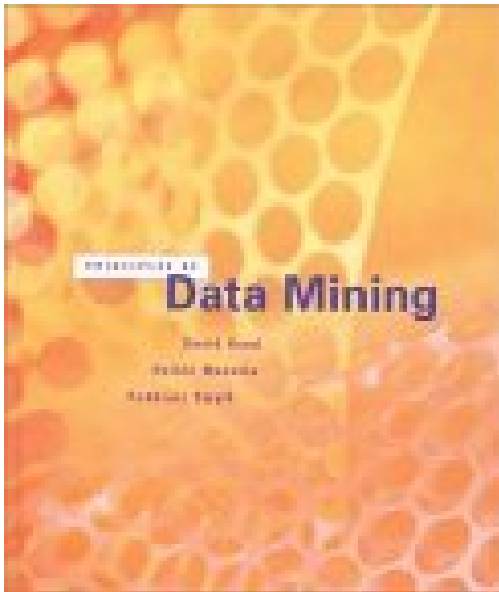
Professor Dr. Gholamreza Nakhaeizadeh

# content

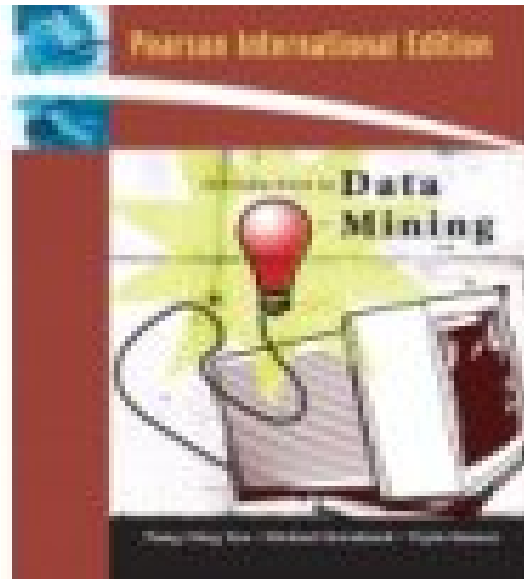
## Introduction

- Literature used
- Why Data Mining?
- Examples of large databases
- What is Data Mining?
- Interdisciplinary aspects of Data Mining
- Other issues in recent data analysis: Web Mining, Text Mining
- Typical Data Mining Systems
- Examples of Data Mining Tools
- Comparison of Data Mining Tools
- History of Data Mining, Data Mining: Data Mining rapid development
- Some European funded projects
- Scientific Networking and partnership
- Conferences and Journals on Data Mining
- Further References

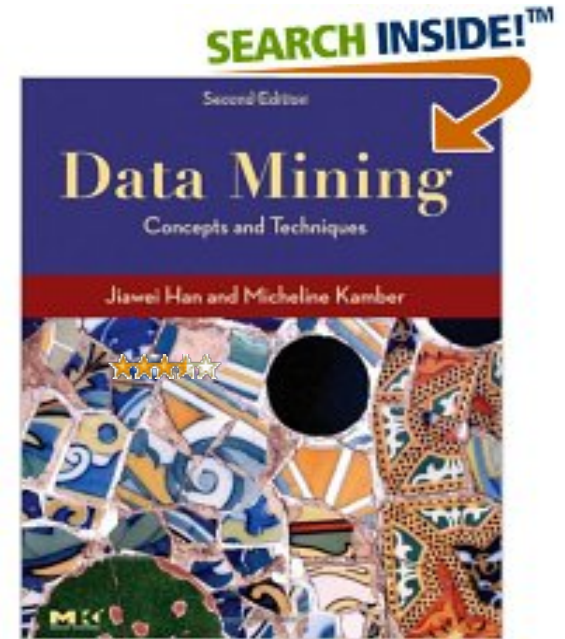
# Literatur used (1)



**Principles of Data Mining**  
[David J. Hand](#), [Heikki Mannila](#),  
[Padhraic Smyth](#)



Pang-Ning Tan,  
Michael Steinbach,  
Vipin Kumar



[Jiawei Han](#) and  
[Micheline Kamber](#)

# Literature Used (2)

<http://cse.stanford.edu/class/sophomore-college/projects-00/neural-networks/>

<http://www.cs.cmu.edu/~awm/tutorials>

<http://www.crisp-dm.org/CRISPwP-0800.pdf>

[http://en.wikipedia.org/wiki/Feedforward\\_neural\\_network](http://en.wikipedia.org/wiki/Feedforward_neural_network)

[http://www.doc.ic.ac.uk/~nd/surprise\\_96/journal/vol4/cs11/report.html#Feedback%20networks](http://www.doc.ic.ac.uk/~nd/surprise_96/journal/vol4/cs11/report.html#Feedback%20networks)

<http://www.dmreview.com/>

<http://www.planet-source-code.com/vb/scripts/ShowCode.asp?lngWId=5&txtCodeId=378>

[http://download-uk.oracle.com/docs/html/B13915\\_02/i\\_olap\\_chapter.htm#BABCBDFA](http://download-uk.oracle.com/docs/html/B13915_02/i_olap_chapter.htm#BABCBDFA)

[http://download-uk.oracle.com/docs/html/B13915\\_02/i\\_rel\\_chapter.htm#BABGFCFG](http://download-uk.oracle.com/docs/html/B13915_02/i_rel_chapter.htm#BABGFCFG)

<http://training.inet.com/OLAP/home.htm>

<http://www.doc.gold.ac.uk/~mas01ds/cis338/index.html>

<http://www.maths.anu.edu.au/~steve/pdcn.pdf>

[www.kdnuggets.com](http://www.kdnuggets.com)

The Data Warehouse Toolkit by Ralph Kimball (John Wiley and Sons, 1996)

Building the Data Warehouse by William Inmon (John Wiley and Sons, 1996)

# Why Data Mining ? (1)

Huge volume of data, specially, in large companies available:

Product and process data

- Supplier data
- Development data
- Production data
- Sales data
- After sales data
- Customer data
- Finance data
- Employee data
- .....

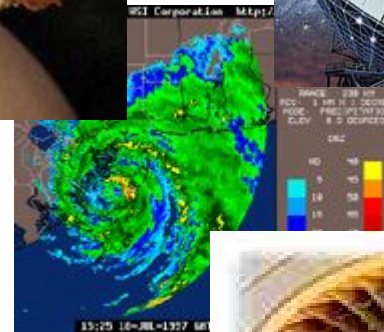
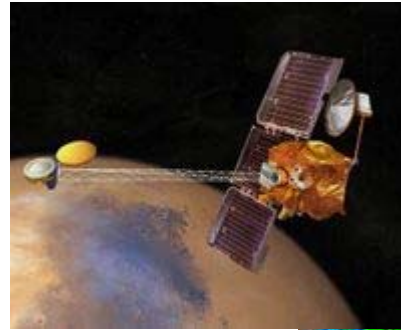
Two examples from Automotive Industry



**Data Mining: From high volume data to high value Information**

## Why Data Mining (2)

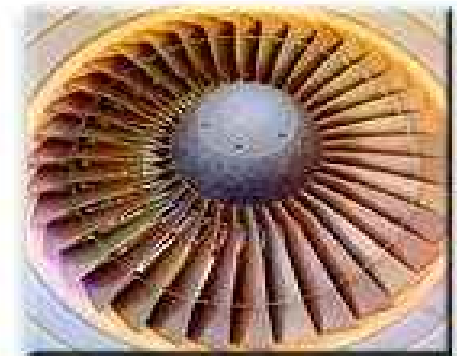
- Remote sensor satellite data
- Telescope data
- weather data
- Scientific simulations
- .....



generate terabytes of data  
in a short time

An interdisciplinary analysis environment  
is necessary

Data Mining: From high volume data to high value  
Information



# Examples of large databases

Source: <http://www.alltop10.net/top-10-list/others/not-specified/top-10-largest-databases-in-the-world.html>

## World Data Centre for Climate

If you had a 35 million euro super computer lying around what would you use it for? The stock market?

Building your own internet? Try extensive climate research – if there's a machine out there that has the answer for global warming, this one might be it. Operated by the

[Max Planck Institute for Meteorology](#) and [German Climate Computing Centre](#), [The World Data Centre for Climate](#)

(WDCC) is the largest database in the world.

The WDCC boasts [220 terabytes of data](#) readily accessible on the web including information on climate research and anticipated climatic trends, as well as 110 terabytes (or 24,500 DVD's) worth of climate simulation data. To top it off, six petabytes worth of additional information are stored on magnetic tapes for easy access.

How much data is six petabyte you ask?

Try [3 times the amount](#) of ALL the U.S. academic research libraries contents combined.“

## By the Numbers

- 220 terabytes of web data
- 6 petabytes of additional data

# Examples of large databases

## YouTube

Source: <http://www.alltop10.net/top-10-list/others/not-specified/top-10-largest-databases-in-the-world.html>

After less than two years of operation [YouTube](#) has amassed the largest video library (and subsequently one of the largest databases) in the world.

YouTube currently boasts a user base that watches more than 100 million clips per day accounting for more than 60% of all videos watched online.

In August of 2006, the Wall Street Journal projected YouTube's database to the sound of [45 terabytes of videos](#). While that figure doesn't sound terribly high relative to the amount of data available on the internet, YouTube has been experiencing a period of substantial growth (more than [65,000 new videos per day](#)) since that figures publication, meaning that YouTube's database size has potentially more than doubled in the last 5 months.

Estimating the size of YouTube's database is particularly difficult due to the varying sizes and lengths of each video. However if one were truly ambitious (and a bit forgiving) we could project that the YouTube database will expect to grow as much as 20 terabytes of data in the next month.

*Given: 65,000 videos per day X 30 days per month = 1,950,000 videos per month;  
1 terabyte = 1,048,576 megabytes. If we assume that each video has a size of 1MB, YouTube would expect to grow 1.86 terabytes next month. Similarly, if we assume that each video has a size of 10MB, YouTube would expect to grow 18.6 terabytes next month.*

### By the Numbers

100 million videos watched per day

65,000 videos added each day

60% of all videos watched online

At least 45 terabytes of videos



# What is Data Mining ?

**One of the most used definition (Fayyad et al 1996):**

*Knowledge Discovery in Databases (KDD)* is a **process** that aims at finding **valid, useful, novel** and **understandable** patterns in data

## **KDD and Data Mining:**

- KDD comes originally from AI
- Data Mining is a part of KDD
- In the praxis KDD and Data Mining are used as synonyms

## **Is a model the same as a pattern?**

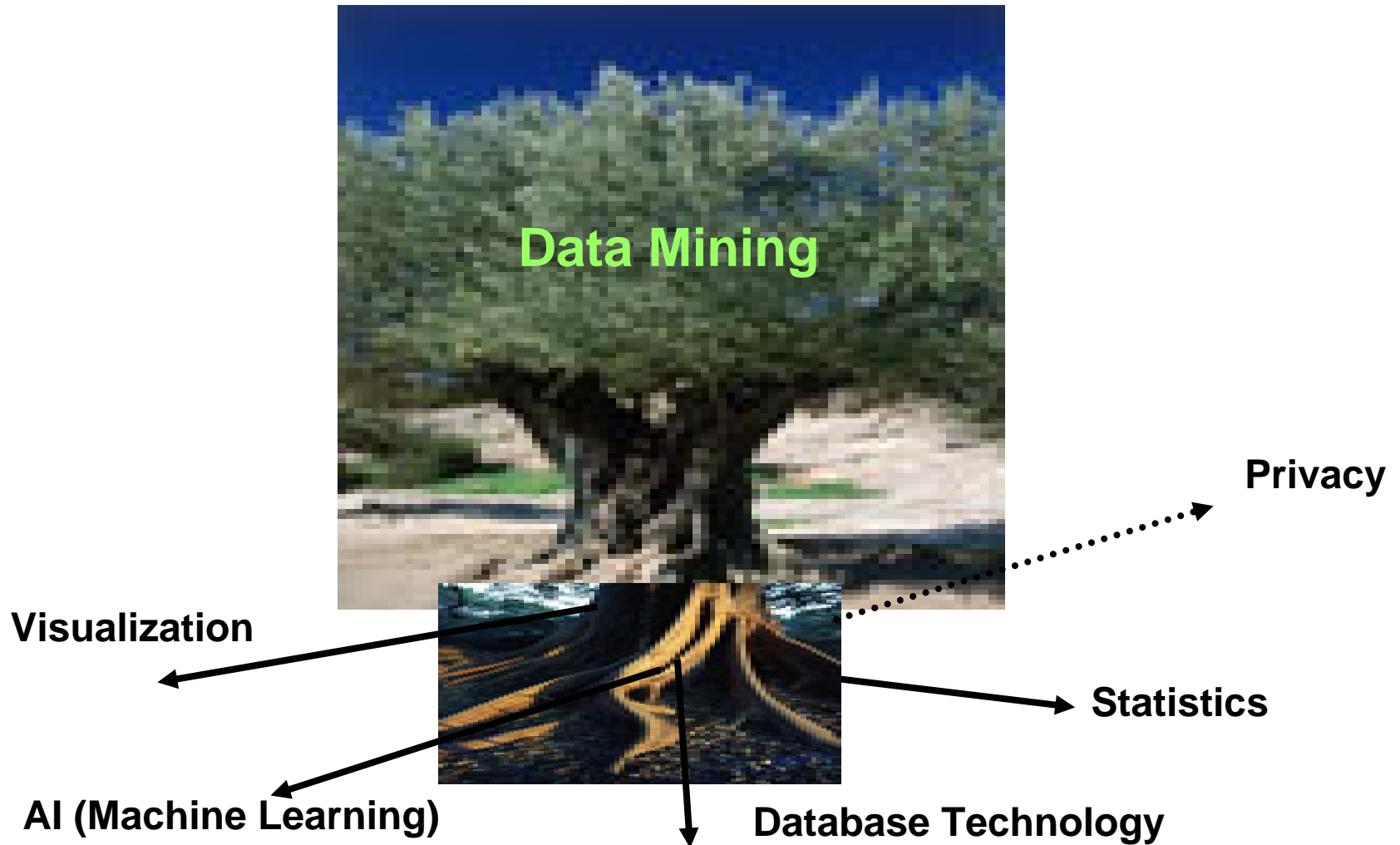
- $Y = 2 + 3X$  (Generality)
- If country= Iran then carpet export= high (Locality)

## **Implicit and explicit patterns**

Understandable pattern: Rules

Non-understandable: Trained artificial neural networks (ANN)

# Interdisciplinary aspects of Data Mining



# Other issues in recent data analysis

- Text Mining
- web Mining

Application of Data Mining Methods to text and web driven data

**Data Mining**

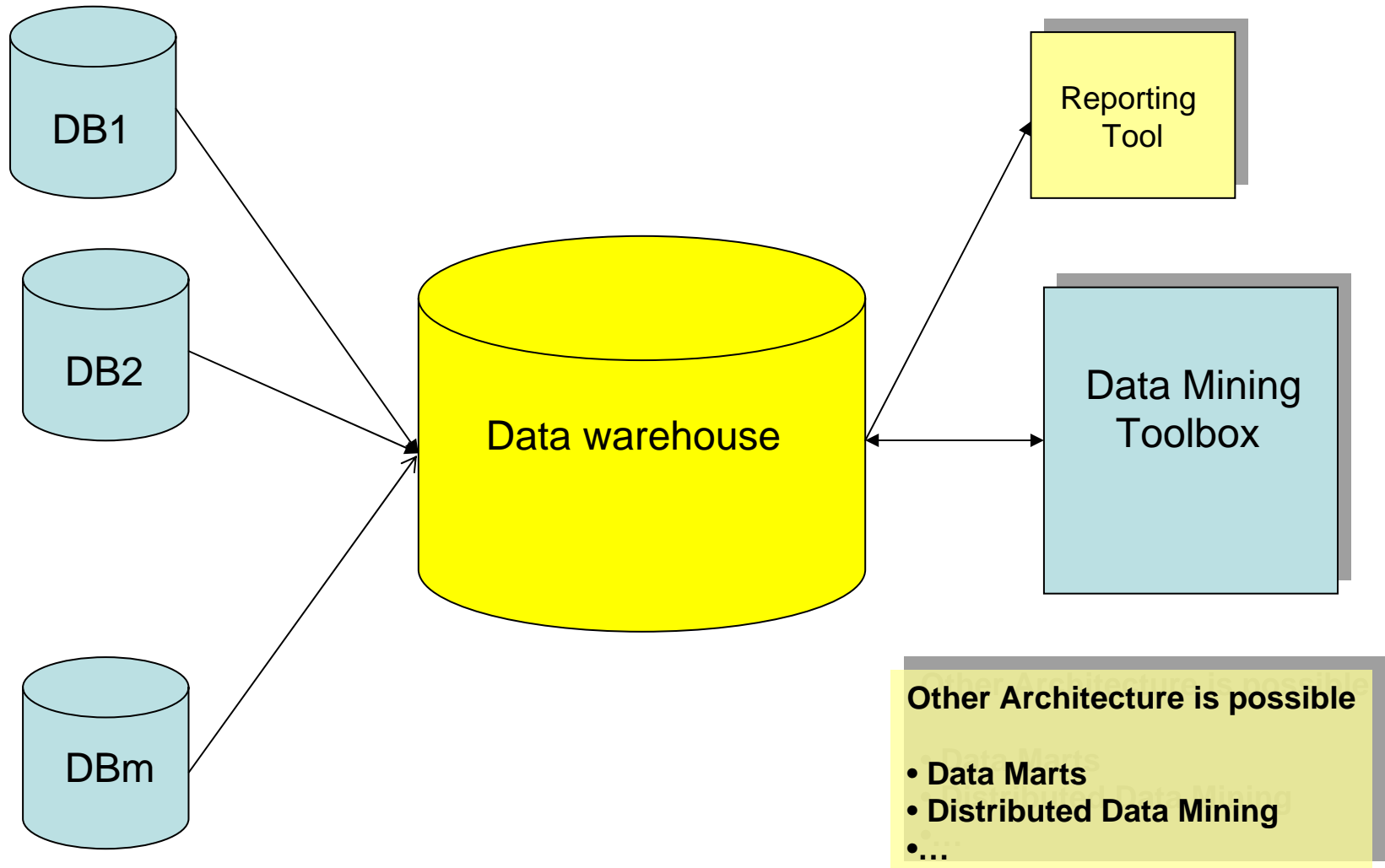
**Text Mining**

**web Mining**

**Information Mining**

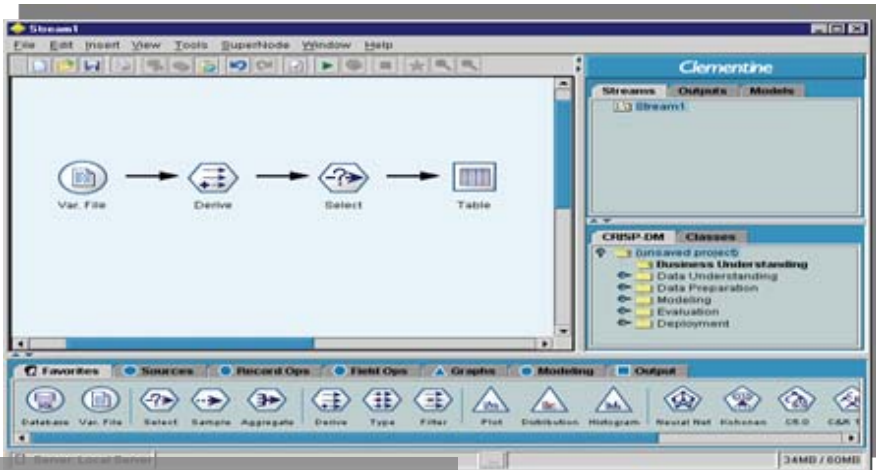
```
graph LR; DM[Data Mining] --> IM[Information Mining]; TM[Text Mining] --> IM; WM[web Mining] --> IM;
```

# Typical Data Mining Systems

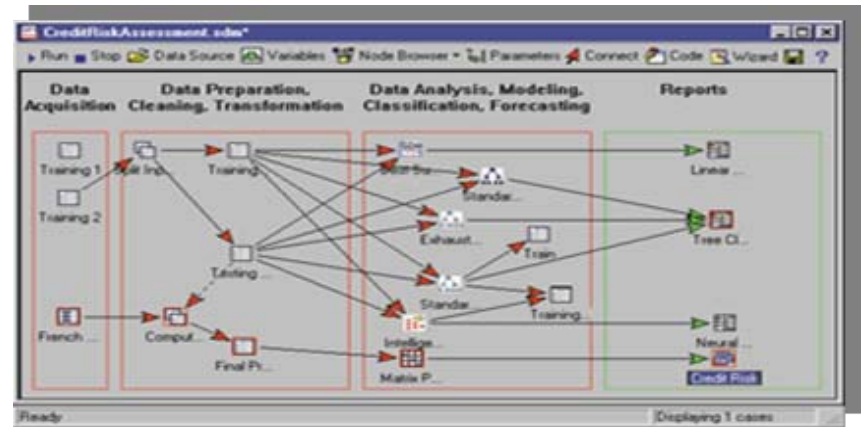


# Examples of Data Mining Tools (1)

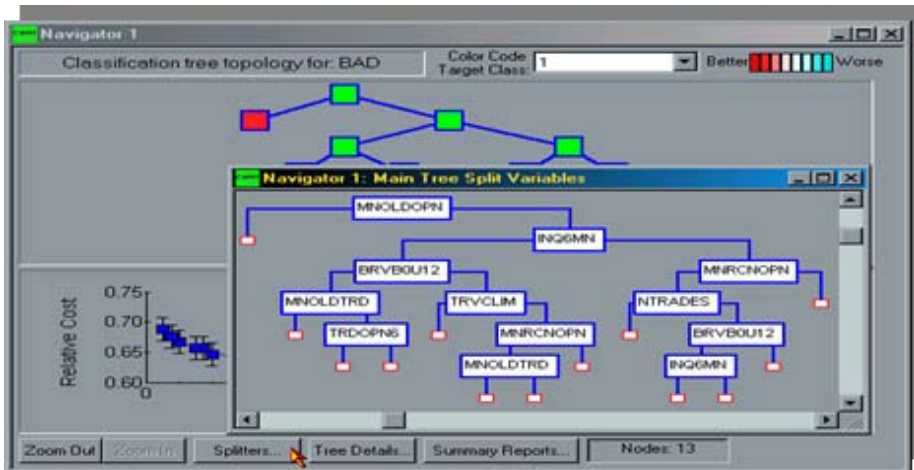
## SPSS Clementine



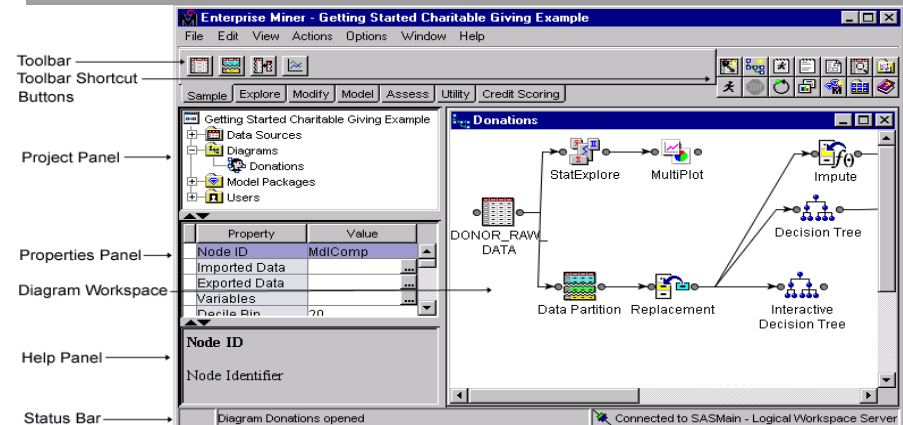
## Statistica Data Miner



## CART



## SAS Enterprise Miner



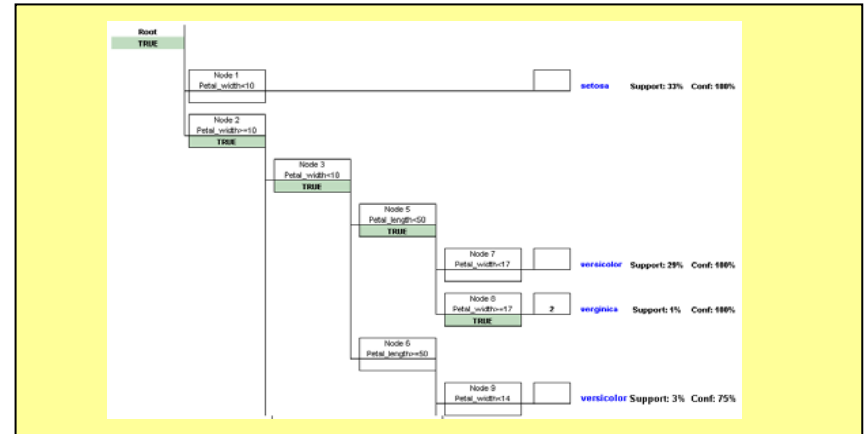


**(open source)**

Ian Witten, Frank Eibe: Data Mining: Practical Machine Learning Tools and Techniques (Second Edition)

<http://www.cs.waikato.ac.nz/ml/weka/>

## Excel based classification tree tool



<http://www.geocities.com/adotsaha/CTree/CTreeinExcel.html>

## Mangrove Decision Tree

**About**

Mangrove Decision Tree v1.0.4

Author:  
 Žiga Hajduković  
[www.tetrisid.org/zigah/hajdukovicz@mail.liudmila.org](http://www.tetrisid.org/zigah/hajdukovicz@mail.liudmila.org)

Mentors:  
 prof. dr. Ivan Bratko  
 dr. Dorian Šuc

**man-grove** /ˈmæŋɡrəʊv/ n [C] tropical tree growing in swamps and sending down new roots from its branches.

## CBA: Classification Based on Association Rules

**CBA**

Open training data Information Bar Mining Methods

Table Class Rules Tree Class Rules Tree Assot Rules

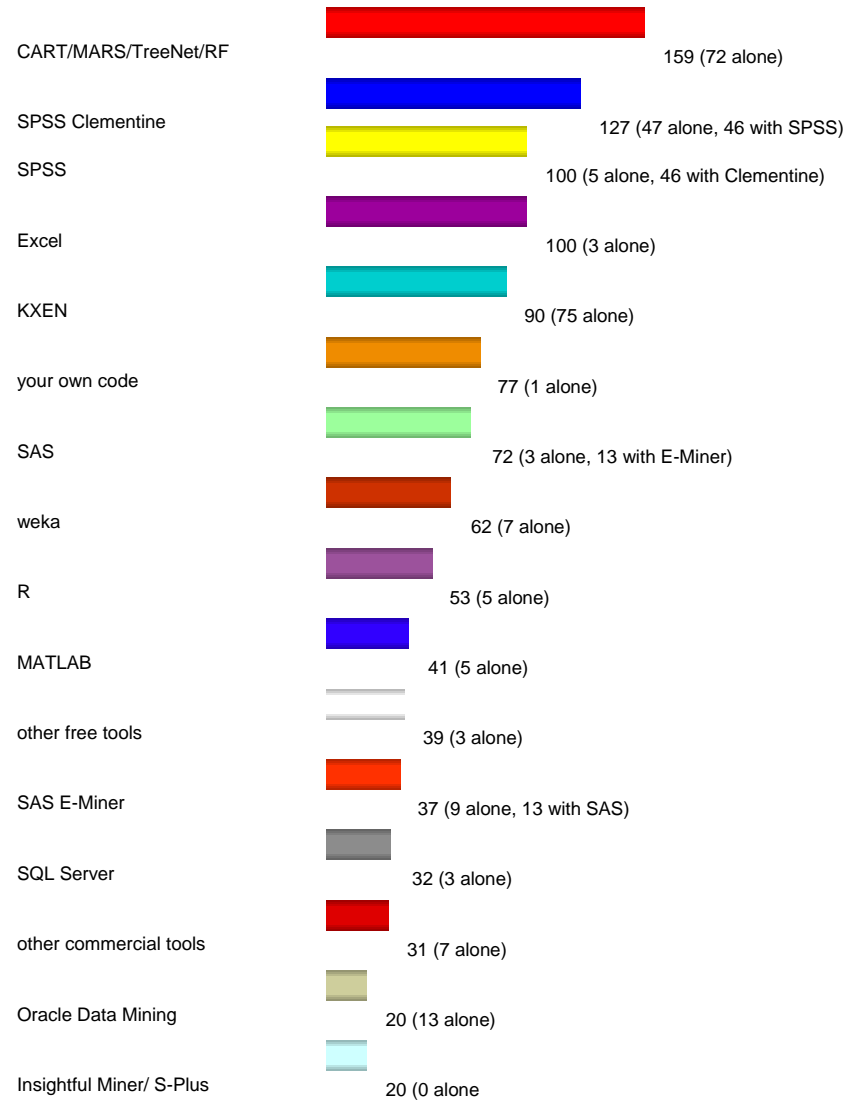
Start Learning Cross Validation

Show Rules Show Tree Show Rules

Rule Lattice Learning Progress

Source: [www.kdnuggets.com](http://www.kdnuggets.com)

Data mining/analytic tools you used in 2006: [561 voters]



# Comparison of Data Mining Tools

KDD-98:

## **A Comparison of Leading Data Mining Tools**

*John F. Elder IV & Dean W. Abbott*  
*Elder Research*

Fourth International Conference  
on Knowledge Discovery & Data Mining

Friday, August 28, 1998  
New York, New York



# Comparison of Data Mining Tools

Source: [http://web.cs.wpi.edu/~ruiz/KDDRG/dm\\_tools.html](http://web.cs.wpi.edu/~ruiz/KDDRG/dm_tools.html)

[Knowledge Discovery and Data Mining Research Group](#)

[KDDRG](#)

Project on

## Comparing Data Mining Tools and Systems

### COMPARING THE EFFECTIVENESS OF MINESET AND INTELLIGENT MINER IN KNOWLEDGE EXTRACTION

#### Project Members

- Faculty:** Carolina Ruiz, Matt Ward.
- Students:** Chris Martino.

#### Project Description

The primary goal of this project was to compare two commercial data mining packages: IBM's Intelligent Miner and SGI's MineSet, using association rules and decision trees as a basis. The main factors evaluated were ease of use, overall performance, and the presentation of results. To accomplish this, both packages were used to mine identical data sets and the results were compared.

# Some European funded Projects



- StatLog
- CRISP-DM
- INRECA
- MetaL
- READ
- Data Mining Grid

# Scientific Networking

1994-2001

European Network of Excellence in  
Machine Learning

The logo for MLnet, featuring the text "MLnet" in white on a dark blue background with a rainbow-colored arc to the right.

2002-2005

European Network of Excellence in  
Knowledge Discovery



Since 2005

Ubiquitous Knowledge  
Discovery



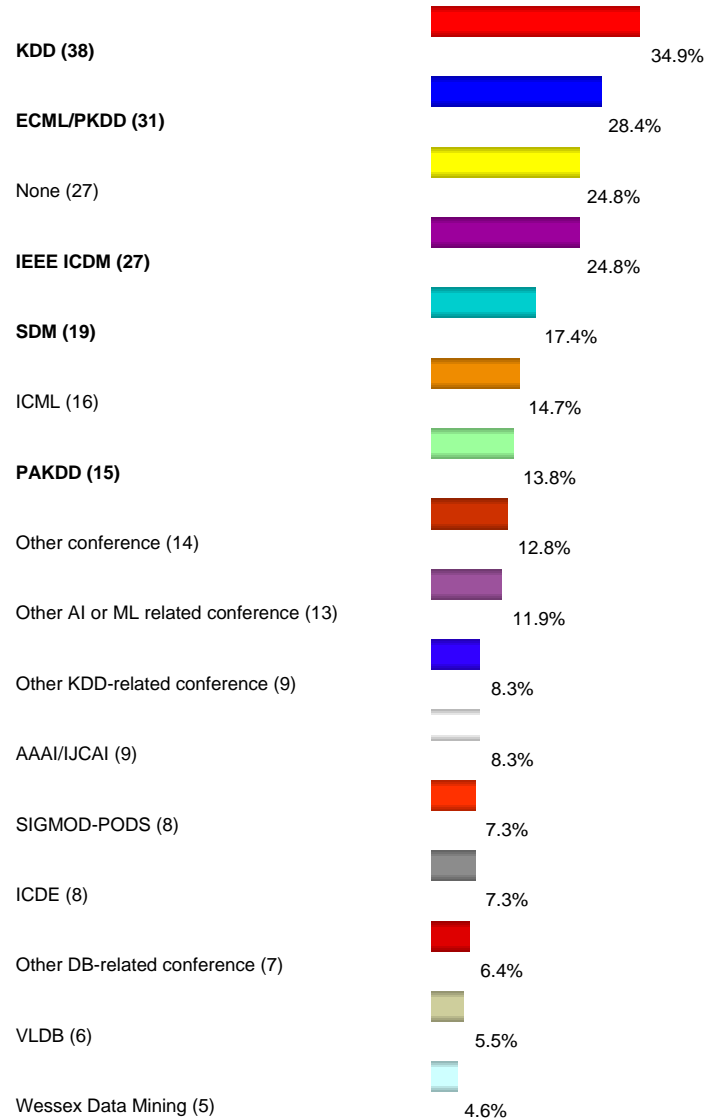
# Selected Books



# KDnuggets : Polls : Conferences papers were submitted to (Feb 2008)

Source: [www.kdnuggets.com](http://www.kdnuggets.com)

To which conferences did you submit a paper in the last 2 years: [109 voters total]



## Conferences

- KDD
- PKDD-ECML
- SIAM-Data Mining
- ICDM,
- PAKDD
- ICML
- .....

## Journals

- ACM Transactions on KDD (New)
- IEEE Transactions On Knowledge and Data Engineering
- KDD Explorations
- Data Mining and Knowledge Discovery
- Machine Learning
- ...

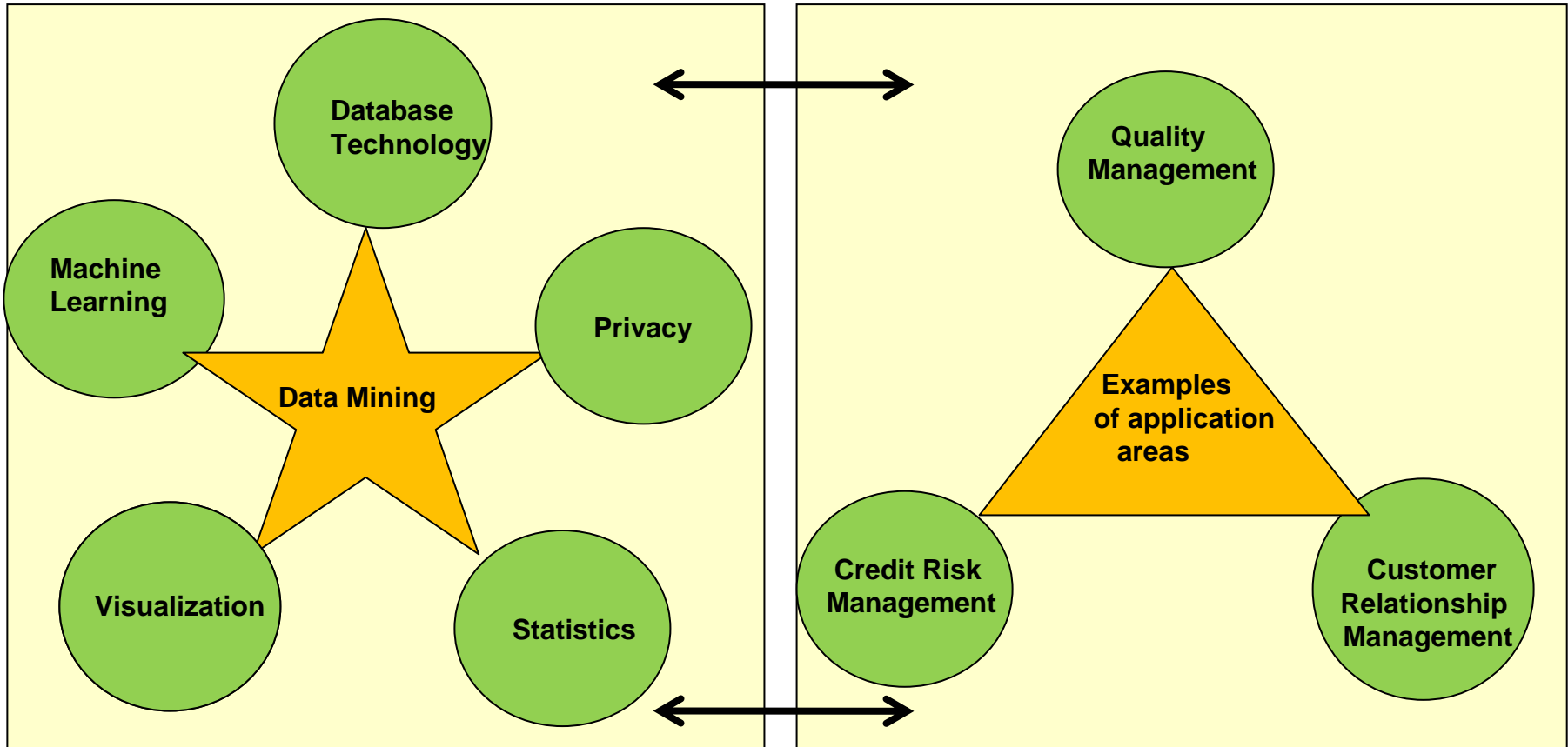
# Further References

- Michael Berry & Gordon Linoff, [Mastering Data Mining](#), John Wiley & Sons, 2000.
- Patricia Cerrito, [Introduction to Data Mining Using SAS Enterprise Miner](#), ISBN: 978-1-59047-829-5, SAS Press, 2006.
- K. Cios, w. Pedrycz, R. Swiniarski, L. Kurgan, [Data Mining: A Knowledge Discovery Approach](#), Springer, ISBN: 978-0-387-33333-5, 2007.
- Margaret Dunham, [Data Mining Introductory and Advanced Topics](#), ISBN: 0130888923, Prentice Hall, 2003.
- U. Fayyad, G. Piatetsky-Shapiro, P. Smyth, R. Uthurusamy, editors, [Advances in Knowledge Discovery and Data Mining](#), AAAI/MIT Press, 1996 (order on-line from [Amazon.com](#) or from [MIT Press](#)).
- Jiawei Han, Micheline Kamber, [Data Mining : Concepts and Techniques, 2nd edition](#), Morgan Kaufmann, ISBN 1558609016, 2006.
- David J. Hand, Heikki Mannila and Padhraic Smyth, [Principles of Data Mining](#), MIT Press, Fall 2000
- Trevor Hastie, Robert Tibshirani, Jerome Friedman, [The Elements of Statistical Learning: Data Mining, Inference, and Prediction](#), Springer Verlag, 2001.
- Mehmed Kantardzic, [Data Mining: Concepts, Models, Methods, and Algorithms](#), ISBN: 0471228524, Wiley-IEEE Press, 2002.
- Daniel T. Larose, [Discovering Knowledge in Data: An Introduction to Data Mining](#), ISBN: 0471666572, John Wiley, 2004 (see also [companion site for Larose book](#)).
- Glenn J. Myatt, [Making Sense of Data: A Practical Guide to Exploratory Data Analysis and Data Mining](#), John Wiley, ISBN: 0-470-07471-X, November 2006.
- Olivia Parr Rud, [Data Mining Cookbook](#), modeling data for marketing, risk, and CRM. Wiley, 2001.
- Pang-Ning Tan, Michael Steinbach, Vipin Kumar, [Introduction to Data Mining](#), Pearson Addison Wesley (May, 2005). Hardcover: 769 pages. ISBN: 0321321367
- Ripley, B.D. (1996) Pattern Recognition and Neural Networks, Cambridge: Cambridge University Press.
- Sholom M. Weiss and Nitin Indurkha, [Predictive Data Mining: A Practical Guide](#), Morgan Kaufmann, 1997
- Graham Williams, [Data Mining Desktop Survival Guide](#), on-line book (PDF).
- Ian Witten and Eibe Frank, Data Mining, Practical Machine Learning Tools and Techniques with Java Implementations, Morgan Kaufmann, ISBN 1558605525, 1999.
- Ian Witten and Eibe Frank, [Data Mining: Practical Machine Learning Tools and Techniques](#), 2nd Edition, Morgan Kaufmann, ISBN 0120884070, 2005

Examples of  
Data Mining applications in  
industry and commerce



# Optimal structure of a Data Mining Team



# Success Factors of DM-Applications

## KDD-95 panel on Commercial KDD Applications: The "Secret" Ingredients for Success

*Sunday, August 20, 1:30 -- 2:30 pm, Palais Des Congres,  
Montreal, Canada* Position statements of:

- Tej Anand, AT&T GIS
- Dr. Gholamreza Nakhaeizadeh, Daimler-Benz
- Evangelos Simoudis, IBM, co-chair
- Gregory Piatetsky-Shapiro, GTE Laboratories, co-chair
- Ralphe wiggins, statement Harvesting
- Kamran Parsaye, statement Discovery
- Mario Schkolnick, SGI

Source: <http://www-aig.jpl.nasa.gov/public/kdd95/KDD95-Panels.html>

# Success Parameters of Data Mining Solutions

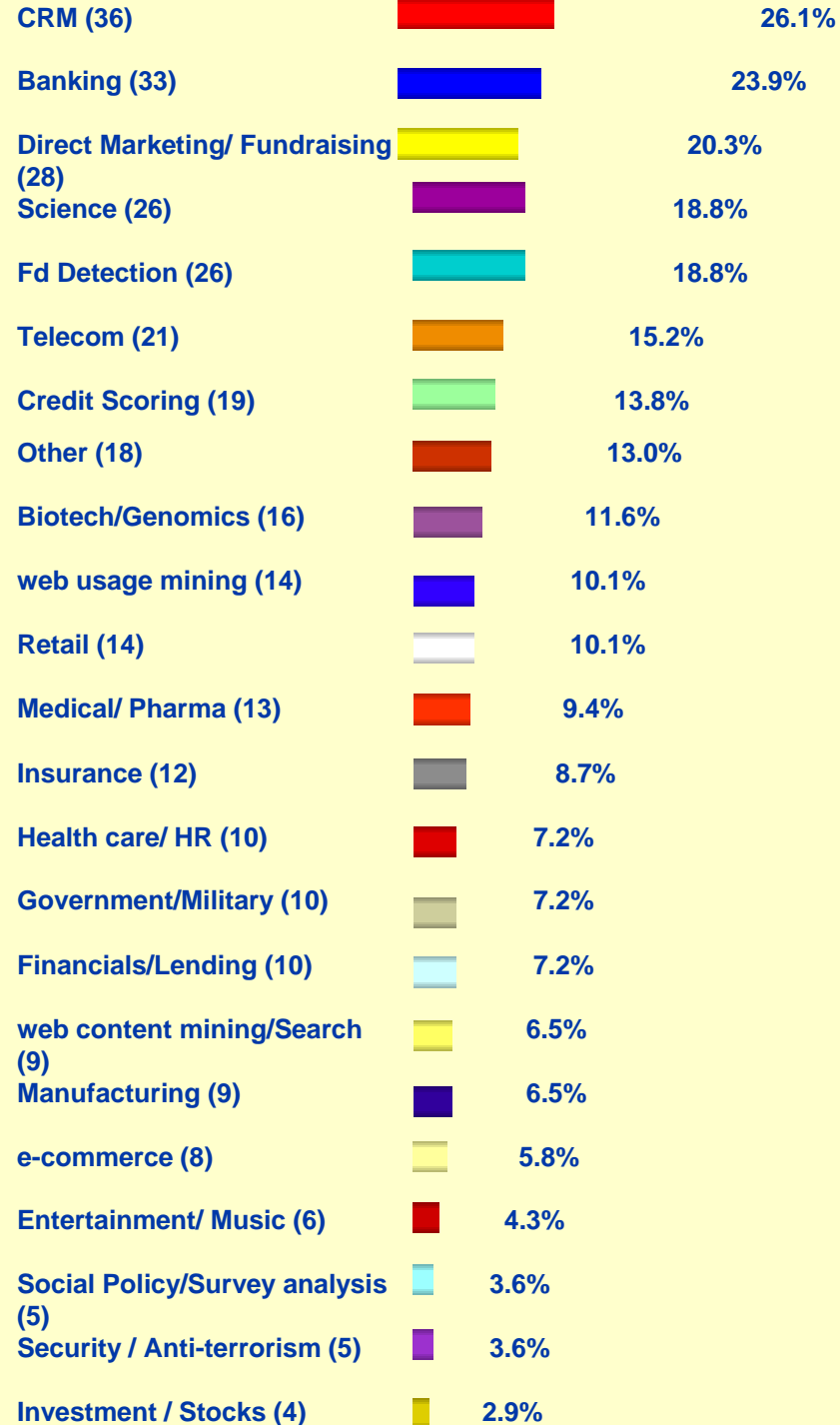
- Clear defined goals**
- Importance of the business problem**
- Management attention and support**
- Competence of the Data Mining team**
- Data availability and quality**
- Close cooperation between the Data Mining team and the end-users**
- Integration of the Data Mining Solution in the daily business process of the users**
- Other parameters (Please describe briefly)**

# where you applied data mining in the past 12 months

## Source:

[http://www.kdnuggets.com/polls/2007\\_data\\_mining\\_applications.htm](http://www.kdnuggets.com/polls/2007_data_mining_applications.htm)

## Potential Applications



# Predictive Modeling

# Predictive Modeling as an important component of CRM

work of statisticians such as Fisher in thirties in the area  
Discriminant analysis

Time series-referred and other prognosis procedures, 1950+

New impulse by DATA Mining 1989+

# Application in Business & Banking (1)

**Prediction of the registered trucks  
using Machine Learning**

**Used Methods:**

- **Regression analysis**
- **CART similar Regression Trees**

## Application in Business & Banking (2)

**Machine learning procedures for  
the treatment of rating risks in  
cellular phones business :  
theoretical aspects and empirical  
comparison**

**Used Methods:  
Different DM-Methods**





## Application in Business & Banking (3)

Customer Value:

Value Oriented Customers  
Acquisition in the  
Automotive Industry

Prediction of options  
Order using ANN and  
statistical Methods

# Application in Business & Banking (4)

**WAPS: a Data Mining Support Environment for the Planning of Warranty and Goodwill Costs in the Automobile Industry**

**Used Methods:  
Regression analysis**



# Application in Business & Banking (5)

## Kundenzufriedenheit als Maß der Dienstleistungsqualität

Eine Untersuchung am Beispiel von  
Mercedes-Benz-Niederlassungen und  
Mercedes-Benz-Vertragspartnern

Freie wissenschaftliche Arbeit  
zur Erlangung des Grades einer Diplom-Kauffrau  
an der Fakultät Wirtschaftswissenschaften  
der Technischen Universität Dresden

eingereicht von:  
cand. rer. pol.  
Stefanie Schleef

Referent:  
Prof. Dr. S. Müller

Dresden, den 1. Januar 1999

Customer satisfaction as measure  
of the service quality

## DIPLOMARBEIT

### KURZFRISTIGE DOLLARKURSPROGNOSE MIT KÜNSTLICHEN NEURONALEN NETZWERKEN

von

Lorenz Kleist

Januar 1998

Betreuer:

Diplom - Wirtschaftsingenieur Tae-Horn Hann  
Prof. Dr. G. Nakhaeizadeh

in Zusammenarbeit mit der Daimler-Benz AG  
Forschung und Technik, Ulm

Institut für Statistik und mathematische Wirtschaftstheorie  
Fakultät für Wirtschaftswissenschaften

Short term prediction of the dollar  
exchange rate by using  
neural networks

# Application in Business & Banking (6)

  
Universität Karlsruhe (TH)  
Institut für Statistik und Mathematische Wirtschaftstheorie  
April 1998

## DIPLOMARBEIT

**Marktforschung und Knowledge Discovery in Databases**  
Entdeckung des Verbesserungspotentials beim Verkaufsservice  
von MercedesBenz-Partnern

in Zusammenarbeit mit der  
DaimlerBenz AG - Forschung und Technik, Ulm und  
MercedesBenz Marktforschung PKW, Stuttgart

Betreuung:  
Prof. Dr. G. Nakhaeizadeh  
Dipl. Math. W. Heuser

  
Institut für  
Statistik und Mathematische Wirtschaftstheorie  
Universität Karlsruhe (TH)  
Prof. Dr. G. Nakhaeizadeh

Karlsruhe, 20.03.1996

**Markentreue**  
Eine  
Klassifikation der  
Mercedes-Benz-Käufer

**Diplomarbeit**  
Studienfach:  
Wirtschaftsingenieurwesen

in Zusammenarbeit mit  
Mercedes-Benz AG Stuttgart und  
Daimler-Benz Forschung und Technik Ulm

Betreuung:  
Prof. Dr. G. Nakhaeizadeh  
Dipl. W.-Ing. S. Ohl

von  
Kasra Jafar-Shaghghi

## Soft Matching of Customer Databases

Freie wissenschaftliche Arbeit  
zur Erlangung des akademischen Grades

„Diplom-Kaufmann“

Studiengang: Betriebswirtschaftslehre  
Wahlfach: Datenanalyse und Statistik

an der

Wirtschaftswissenschaftlichen Fakultät  
der Universität Augsburg

Eingereicht bei: Prof. Dr. Otto Opitz

Betreuer: Dr. Andreas Hilbert

Von: Martin Beer

Augsburg, im September 2003

**Market Research and  
Knowledge Discovery in  
Databases**

**Brand Loyalty  
A classification  
of Mercedes-Benz Buyers**

# Application in Business & Banking (7)

Anforderungsanalyse  
für den Einsatz automatischer Lernverfahren in Datenbanken  
am Beispiel eines Qualitäts-Informations-Systems  
in der Automobilindustrie

Lothar K. Becker

Diplomarbeit

Requirement analysis for the application of automatic learning procedures in data bases by the example of a quality information system

Diplomarbeit  
Ein auf Association Rules beruhender KDD-Ansatz  
zur Produktdiagnose in der Automobilindustrie

von  
cand. inform. Niels Grabe

Technische Universität Braunschweig  
Institut für Betriebssysteme und Rechnerverbund

In Zusammenarbeit mit  
Mercedes Benz AG Stuttgart und  
Daimler-Benz AG Forschung und Technik Ulm

A KDD-approach based on association rules for the product diagnosis in the automobile industry

Diplomarbeit

Ein KDD-Ansatz zur Prognose und Früherkennung von  
Ausfallquoten im Automobilbereich

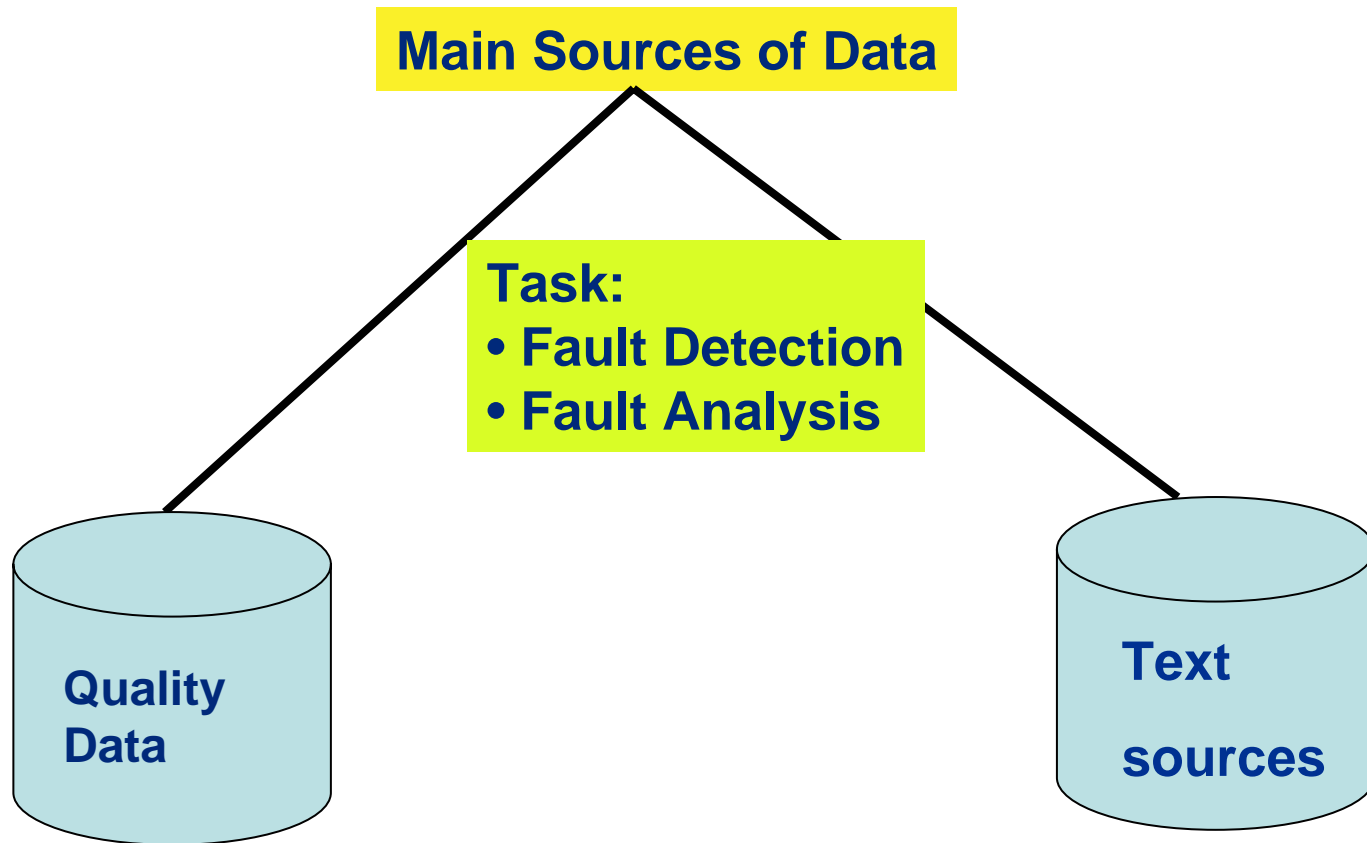
von  
cand. inform. Aljoscha Klose  
Matr.-Nr. 2 381 431

Technische Universität Braunschweig  
Institut für Betriebssysteme und Rechnerverbund

Aufgabenstellung und Betreuung:  
Prof. Dr. R. Kruse

A KDD-approach for prediction and early detection of failure rates in the automobile industry

# Data Mining in Quality Management (1)



# Data Mining in Quality Management (2)

## Application in Diagnostics

**Application of Machine Learning methods to support Knowledge Acquisition for Diagnosis Systems**

**(Huber and Nakhaeizadeh 1993)**



**Different DM-Algorithms**

# Data Mining in Quality Management (3)



- So far the DaimlerChrysler engineers responsible for the worldwide testing program for 60 F-Cell vehicles have collected a lot of information
- In fact, around one terabyte of data is currently stored on the server they use for work related to the project
- This huge amount of data has been collected since testing began more than one year ago - and it continues to grow gigabyte by gigabyte every day the customer-operated vehicles are on the road.

- The data log in the F-Cell is truly a black box
- The device, which is mounted behind the COMAND system in the center console, saves some 60 parameter values several times per second.
- If something unusual happens to the powertrain during a trip, the device will begin to store up to 600 parameter values at the same speed.