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## The Problem of Incomplete Information in Relational Databases

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### Preface

In practice it is often the case that the available information is incomplete with respect to the information that is supposed to be recorded in a database. This monograph considers the problems raised by information incompleteness in the context of the relational model.

The basic semantic assumption is that an incomplete database represents a set of complete databases (relations). We show that there are two natural lattice structures on the set of all sets of relations. These lattices enable us to give precise meanings to operations performed on incomplete databases. The operations are querying, dependency enforcement and updates.

There are several candidate tools for storing and manipulating databases with incomplete information. We focus on generalizations of relations. These generalizations, called *tables*, allow variables representing unknown values as entries, as well as entries constraining the variables. We define four increasingly (syntactically) strict classes of tables and we study their abilities to serve as a basis for implementing incomplete databases and the operations on them. It turns out that the new class of *Horn tables* is the most significant from a practical point of view. In this class of tables we are able to efficiently evaluate positive existential queries and in some cases least fixpoint (recursive) queries. In Horn tables we can also efficiently incorporate the information contained in one join dependency and a set of equality generating dependencies, as well as hold the result of a subclass of the update operations.

An earlier version of the present work was submitted as the author's Ph. D. dissertation in 1989 to the Department of Computer Science at the University of Helsinki. With respect to the process of writing the thesis, I want to make the following acknowledgements.

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