

2021



# Data Science and AI

Module 2
Part 1:

**SQL** and Databases



# Agenda: Module 2 Part 1

- Introduction to Databases
- The relational database paradigm
- Basic SQL
- RDBMS
- Advanced SQL
- SQL in Python
- NoSQL Databases



## Introduction to Databases

- Databases: definition, usage, features, applications
- Database Elements
- Database Principles
- The relational database paradigm
- SQL
- RDBMS



### Introduction to Databases

- What is a database?
  - a computer system that manages storage and querying of data
- How is a database used?
  - data insertion & retrieval are (typically) performed using a query language
    - a compact programming syntax
    - basic operators for data transformation
- What are the essential features of a database?
  - practical design for organising data
  - efficient methods to retrieve specific information
  - indexing, performance optimisation
  - reliability, security, backup & replication



## Why Use a Database?

- the standard solution for data storage
- much more robust than text, CSV or JSON files
- most analyses involve pulling data to and from a resource;
   in most settings, this means using a database
- many types and variants to serve different use cases
- rules on structure make writing and retrieving data more reliable and efficient
- provide a central source of "truth"



## Database Application Areas - Examples

- Operations
  - transaction systems
  - data capture
  - inventory management
- Data Warehouse
  - Reporting
  - Analytics
  - Data Science

- Master Data
  - products
  - customers
  - suppliers



### **Database Elements**

- tables
  - data storage by columns (attributes) and rows (records)
- keys
  - for matching indexed attributes across tables
- queries, views
  - for retrieving, subsetting, aggregating, joining data
- functions, procedures
  - reusable code units

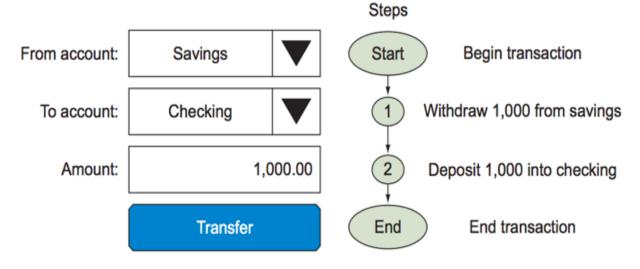
- types
  - reusable data structures
- triggers
  - procedures that run automatically when a specific event occurs
- jobs
  - batches of procedures that run on a schedule



## Database Principles: Transactional Integrity

### def: Transaction

- a unit of work performed against a database
- this term generally represents any change in database
- involves multiple steps





# Database Principles: ACID

def: ACID is a set of properties that guarantee that database transactions are processed reliably

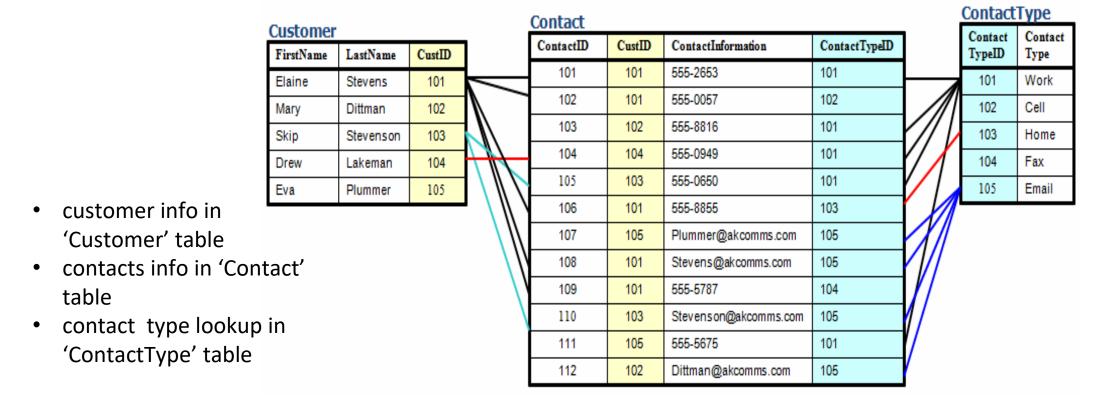


- Atomicity: if one part of the transaction fails, the entire transaction fails;
   the database state is left unchanged ('all or nothing')
- Consistency: ensures that any transaction will bring the database from one valid state to another
- Isolation: ensures that the concurrent execution of transactions results in a system state that would be obtained if transactions were executed serially (one after the other)
- Durability: ensures that once a transaction has been committed it will be unaffected by power loss, system crashes, or errors



## The relational Database Paradigm

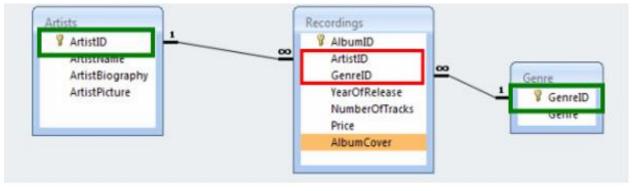
- each table in a database is devoted to one domain
- keys are used to connect tables in a logical manner

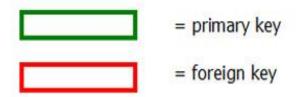




### Relational Databases

 queries can pull together information from multiple tables by matching foreign keys to primary keys





- 'ArtistID' is:
  - a foreign key in the 'Recordings' table
  - the primary key in the 'Artists' table
- 'GenrelD' is:
  - a foreign key in the 'Recordings' table
  - the primary key in the 'Genre' table



## **RDBMS**

- RDB = ?
  - relational database
- RDBMS = ?
  - relational database management system





### **Database Schema**

- table-level
  - columns and primary key
- database-level
  - overall design
    - data model (tables)
    - keys (PK, FK)
  - integrity constraints

- rationale
  - removes tight coupling of database objects and owners
  - improves security administration of database objects



# SQL (Structured Query Language)

- essentially a declarative language
  - data are typically retrieved as subsets of the rows and columns in one or more tables: 'rowsets'
  - the user encodes the kind of rowset to be returned
  - the database engine produces a **plan** for how to execute it
    - optimised if possible
    - may accept hints from user (e.g. indexes to use)
- 3 functional divisions:
  - data definition language (DDL)
    - schema creation and modification
  - data manipulation language (DML)
    - insert, update, delete
  - data control language (DCL)
    - access, security



### SQL - cont'd

simple rowset retrieval:

**SELECT** columns **FROM** table

conditional rowset retrieval:

SELECT columns FROM table WHERE condition

example (conditional rowset with ordering):

SELECT TOP 10 amount FROM sales WHERE amount > 99.99 **ORDER** BY amount



### SQL - cont'd

#### **Syntax**

- identifiers with embedded **spaces or punctuation** require implementation-specific delimiters
  - e.g. SQL Server allows "my table" or [my table]

(delimiters are optional, otherwise)

- namespace hierarchies are usually delimited with periods (full stops)
  - e.g. (SQL Server): myschema.mytable.mycolumn



### SQL - cont'd

#### **Syntax**

- SQL is case-insensitive
  - best to adopt a style, for readability
     (e.g. uppercase for SQL keywords, lowercase for identifiers)
- Microsoft and others extend the ANSI standard
  - extensions add power and convenience to programming
  - many extensions do not readily port between versions of SQL



## Indices (aka 'Indexes')

- An index is a column of unique numbers (one per row) used to speed up query performance
  - reduces number of database data pages that have to be scanned
  - can have > 1 index per table
  - usually based on single columns or tuples of columns
- a clustered index (e.g. SQL Server) determines physical order of data in a table
  - can only have 1 clustered index per table
- Building / rebuilding an index is an expensive operation
  - for inserting a large number of rows, it is usually best to drop the index, do the insert, then rebuild the index



## **Primary and Foreign Keys**

- primary key uniquely refers to each row in a table
  - can have only one per table
  - usually an integer
- *foreign key* refers to a row in a different table
  - is a primary key in the other table
  - can have any number per table
- Nb. the use of foreign keys reduces storage and makes database maintenance much easier



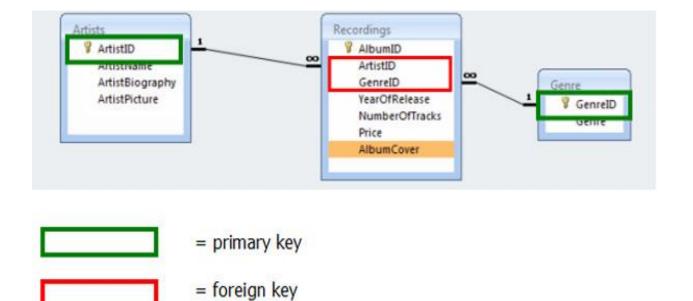
### Joins

- used (in queries) for
  - combining columns from different tables
  - filtering columns from one table using criteria in a different table
- joins match a foreign key in one table to a primary key in another table
- Nb. simple joins are generally quite fast, but compound joins (involving many tables) can be very slow
- a database join is analogous to a set operation in mathematics



### Joins - cont'd

Compound inner join example



Return artist name and album cover for every album of the 'rock' genre:

SELECT Artists.ArtistName,
Recordings.AlbumCover
FROM Artists
INNER JOIN Recordings
ON Artists.ArtistID = Recordings.ArtistID
INNER JOIN Genre
ON Recordings.GenreID = Genre.GenreID
WHERE Genre.Genre = 'rock'



### Joins - cont'd

#### **Left Join**

• all rows from 1<sup>st</sup> table, plus matching rows from 2<sup>nd</sup> table: SELECT cars.car, trucks.truck FROM cars
LEFT JOIN trucks ON cars.maker = trucks.maker

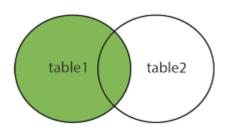
unmatched rows will have NULL in place of truck

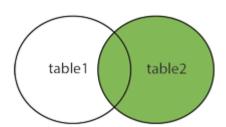
#### **Right Join**

• all rows from 2<sup>nd</sup> table, plus matching rows from 1<sup>st</sup> table: SELECT cars.car, trucks.truck FROM cars RIGHT JOIN trucks ON cars.maker = trucks.maker

unmatched rows will have NULL in place of car

Table 1	Table 2
aaa	aaa
bbb	XXX
CCC	ccc
ddd	ууу
eee	eee
fff	fff







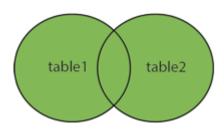
### Joins - cont'd

#### **Outer Join**

• all rows from 1<sup>st</sup> table, matched with all rows from 2<sup>nd</sup> table:

SELECT cars.car, trucks.truck FROM cars
OUTER JOIN trucks ON cars.maker = trucks.maker

returns every possible pairing of Car and truck



#### • uses:

- creating contingency tables
- creating dummy data for testing
- other?



## Lab 2.1.1: SQL

- Purpose:
  - Create account in Mode Analytics
  - To discover the basic features of SQL
- Tools and Resources:
  - Mode Analytics (account required)
- Materials:
  - Mode Analytics interactive SQL tutorial
     https://community.modeanalytics.com/sql/tutorial/introduction-to-sql/





## **Database Scripting**

- shell scripts / commands
  - for quick / convenient execution of routine tasks
    - populating / updating a database from a file
    - backing up or restoring a database
    - dumping a database object to a file
    - executing queries to deliver rowsets for subsequent analysis
    - moving data between databases, data lakes, etc.
- examples

```
psql -U postgres -d database_name -c "SELECT c_defaults FROM user_info WHERE c_uid = 'testuser'"
```

mysql -h "server-name" -u "root" "-pXXXXXXXX" "database-name" < "filename.sql"



### **Database Administration**

- granting permissions
  - users, roles
  - tables, views
- performing backups & recoveries
- creating & scheduling jobs
- Nb. It is not uncommon for a query to join tables from different databases
  - in SQL Server, the query must be created by the *single* owner of *both* databases
  - a database owner should be a virtual user -- not a particular person's login



## Discussion

• Why is the RDBMS still in use?

• QUESTIONS?



# **Advanced SQL**

- Aggregation functions
- Grouping
- Window functions



## **SQL** Aggregation functions

- aggregate many rows into a single resultant row
- common aggregation functions:

```
COUNT counts all rows meeting criterion
```

SUM sums selected field(s) in all rows meeting criterion

AVGaverages ...

MIN, MAX computes minimum/maximum of ...

- SQL engine may support user-defined aggregation functions
- example:

SELECT MIN(sale\_date) AS firstdt, MAX(sale\_date) AS lastdt, SUM(sales) AS netsales FROM sales



# Aggregating by Groups in SQL

- grouping allows aggregation functions to be applied to subsets based on row-level criteria
- adds GROUP BY clause to select statement
- example:

SELECT agent\_name, SUM(sales) AS netsales FROM sales GROUP BY agent\_name



## **SQL Window Functions**

- operates on a set of rows and return a value for each row
  - like aggregation, but performed in relation to current row
- example: running total

SELECT duration, SUM(duration)

OVER (ORDER BY start\_time) AS running\_total

FROM bikeshare

- OVER clause designates window
- ORDER BY sets sequence of rowset (oldest to newest values of start\_time)
- each row shows current duration and sum of all previous values of duration



## Lab 2.1.2: Advanced SQL

#### • Purpose:

To discover the more powerful features of SQL

#### Tools and Resources:

- Mode Analytics (account required)
- Mode Analytics interactive SQL tutorial

https://community.modeanalytics.com
/sql/tutorial/introduction-to-sql/





# SQL in Python

- Python/SQL integration paradigms
- Python with embedded SQL db (SQLite)
- Python with external SQL db (pyodbc)



# Python / SQL Integration Paradigms

#### Embedded

- an SQL RDBMS is emulated by a library designed to work with Python
- databases are not normally accessible outside of Python
- ideal for a self-contained Python app with its own db

#### External

- a stand-alone SQL RDBMS resides on a database server that other applications can connect to
- the db is made accessible to Python via an ODBC driver specific to the RDBMS in use
  - SQL Server, MySQL, DB2, etc.
- used when the Python app is just a client of a more general-purpose db



## Python with Embedded SQL Database

Example: SQLite

```
import sqlite3
connection = sqlite3.connect("company.db")

sql_command = """
CREATE TABLE employee (
staff_number INTEGER PRIMARY KEY,
fname VARCHAR(20),
Iname VARCHAR(30),
date_joined DATE);"""
```



## Python with External SQL Database

Example: pyodbc

```
import pyodbc
cnxn = pyodbc.connect("DSN=MSSQL-PYTHON")
cursor = cnxn.cursor()
cursor.tables()
rows = cursor.fetchall()
for row in rows:
    print row.table_name
```



# Python with pyodbc

Python uses a cursor to iterate through a returned rowset

```
import pyodbc
import pandas.io.sql as psql
import pandas as pd
cxnstr = "Server=myServerAddress;Database=myDB;User Id=myUsername;Password=myPass;"
cxn = pyodbc.connect(cxnstr)
cursor = cnxn.cursor()
cursor.execute("""SELECT ID, FirstName, LastName FROM mytable""")
rows = cursor.fetchone()
objects list = []
  for row in rows:
    d = collections.OrderedDict()
    d['UserID']= row.ID
    d['FirstName']= row.FirstName
    d['LastName']= row.LastName
cxn.close()
```



### **HOMEWORK**

#### 1. Install

 MongoDB Community Server center#community https://www.mongodb.com/download-

Neo4j Community Server

https://neo4j.com/download-center/#releases

### 2. Install Python packages:

- pymongo (conda)
- neo4j-driver (pip)



## Lab 2.1.3: SQL in Python

- Purpose:
  - To investigate SQL implementation in Python
- Tools and Resources:
  - Sqlit: Install on your labtop https://www.sqlite.org/download.html
  - Jupyter Notebooks
  - Python package sqlite3
- Materials:
  - 'Lab 2.1.3 Databases.ipynb'
- Data:
  - 'housing-data.csv'





### Scalable SQL

- massively parallel processing relational database systems (MPP RDBMS)
  - (expensive) architecture supports scalability and high performance









NoSQL databases with SQL



# **NoSQL** Databases

- What (and why) are NoSQL databases
- Characteristics of NoSQL databases
- NoSQL database types



# What and Why are NoSQL Databases

#### What

- non-tabular
- non-relational

### Why

- scalable
- flexible
- simple

- storage and retrieval of data that is modelled by means other than tabular relations
- not a new idea (1960+)
- supports distributed storage and processing
- term 'NoSQL' popularised by Facebook, Amazon, Google, etc.



### Characteristics of NoSQL Databases

### **Advantages**

- avoid administration & expense of RDBMS
- small footprint
- easy to modify schemas







#### **Use Cases**

- simple data requirements
- application-specific data
- start-ups









### Characteristics of NoSQL Databases – cont'd

### **Disadvantages**

- many don't support true ACID transactions
  - application code is obliged to try to manage concurrency issues
- easy to modify schemas
  - application developers need to collaborate closely to ensure schema development is under control
- much slower than RDBMS
- lack powerful management & development features of RDBMS



### **NoSQL Databases Types**

- wide column store
  - > Hadoop / HBase, MapR, BigTable, Hortonworks, Cloudera, Cassandra, Informix
- document store
  - > MongoDB, CouchDB, Azure DocumentDB
- key value / tuple store
  - > DynamoDB, Azure Table Storage, Oracle NoSQL
- graph databases
  - > Neo4j
- multi-model databases
  - > ArangoDB, OrientDB
- object databases
  - > Versant, Objectivity VelocityDB



# NoSQL Databases – cont'd

- Document databases
  - MongoDB



### **Document Databases**

- semi-structured data
- records do not all need to have the same fields

#### XML:

a record is a block of XML tags and values

```
<contact>
<firstname>Bob</firstname>
<address>5 Oak St.</lastname>
<hobby>saling</hobby>
</contact>
```

#### **JSON:**

a record is a list of key:value pairs

```
{
    "FirstName": "Bob",
    "Address": "5 Oak St.",
    "Hobby": "sailing"
}
```



# MongoDB

- an open-source document database
  - no charge for Community Server version
- high performance
  - embedded data models reduce I/O activity
  - indexes
    - can include keys from embedded documents, arrays
- high availability
  - replication facility
    - automatic fail-over
    - data redundancy
- automatic scalability (horizontal)





### MongoDB

- CRUD **v** 
  - create, read, update, delete
- ACID ?
  - traditionally:
    - document databases are only ACID-compliant only at document level
    - no transactions for containing multiple I/O operations
    - application code is obliged to emulate transactions, if required
    - latency results in an eventual consistency model
  - MongoDB 4.0
    - introduced transactions



## MongoDB: High-Level Objects

#### Document:

- a set of field:value pairs
  - values can be hierarchical
- analogous to RDB row

#### examples:

```
{ name: "sue", age: 26, status: "A", groups: [ "news", "sports" ] }
{ name: "fred", status: "A", groups: [ "sports", "hobbies", "cars" ] }
{ name: { first: "fred", last: "bloggs" }, status: "A", groups: [ "sports", "hobbies", "cars" ] }
```

#### Collection:

- a logical group of documents
- analogous to RDB table



# MongoDB with Python

### example:

```
import pymongo
connection =
pymongo.MongoClient("mongodb://localhost")
db = connection.school
students = db.students
cursor = students.find()
    # find minimum homework score...
for doc in cursor:
  scores = doc["scores"]
  minhs = 101
  for entry in scores:
    if entry["type"] == "homework":
       if entry["score"] < minhs:</pre>
          minhs = entry["score"]
```

- create mongod client
- connect to database 'school'
- create alias for table 'students'
- fetch all rows into cursor
- loop through docs in cursor
- get value (doc) associated with key 'scores'
- initialise min to impossibly large value (> 100%)
- loop through 'scores' docs, looking for 'homework' keys
- test each corresponding score to find new minimum



# Lab 2.1.4: Python with MongoDB (Optional homework)

- Purpose:
  - To develop skills in NoSQL database programming with MongoDB
- Materials:
  - 'Lab 2.1.4.ipynb'





# NoSQL Databases – cont'd

- Graph Databases
  - Neo4j



## **Graph Databases**

- model members and relationships as a network
- high-level objects:
  - nodes
    - entities (e.g. people, accounts, organisations)
  - edges
    - connections between nodes
  - properties
    - node: differentiates types of nodes
      - roles, classifications, etc.
    - edge: describes the relationship
      - 2-way, 1-way, directionless
      - friend, follower, commenter, etc.



# Neo4j

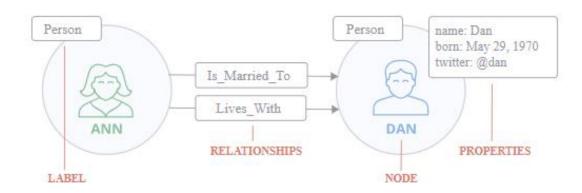
- open source
  - no charge for *Community Server* edition
- ACID-compliant, transactional database with native graph storage & processing
- online backup
- high availability
- most popular graph database





### Neo4j: Basics

#### The Labeled Property Graph Model



#### Nodes

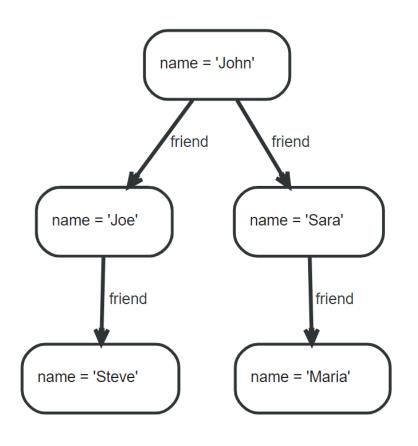
- Nodes are the main data elements
- Nodes are connected to other nodes via relationships
- Nodes can have one or more properties (i.e., attributes stored as key/value pairs)
- Nodes have one or more labels that describes its role in the graph

#### Relationships

- Relationships connect two nodes
- Relationships are directional
- Nodes can have multiple, even recursive relationships
- Relationships can have one or more properties (i.e., attributes stored as key/value pairs)



# Cypher Query Language



example: find friends of friends of John

```
MATCH (john {name: 'John'})-[:friend]->
()-[:friend]->(fof)
    RETURN john.name, fof.name
```

#### output:



### Lab 2.1.5: Neo4j and Python (Optional homework)

#### Purpose:

- To develop familiarity with graph database programming (Neo4j) using:
  - the Neo4j GUI
  - a Python library for Neo4j

#### Resources:

- Neo4j built-in tutorials
- Cypher cheatsheet
  - https://neo4j.com/docs/cypher-refcard/3.2/

#### Materials:

• 'Lab 2.1.5.ipynb'





# Discussion: SQL vs NoSQL

SQL	NoSQL
Traditional rows and columns  • governed data model	No predefined data structure  • database at mercy of developers
Strict structure (incl. primary keys)  • schema changes difficult, risky	Ideal for unstructured data  • schema can change with application requirements
Entire column for each feature	Cheaper hardware
Industry standard	Supports design flexibility & growth  > popular among startups
ACID	Application code must manage transactions



# Discussion: NoSQL with SQL?!

Why has SQL infiltrated the NoSQL paradigm?



# Questions?



# Appendices



### Relational Databases – Normalisation

#### Codd's 1st-normal form

- the domain of each attribute contains only atomic (indivisible) values
- the value of each attribute contains only a single value from that domain

#### Customer

Customer ID	First Name	Surname	Telephone Number	
123	Pooja	Singh	555-861-2025, 192-122-1111	
456	San	Zhang	(555) 403-1659 Ext. 53; 182-929-2929	
789	John	Doe	555-808-9633	



#### Customer

Customer ID	First Name	Surname	Telephone Number
123	Pooja	Singh	555-861-2025
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### Relational Databases - - Normalisation - cont'd

#### Codd's 2nd-normal form

- in 1st-normal form
- no non-prime attribute is dependent on any proper subset of any candidate key of the relation

(an attribute that is not a part of any candidate key of the relation)

#### **Electric Toothbrush Models**

Manufacturer	<u>Model</u>	Model Full Name	Manufacturer Country
Forte	X-Prime	Forte X-Prime	Italy
Forte	Ultraclean	Forte Ultraclean	Italy
Dent-o-Fresh	EZbrush	Dent-o-Fresh EZbrush	USA
Kobayashi	ST-60	Kobayashi ST-60	Japan
Hoch	Toothmaster	Hoch Toothmaster	Germany
Hoch	X-Prime	Hoch X-Prime	Germany



#### **Electric Toothbrush Manufacturers**

Manufacturer	Manufacturer Country
Forte	Italy
Dent-o-Fresh	USA
Kobayashi	Japan
Hoch	Germany

#### **Electric Toothbrush Models**

Manufacturer	Model	Model Full Name
Forte	X-Prime	Forte X-Prime
Forte	Ultraclean	Forte Ultraclean
Dent-o-Fresh	EZbrush	Dent-o-Fresh EZbrush
Kobayashi	ST-60	Kobayashi ST-60
Hoch	Toothmaster	Hoch Toothmaster
Hoch	X-Prime	Hoch X-Prime





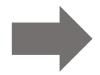
### Relational Databases - - Normalisation - cont'd

#### Codd's 3rd-normal form

- in 2nd-normal form
- every non-prime attribute (of a table) is non-transitively dependent on every key (of a table)

#### **Tournament Winners**

<u>Tournament</u>	<u>Year</u>	Winner	Winner Date of Birth
Indiana Invitational	1998	Al Fredrickson	21 July 1975
Cleveland Open	1999	Bob Albertson	28 September 1968
Des Moines Masters	1999	Al Fredrickson	21 July 1975
Indiana Invitational	1999	Chip Masterson	14 March 1977



#### **Tournament Winners**

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Indiana Invitational	1999	Chip Masterson		

Winner Dates of Birth





# Which RDBMS Object to Use When

### queries

- ad hoc queries
- stored or generated in application code

#### views

- stored (reusable) queries
- can incorporate joins with other views
- **preferable** to queries in application code

### stored procedures

- more powerful than views (can query and/or modify data)
- preferred for delivering data to applications (security, control, maintainability)

### reports

- formatted output containers based on tables, views
- text & graphics
- usually provided via a separate application (designed for but existing outside the RDBMS)
- may have built-in subscription service



# **End of Presentation!**