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## Logical foundations of databases

Diego Figueira

Gabriele Puppis

CNRS LaBRI



#### Recap

- Relational model (tables)
- Relational Algebra (union, product, difference, selection, projection)
- SQL (SELECT ... FROM ... WHERE ...)
- RA  $\approx$  basic SQL
- First-order logic (syntax, semantics)
- Expressiveness: FO =\* RA

FO can serve as a **declarative** query language on relational databases : we express the properties of the answer

Tables = Relations Rows = Tuples Queries = Formulas

[E.F. Codd 1972]

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RA = \*FOHow = What

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Tables = Relations Rows = Tuples Queries = Formulas

RA = \*FOHow = What



RA and FO logic have roughly\* the same expressive power! [E.F. Codd 1972]

\*FO without functions, with equality, on finite domains, ...

RA ⊆ FO

- $R_1 \times R_2 \longrightarrow R_1(x_1, ..., x_n) \wedge R_2(x_{n+1}, ..., x_m)$
- $R_1 \cup R_2 \longrightarrow R_1(x_1, ..., x_n) \vee R_2(x_1, ..., x_n)$

• 
$$\sigma_{\{i_1=j_1,...,i_n=j_n\}}(R) \rightarrow R(x_1,...,x_m) \wedge (x_{i_1}=x_{j_1}) \wedge \cdots \wedge (x_{i_n}=x_{j_n})$$

- $\pi_{\{i_1,...,i_n\}}(R) \longrightarrow \exists (\{x_1,...,x_m\} \setminus \{x_{i_1},...,x_{i_n}\}). R(x_1,...,x_m)$
- $R_1 \setminus R_2 \longrightarrow R_1(x_1, ..., x_n) \land \neg R_2(x_1, ..., x_n)$

• ...



 $FO \subseteq RA$  does not hold in general!



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# "the complement of R" $\notin RA \in FO: \neg R(x)$

---> We restrict variables to range over active domain



to active domain

FO ⊈ RA

"the complement of R"  $\notin RA \in FO : \neg R(x)$ 

----> elements in the relations ----> We restrict variables to range over active domain

FOact = FO restricted to active domain 

#### Formal Semantics of FOact

 $G \models_{\alpha} \exists x \varphi$  iff for some  $v \in ACT(G)$  and  $\alpha' = \alpha \cup \{x \mapsto v\}$  we have  $G \models_{\alpha'} \varphi$ 

 $G \models_{\alpha} \forall x \varphi$  iff for every  $v \in ACT(G)$  and  $\alpha' = \alpha \cup \{x \mapsto v\}$  we have  $G \models_{\alpha'} \varphi$ 

 $G \models_{\alpha} \phi \land \psi$  iff  $G \models_{\alpha} \phi$  and  $G \models_{\alpha} \psi$ 

 $G \models_{\alpha} \neg \phi$  iff it is not true that  $G \models_{\alpha} \phi$ 

 $G \models_{\alpha} x = y$  iff  $\alpha(x) = \alpha(y)$ 

 $G \models_{\alpha} E(x,y)$  iff  $(\alpha(x),\alpha(y)) \in E$ 

 $ACT(G) = \{v \mid \text{for some } v': (v,v') \in E \text{ or } (v',v) \in E\}$ 



FO<sup>act</sup> ⊆ RA

Assume: 1.  $\phi$  in normal form:  $(\exists^* (\neg \exists)^*)^* + \text{quantifier-free } \psi(x_1,...,x_n)$ 2.  $\phi$  has n variables  $\exists x_1 \exists x_2 \neg \exists x_3 \exists x_4 . (E(x_1,x_3) \land \neg E(x_4,x_2)) \lor (x_1=x_3)$ 

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 $FO^{act} \subseteq RA$ 

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 $FO^{act} \subseteq RA$ 

1.  $\phi$  in normal form:  $(\exists^* (\neg \exists)^*)^* + \text{quantifier-free } \psi(x_1,...,x_n)$ Assume: 2.  $\phi$  has n variables  $\pi_{\{1,...,n\}}(\sigma_{\{i_1=n+1,...,i_t=n+t\}}(Adom^n \times R))$  $\exists x_1 \exists x_2 \neg \exists x_3 \exists x_4 . (E(x_1, x_2))$ Adom = RA expression for activ •  $(R(x_{i_1},...,x_{i_t}))$   $\rightarrow R$ 

 $\mathbf{FO}^{\mathsf{act}} \subseteq \mathbf{RA}$ 

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 $FO^{act} \subseteq RA$ 

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## Corollary



FO<sup>act</sup> is equivalent to RA

**Question 1:** How is  $\pi_2(\sigma_{1=3}(R_1 \times R_2)$  expressed in FO? **Remember:**  $R_1, R_2$  are binary

Question 2: How is  $\exists y, z$ . ( $R_1(x, y) \land R_1(y, z) \land x \neq z$ ) expressed in RA? Remember: The signature is the same as before ( $R_1, R_2$  binary)

- $\mathbf{R}_1 \cup \mathbf{R}_2$
- $R_1 \times R_2$
- $\bullet \ R_1 \setminus R_2$
- $\sigma_{\{i_1=j_1,...,i_n=j_n\}}(R) \coloneqq \{(x_1,...,x_m) \in R \mid (x_{i_1}=x_{j_1}) \land \dots \land (x_{i_n}=x_{j_n})\}$ •  $\pi_{\{i_1,...,i_n\}}(R) \coloneqq \{(x_{i_1},...,x_{i_n}) \mid (x_1,...,x_m) \in R\}$

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Answer:  $\exists x_1, x_3, x_4 (R_1(x_1, x_2) \land R_2(x_3, x_4) \land x_1 = x_3)$ 

Question 2: How is  $\exists y, z : (R_1(x,y) \land R_1(y,z) \land x \neq z)$  expressed in RA? Remember: The signature is the same as before  $(R_1, R_2 \text{ binary})$ 

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**Answer:**  $\pi_1(\sigma_{\{2=3,1\neq4\}}(R_1 \times R_1))$ 





Algorithmic problems for query languages

**Evaluation problem:** Given a query Q, a database instance db, and a tuple t, is  $t \in Q(db)$ ?

---> How hard is it to retrieve data?

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Equivalence problem: Given queries  $Q_1$ ,  $Q_2$ , is  $Q_1(db) = Q_2(db)$ for all database instances db?

---- Can we safely replace a query with another? (Query optimization)

## Complexity theory

What can be mechanized?  $\rightarrow$  decidable/undecidable How hard is it to mechanise?  $\rightarrow$  complexity classes



#### 

Complexity theory H's 10th рСр Domino What can be **mechanized**?  $\rightarrow$  decidable/undecidable How hard is it to mechanise?  $\rightarrow$  complexity classes • usage of resources: • time • memory Algorithm Alg is TIME-bounded by a function  $f: \mathbb{N} \longrightarrow \mathbb{N}$  if Alg(input) uses less than f(|input|) units of TIME.







 $\mathsf{LOGSPACE} \subseteq \mathsf{PTIME} \subseteq \mathsf{PSPACE} \subseteq \mathsf{EXPTIME} \subseteq \cdots$


**Evaluation problem:** Given a FO formula  $\phi(x_1, ..., x_n)$ , a graph G, and a binding  $\alpha$ , does G  $\models_{\alpha} \phi$ ?

# Satisfiability problem: Given a FO formula $\phi$ , is there a graph G and binding $\alpha$ , such that $G \models_{\alpha} \phi$ ?

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**WINDECIDABLE** ---> both for \= and \=finite

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UNDECIDABLE ---> by reduction to the satisfiability problem

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**WALE**Weight with the second second

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• UNDECIDABLE → both for ⊧ and ⊧<sub>finite</sub> [Trakhtenbrot '50]

Proof: By reduction from the Domino (aka Tiling) problem.

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Proof: By reduction from the Domino (aka Tiling) problem.

Reduction from P to P': Algorithm that solves P using a O(1) procedure " P'(x)" that returns the truth value of P'(x).

Domino -



Domino

Input: 4-sided dominos:



**Output:** Is it possible to form a white-bordered rectangle? (of any size)









Domino

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**Output:** Is it possible to form a white-bordered rectangle? (of any size)



Rules: sides must match, you can't rotate the dominos, but you can 'clone' them.

Domino - Why is it undecidable?

It can easily encode *halting* computations of Turing machines:



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(initial configuration)

(halting configuration)









1. There is a grid: H(,) and V(,) are relations representing bijections such that...



2. Assign one domino to each node: a unary relation

for each domino 🔀

**X** )

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2. Assign one domino to each node: a unary relation

for each domino

3. Match the sides  $\forall x,y$ if H(x,y), then D<sub>a</sub>(x)  $\land$  D<sub>b</sub>(y)

for some dominos **a**,**b** that 'match' horizontally (Idem vertically)

1. There is a grid: H(,) and V(,) are relations representing bijections such that...



4. Borders are white.

2. Assign one domino to each node: a unary relation

∀x,y

(Idem vertically)

for each domino

if H(x,y), then  $D_a(x) \wedge D_b(y)$ 

for some dominos a, b that 'match'

3. Match the sides

horizontally

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 $\varphi$  is satisfiable iff  $\varphi$  is not equivalent to  $\bot$ 

Satisfiability problem undecidable 🖇 Equivalence problem undecidable

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UNDECIDABLE ---> by reduction from the satisfiability problem



- Satisfiability problem undecidable 👐 Equivalence problem undecidable
- Actually, there are reductions in both senses:
- $\phi(x_1,...,x_n)$  and  $\psi(y_1,...,y_m)$  are equivalent iff

• n=m

- $(x_1=y_1) \land \dots \land (x_n=y_n) \land \varphi(x_1,...,x_n) \land \neg \psi(y_1,...,y_n)$  is unsatisfiable
- $(x_1=y_1) \land \dots \land (x_n=y_n) \land \psi(x_1,\dots,x_n) \land \neg \varphi(y_1,\dots,y_n)$  is unsatisfiable

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Input:  

$$\begin{pmatrix} \phi(x_1,...,x_n) \\ G = (V,E) \\ \alpha = \{x_1,...,x_n\} \longrightarrow V$$

**Output:**  $G \models_{\alpha} \varphi$ ?

Input:  

$$\begin{cases}
\varphi(x_{1,...,x_{n}}) \\
G = (V,E) \\
\alpha = \{x_{1,...,x_{n}}\} \longrightarrow V
\end{cases}$$

**Output:**  $G \models_{\alpha} \varphi$ ?

Encoding of G = (V, E)

- each node is coded with a bit string of size log(|V|),
- edge set is encoded by its tuples, e.g. (100,101), (010, 010), ...

Cost of coding:  $||G|| = |E| \cdot 2 \cdot \log(|V|) \approx |V| \pmod{a \text{ polynomial}}$ 

Input:  

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Encoding of  $\alpha = \{x_1, \dots, x_n\} \longrightarrow V$ 

• each node is coded with a bit string of size log(|V|),

Cost of coding:  $||\alpha|| = n \cdot \log(|V|)$ 

Input:  

$$\begin{cases}
\varphi(x_1,...,x_n) \\
G = (V,E) \\
\alpha = \{x_1,...,x_n\} \longrightarrow V
\end{cases}$$

Output: 
$$G \models_{\alpha} \phi$$
?

Input:  

$$\begin{cases}
\varphi(x_{1,...,x_{n}}) \\
G = (V,E) \\
\alpha = \{x_{1,...,x_{n}}\} \longrightarrow V
\end{cases}$$

Output:  $G \models_{\alpha} \phi$ ?

- If  $\phi(x_1,...,x_n) = E(x_i,x_j)$ : answer YES iff  $(\alpha(x_i),\alpha(x_j)) \in E$
- If  $\phi(x_1,...,x_n) = \psi(x_1,...,x_n) \land \psi'(x_1,...,x_n)$ : answer YES iff  $G \models_{\alpha} \psi$  and  $G \models_{\alpha} \psi'$
- If  $\phi(x_1,...,x_n) = \neg \psi(x_1,...,x_n)$ : answer NO iff  $G \models_{\alpha} \psi$
- If  $\phi(x_1,...,x_n) = \exists y . \psi(x_1,...,x_n,y)$ : answer YES iff for some  $v \in V$  and  $\alpha' = \alpha \cup \{y \mapsto v\}$ we have  $G \models_{\alpha'} \psi$ .

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#### Question:

How much space does it take?

Input:  

$$\begin{cases}
\varphi(x_{1,...,x_{n}}) \\
G = (V,E) \\
\alpha = \{x_{1,...,x_{n}}\} \longrightarrow V
\end{cases}$$

- If  $\phi(x_1,...,x_n) = E(x_i,x_j)$ : answer YES iff  $(\alpha(x_i),\alpha(x_j)) \in E$
- If  $\phi(x_{1,...,x_{n}}) = \psi(x_{1,...,x_{n}}) \land \psi'(x_{1,...,x_{n}})$ : answer YES iff  $G \models_{\alpha} \psi$  and  $G \models_{\alpha} \psi'$
- If  $\phi(x_1,...,x_n) = \neg \psi(x_1,...,x_n)$ : answer NO iff  $G \models_{\alpha} \psi$
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answer YES iff for some  $v \in V$  and  $\alpha' = \alpha \cup \{y \mapsto v\}$ we have  $G \models_{\alpha'} \psi$ .

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How much space does it take?

Output:  $G \models_{\alpha} \phi$ ?

use 4 pointers ---> LOGSPACE
Input:  

$$\begin{cases}
\varphi(x_1,...,x_n) \\
G = (V,E) \\
\alpha = \{x_1,...,x_n\} \longrightarrow V
\end{cases}$$

Output:  $G \models_{\alpha} \varphi$ ?

• If  $\phi(x_1,...,x_n) = E(x_i,x_j)$ : answer YES iff  $(\alpha(x_i),\alpha(x_j)) \in E$ 

- If  $\phi(x_{1,...,x_{n}}) = \psi(x_{1,...,x_{n}}) \land \psi'(x_{1,...,x_{n}})$ : answer YES iff  $G \models_{\alpha} \psi$  and  $G \models_{\alpha} \psi'$
- If  $\phi(x_1,...,x_n) = \neg \psi(x_1,...,x_n)$ : answer NO iff  $G \models_{\alpha} \psi$
- If  $\phi(x_{1,...,x_{n}}) = \exists y . \psi(x_{1,...,x_{n},y})$ : answer YES iff for some  $v \in V$  and  $\alpha' = \alpha \cup \{y \mapsto v\}$ we have  $G \models_{\alpha'} \psi$ .

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 $\rightsquigarrow$  MAX( SPACE(G  $\models_{\alpha} \psi$ )), SPACE(G  $\models_{\alpha} \psi'$ )))

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use 4 pointers ---> LOGSPACE

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\varphi(x_{1,...,x_{n}}) \\
G = (V,E) \\
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\end{cases}$$

Output:  $G \models_{\alpha} \varphi$ ?

 $\rightsquigarrow$  SPACE( $G \models_{\alpha} \psi$ ))

22

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T

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Question: How much space does it take?

$$2 \cdot \log(|G|) + \dots + 2 \cdot \log(|G|) + k \cdot \log(|\alpha| + |G|) \text{ space}$$

# Evaluation problem for FO in PSPACE

Input:  

$$\begin{cases}
\varphi(x_{1,...,x_{n}}) \\
G = (V,E) \\
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\end{cases}$$

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Question: How much space does it take?

$$2 \cdot \log(|G|) + \dots + 2 \cdot \log(|G|) + k \cdot \log(|\alpha| + |G|) \text{ space}$$
$$\leq |\phi| \text{ times}$$

- PSPACE-complete problem: **QBF** (satisfaction of Quantified Boolean Formulas)

QBF = a boolean formula with quantification over the truth values (T,F)

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Theorem: Evaluation for FO is PSPACE-complete (combined c.)

Polynomial reduction **QBF**  $\rightarrow$  FO : **1.** Given  $\psi \in$  QBF, let  $\psi'(x)$  be the replacement

of each 'p' with 'p=x' in  $\psi$ .

2. Note:  $\exists x \psi'$  holds in a 2-element graph iff  $\psi$  is QBF-satisfiable

3. Test if  $G \models_{\varnothing} \psi'$  for  $G = (\{v,v'\}, \{\})$ 

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# Combined, Query, and Data complexities

[Vardi, 1982]

Problem: Usual scenario in database

A database of size 10<sup>6</sup> A query of size 100

Input:

# Combined, Query, and Data complexities

[Vardi, 1982]

Problem: Usual scenario in database

A database of size 10<sup>6</sup> A query of size 100

Input: • query +

# Combined, Query, and Data compl

Problem: Usual scen

Input: • query +

# database

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Problem: Usual scen

Input: • query +

# database

But we don't distinguish this in the analysis:

TIME(2|query| + |data|) =TIME(|query| + 2|data|)

# Combined, Query, and Data complexities



Query and data play very different roles.

#### Separation of concerns: How the resources grow with respect to

- the size of the data
- the query size

**Combined complexity:** input size is |query| + |data|

Query complexity (|data| fixed): input size is |query|

Data complexity (|query| fixed): input size is |data|

**Combined complexity:** input size is |query| + |data|

Query complexity (|data| fixed): input size is |query|

Data complexity (|query| fixed): input size is |data|

O(2)	query	+	data	is

exponential in **combined** complexity exponential in **query** complexity linear in **data** complexity

 $O(|query| + 2^{|data|})$  is

exponential in **combined** complexity linear in **query** complexity exponential in **data** complexity

# Question

What is the data, query and combined complexity for the evaluation problem for FO?

Remember: data complexity, input size: |data| query complexity, input size: |query| combined complexity, input size: |data| + |query|

 $|\phi| \cdot 2 \cdot \log(|G|) + k \cdot \log(|\alpha| + |G|)$  space

# Question

What is the data, query and combined complexity for the evaluation problem for FO?

Remember: data complexity, input size: |data| query complexity, input size: |query| combined complexity, input size: |data| + |query|

$$|\phi| \cdot 2 \cdot \log(|G|) + k \cdot \log(|\alpha| + |G|)$$
 space  
query data

O(log(|data|).|query|) space

**PSPACE** combined and query complexity **LOGSPACE** data complexity

# Recap

#### Equivalence-RA

#### Equivalence-SQL

#### Equivalence-FO

Sat-FO

Domino

UNDECIDABLE

Eval-FO (combined)

QBF

**PSPACE** 

Eval-FO (data)

LOGSPACE

# Trading expressiveness for efficiency



Alternation of quantifiers significantly affects complexity (recall that evaluation of QBF is PSPACE-complete:  $\forall x \exists y \forall z \exists w \dots \phi$ ).

What happens if we disallow  $\forall$  and  $\neg$ ?



#### $LOGSPACE \subseteq PTIME \subseteq PSPACE \subseteq EXPTIME$

#### $LOGSPACE \subseteq PTIME \subseteq NP \subseteq PSPACE \subseteq EXPTIME$

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**NP** = Problems whose solutions can be witnessed by a *certificate* to be guessed and checked in *polynomial time* (e.g. a colouring)

Examples:

• 3-COLORABILITY: Given a graph G, can we assign a colour from  $\{R,G,B\}$  to each node so that adjacent nodes have always different colours ?

 SAT: Given a propositional formula, e.g. (p ∨ ¬q ∨ r) ∧ (¬p ∨ s) ∧ (¬s ∨ ¬p), can we assign a truth value to each variable so that the formula becomes true ?

• MONEY-CHANGE: Given an amount of money A and a set of coins  $\{B_1, ..., B_n\}$ , can we find a subset  $S \subseteq \{B_1, ..., B_n\}$  such that  $\sum S = A$ ?

#### $LOGSPACE \subseteq PTIME \subseteq NP \subseteq PSPACE \subseteq EXPTIME$

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Non-deterministic transitions

#### $LOGSPACE \subseteq PTIME \subseteq NP \subseteq PSPACE \subseteq EXPTIME$

**NP** = Problems whose solutions can be witnessed by a *certificate* to be guessed and checked in *polynomial time* (e.g. a colouring)



Non-deterministic transitions

Many paths, each has length bounded by a **polynomial** 

#### $LOGSPACE \subseteq PTIME \subseteq NP \subseteq PSPACE \subseteq EXPTIME$



## Question

Consider: **Positive FO** = FO without  $\forall, \neg$ 

E.g. 
$$\phi = \exists x \exists y \exists z . (E(x, y) \lor E(y, z)) \land (y = z \lor E(x, z))$$

What is the complexity of evaluating Positive FO on graphs ?

## Question

Consider: **Positive FO** = FO without  $\forall, \neg$ 

E.g. 
$$\phi = \exists x \exists y \exists z . (E(x, y) \lor E(y, z)) \land (y = z \lor E(x, z))$$

What is the complexity of evaluating Positive FO on graphs ?

Solution

This is in NP: Given  $\phi$  and G=(V, E)it suffices to guess a binding  $\alpha : \{x, y, z, ...\} \rightarrow V$ and then verify that the formula holds.

# **Conjunctive Queries**

Def.

## CQ = FO without $\forall, \neg, \lor$

Eg:  $\phi(x, y) = \exists z . (Parent(x, z) \land Parent(z, y))$ 

Usual notation: "Grandparent(X,Y) : - Parent(X,Z), Parent(Z,Y)"

# **Conjunctive Queries**



# **Conjunctive Queries**


## Bibliography

Abiteboul, Hull, Vianu, "Foundations of Databases", Addison-Wesley, 1995.

(freely available at <u>http://webdam.inria.fr/Alice/</u>)



Chapters 1, 2, 3