
Christian Kurze and Peter Gluchowski
Chemnitz University of Technology, Thueringer Weg 7, D-09126 Chemnitz, Germany

Abstract. Implementing a business intelligence solution requires the appropriate integration of numerous tasks and components. The so-called Data Track requires three main steps: Dimensional Modeling, Physical Design, and ETL Design & Development. This paper focuses on the Dimensional Modeling step and provides a solution for managing multidimensional data models with standard office tools, namely Microsoft Visio and Access. A real-world project in the telecommunications industry provides business requirements and is used in order to prove the solution. We outline the lessons learned and give hints for further development.

1 Introduction

This paper has been inspired by an industry partner from the telecommunications industry. They are presently faced with the technical redesign of their data warehouse solution. One of the main problems is a current implementation of more than 400 data cubes. Several strategic consulting partners are constantly evolving these cubes, as well as the underlying core database. This implies that the whole database and cube structure has to be understood for each new project. Due to the short project timeframes of approximately three to six months, this is quite impossible. In order to reduce redundancy and inconsistency, there should be a management of user requirements on a semantic level, i.e. a management of semantic multidimensional data models. Please note that we further distinguish conceptual data models into semantic and logical models: semantic ones represent business requirements whereas logical ones describe implementation-oriented aspects. For example, business requirements are modeled using the ADAPT notation (cf. section 4); their logical representation might be a relational star schema.

To cope with the enterprise-wide initiative, a new department will be established. This department is responsible for gathering user requirements, check their feasibility, model the requirements in alignment to already existing structures, and handling the specified requirements on to the IT department which is responsible for implementing the new solution. The basic idea behind this approach is to create a so-called Reporting Repository. This database stores all semantic data objects and associations between them and thus facilitates analyses on the data models. Questions like “Which measures are available for the calculation of product turnover?” or “Which cubes are affected if we change our customer dimension?” can be answered. Furthermore,
precise definitions of measures, dimensions, cubes, etc. are given. The repository will be the single point of truth for multidimensional data structures within the whole enterprise.

The remainder of this paper is structured as follows: First, we integrate the case study into a framework of data warehouse development and outline our research method. Second, we summarize related work and give a short overview to multidimensional data modeling. The third part defines the requirements and shows the implementation of the solution. The last section evaluates our work and gives an outlook to further developments.

2 Data Warehouse Development and Research Framework

According to [1], one of the most important steps in implementing data warehouse solutions is to gather the user requirements; the understanding of the requirements influences almost any lifecycle choice. Subsequent to the definition of the requirements, there are three parallel task tracks: Technology, Data, and Business Intelligence Applications. For the remaining part of this paper, the Data Track consisting of the steps Dimensional Modeling, Physical Design, and ETL Design & Development, is important (cf. Fig. 1). The focus is put on the first step, Dimensional Modeling. Within this step, modelers identify dimensions, their granularity, attributes, and numeric facts.

The benefits of a single integrated metadata repository are characterized as follows: impact analysis, audit and documentation, and metadata quality management [1]. An impact analysis helps to identify the impact of making changes to the business intelligence system. Audit and documentation data are needed in order to do lineage analyses as the reverse of impact analysis. It allows identifying where an object came from and what went into its creation. Nevertheless, security data, like access rights, are important as well. The management of metadata quality is essential for keeping different metadata repositories in sync. It is a very substantive step as inconsistent technical or business metadata will lead to false impact or lineage analyses.

Our research is strongly aligned to the design science research in information systems [3], [5], and [6]. We further develop an already proposed metamodel for ADAPT [2] and create a new artifact, the Reporting Repository. The business needs of our project partner prove our implementation to be relevant. We also contribute to

Fig. 1. Data Warehouse Lifecycle diagram [1].
the scientific community by evaluating a metamodel based approach and show its application.

Due to the fact that the developed software is not the “first” of virtually any set of instantiation appropriate to the problem domain, we identify a significant improvement by pointing out the gaps we closed with our repository implementation. This can be seen as evaluation of the created artifact and will close the loop to further research needs [5].

Develop/Build

Assess

Justify/Evaluate

Environment

Knowledge Base

Business Needs

Additions

Applicable

Knowledge

Application

Fig. 2. Design science cycles [3], [5], and [6].

3 Related Work

The emphasis in our paper is put on using standard office tools for both the repository and the graphical interface. This approach provides a solution which is relatively easy to understand and maintain. For example, users do not have to cope with complex graph databases.

Conceptual modeling notations for multidimensional data can be categorized into three clusters: extensions to the Entity-Relationship model, extensions to the UML and ad hoc models [7]. Examples for extensions of the Entity-Relationship model are given in [8] and [9]. Neither is able to model dynamic structures, e.g. calculation hierarchies between measures. Reference [10] serves as an example for UML-based notations by providing a profile for multidimensional modeling. Both, the Dimensional Fact Model [11] and ADAPT [12], which we use in our paper, rank among the ad hoc approaches.

A repository is needed in order to store the metadata along the whole data warehousing process [1]. The Common Warehouse Metamodel (CWM) of the Object Management Group (OMG) is a much discussed standard for storing business intelligence metadata [13]. Version 2 of this standard, the Information Management Metamodel, should have been published in September 2007, but has not been published to date [14]. For this reason, we are not concentrating on this standard for our repository. Nevertheless, there are two general standards for metadata repositories: Information Resource Dictionary System (IRDS, ISO/IEC 10027) [15] and the Metadata Registry Standard (ISO/IEC 11179) [16].

A great deal of work has been done to create meta-CASE toolsets for developing modeling environments for domain specific visual languages. An outstanding work is outlined in reference [17]. The authors present plenty of related work and created a toolset which simplifies the development of modeling environments. All models are persistently saved in an XML format so that they can also be stored in a database. Other important works include, for example, MetaEdit+ [18], Meta-MOOSE [19],
GMF [20], and DSL Tools [21]. Those frameworks often require considerable effort to be understood and to be used effectively.

4 Modeling Multidimensional Data with ADAPT

Application Design for Analytical Processing Technologies (ADAPT) was first published in 1996 [22] and was refined in 1998 [12]. Due to its pragmatic roots, there has not been any formal foundation. A proposal of a metamodel can be found in reference [2]. Since we intend to give only a brief introduction, the reader is referred to [2] and [12] for further information about ADAPT. A free-of-charge stencil for Microsoft Visio is also obtainable [23].

The basic elements of the notation are Hypercube (or Cube for short) and Dimension. A Dimension represents an axis of a Cube. They can be modeled in detail by the symbols Hierarchy, Level, Member, Attribute, Scope, and Model. There also exists a variety of connector symbols depicted in Fig. 3 (b). Loose Precedence, Strict Precedence, and Self Precedence are intended to express hierarchical or recursive relationships between hierarchy levels. Used By identifies input parameters for and dependencies between Models. The Connector denotes all other relationships. The following modeling convention increases readability and understandability of ADAPT diagrams. One regular-sized sheet of paper should contain the cubes and their dimensions. For each dimension there should be another page defining its more or less complex structure [2], [12].

Fig. 4 applies the ADAPT notation to a simple example: (a) shows a sales cube with five dimensions including a measure dimension. Measures are depicted as Members of this special dimension. Dependencies can be modeled using the Model symbol. Part (b) shows a sample product dimension with a parallel hierarchy. The first one aggregates products into subcategories and categories, the second one into their suppliers. The attributes connected to the dimension itself apply to each element on each level of the dimension, i.e. the instances of the different hierarchy levels. Those attributes connected to the product level are valid for this particular hierarchy level only. A weight for example, does not make sense for a product category.
5 User Requirements and Implementation

This section outlines the requirements of our industry partner. We deduce a technical architecture for realizing these requirements and show how we implemented this architecture concept.

5.1 Requirements Definition

Since metamodeling is a common approach in implementing Domain Specific Languages (which ADAPT can be seen as), the requirements will be defined in a metamodel. Reference [2] was the starting point of our work. Because the given metamodel did not meet all the requirements of our partner, we had to enhance it by certain extensions. Due to concealment agreements and space limitations we will outline only an extract of the metamodel as seen in Fig. 5.

The metamodel’s extract contains seven classes. Cubes represent multidimensional analysis structures which contain Measures. Measures are composed to systems of key performance indicators (KPI_Schemata) via Aggregation Rules. If modeled in a neatly arranged way, one can easily explore the hierarchical character of complex calculation schemata. The Measures within a Cube are determined by Dimensions. The Dimension structure is modeled via Hierarchies and Levels. Stereotypes indicate which connection symbol has to be used, the navigability addresses the direction in which the arrow heads have to lead. The distinction between different dimension types (regular dimensions and measure dimension) has been part of the initial ADAPT notation [22] and is used in our solution.

Furthermore, we defined four model views assembling the modeling convention in the ADAPT presentation above: dimensions, systems of performance indicators (measure dimensions), cubes, and report (report is not shown in Fig. 5). Each instance of a model view, e.g. the sales cube in Fig. 4 (a) or the product dimension in Fig. 4 (b).
(b), is modeled on one regular-sized sheet of paper. This should increase readability and understandability. We also defined several metadata which should be gathered for each individual modeling element. There are, for example, access rights, responsibilities, definitions, etc. We categorized them into clusters which will be used later on for displaying input fields for these metadata.

![Diagram of ADAPT metamodel with model views: cube (a), system of performance indicators (b), and dimension (c).](image)

Fig. 5. Extract of ADAPT metamodel with model views: cube (a), system of performance indicators (b), and dimension (c).

For our repository solution, which is an integrated repository for all the semantic requirements to the data warehouse solution, the requirements align with the aims of an integrated metadata repository stated in section 2. Our project partner wanted to undertake impact analyses on a semantic level, audit and (business) user documentation was given, and the metadata quality should be improved by executing queries on the repository to check the consistency of the models, for example. Therefore we needed an open repository which could be easily queried.

Additionally, we were not allowed to install a database server due to security reasons. There also should not be the necessity for any additional software licenses. The modelers of our partner enterprise were experienced users of Microsoft Visio and Access, so we decided to use these two products.

5.2 Architectural Concept

In order to achieve a solution easy to maintain, we tried to keep the architecture of the Reporting Repository as simple as possible. Fig. 6 outlines the basic thoughts.

The bottom of Fig. 6 shows the structure of our solution within the file system. To allow access for more than one modeler, we made the folder `ReportingRepository` accessible over the enterprise-wide network. In this folder there is the Access database `reportingrepository.mdb`, the Visio stencil `adapt_rr.vss` and folders for the ADAPT diagrams according to the defined modeling views: `cube`, `dimension`, `measure`, `report`. These folders contain the modeled ADAPT diagrams in XML format (*.vdx).

For conducting impact and lineage analyses, the abstract syntax of a diagram is needed. Therefore, we only have to save the abstract syntax graph (ASG) in the repository. Its nodes end edges are defined in the metamodel above. The pictorial representation, i.e. the layout, remains hidden within the Visio diagram files [4]. Following the ideas of the IRDS standard [15], we also represented the ADAPT
metamodel within the database. Because of the four model views, we could not use the concepts of IRDS. The analysis layer in Microsoft Access contains forms and additional VBA code which give reasonable answers to questions raised in section 1.

5.3 Implementation

The creation of the database schema should be automated in the future, since each adaption of the metamodel requires changes. We performed this step manually. Each class within the metamodel maps to relational table named after this class as well as one table for each association named after the classes that are connected with each other. The tables are connected via foreign key relationships. Additional tables were created for each metadata cluster outlined within the requirements definition. They are also connected via foreign key relationships to the particular modeling element tables. In order to define the metamodel in the database, there are tables listing the core ADAPT elements and their assignment to relational tables, as well as the model views in which they may be used. Each association table is also assigned to the model views. This approach allows automated syntax and consistency checks to keep the graphical definitions in synch with the database. Additionally, referential integrity is used to keep the database consistent.

Fig. 7 depicts the database schema for saving the metamodel and its model views. Via simple queries it is possible to select all ADAPT elements and relationships for a certain model view. The result is needed in order to check the syntax of a single model view. For example, Fig. 4 (a) depicts an instance of the model view cube. Only Cubes, Dimensions, KPI_Schemata and associations between Cube and Dimension as well as KPI_Schemata are allowed. The Connector has to be used in each case.
We customized the basic ADAPT Visio stencil provided by the Symmetry Corporation [23]. Therefore, we removed all unused modeling elements and introduced new ones as outlined in the requirements definition. Each shape within the new stencil was given some event handlers. We listen to drop and double-click events, and customized the context menus. Each time an element is dropped onto the drawing sheet, a window pops up which allows the selection of an already existing or the creation of a new element. A double-click opens the metadata window for the selected item. It contains several tabs which allow the gathering of additional metadata. The instances of the model views, e.g. (a) and (b) in Fig. 4, are interconnected via hyperlinks. If a user wants to show the details of the product dimension connected to the sales cube, they only have to right-click on the dimension and select the context menu item open definition. Another Visio document containing the dimension will open.

6 Empirical Evaluation and Further Development

After two months of usage there have been models of about 70 dimensions, two systems of performance indicators, more than 200 measures, four reports, and 20 cubes. The following paragraphs verify the software artifact provided and outline further development steps. From a business point of view the following aspects arise:

- **Usability and Understandability of Diagrams Due to Model Views.** This requirement has been reached. The implemented Access forms summarize the model views, i.e. they provide a list of all cubes, reports, dimensions, and measures. A link to the graphical definition files is given, too. The implementation via hyperlinks within the Visio files is easy to use and fast.

- **Single Point of Truth for Multidimensional Data Models.** A recent project at our industry partner has shown that this requirement is met. New requirements to the data warehouse have been evaluated against the already existing models. The project scope could be reduced since some extensions were not necessary – they were already included in the current implementation.

- **Eliminate Redundancy and Inconsistency within Semantic Data Models.** The repository allows searching in all the provided models. This was not possible
before, since the “models” have been available in written texts only. The additional metadata to each element helps users to easily and quickly understand the data models.

- **Modeling of Security, Especially Access Rights for Users.** This requirement arose during the development of the solution. Unfortunately, ADAPT does not yet provide security modeling. We solved this issue by additional entries in the metadata section of each model element.

From a technical point of view, we would like to focus on the following, most important lessons learned:

- **Changes within the Metamodel.** Changes in the metamodel resulted in considerable changes in the source code. It would be much more useful to implement a generic approach as presented in the related work and to make extensive use of repository standards. A solution to automatically create the database structure, Visio stencils and consistency checks would be greatly appreciated.

- **Integrated Syntax Check.** Currently, the syntax of the model is checked while saving the diagram into the database. If the syntax is checked directly after inserting an element into the drawing area, it might save a great deal of the modeler’s time. The extensive use of repository standards could be a solution to this issue.

- **Synchronization of Graphical Definition and Abstract Syntax.** The separation between the graphical definitions in Visio files and the abstract syntax in the database is difficult to maintain. The most common error was the deletion of model elements in a Visio file but not in the database. A VBA function (accessible via the context menu) is available, but it was not used in the early days of modeling. We implemented consistency checks in order to synchronize Visio files and the contents of the repository. The result is a report summarizing all possible inconsistencies.

To summarize, we gained a great deal of new input for a refinement of the ADAPT metamodel. An ideal solution would be an extensible metamodel which could be customized to particular requirements. Furthermore, an evaluation of ADAPT against the Bunge-Wand-Weber framework [24] is an interesting research topic.

**References**

16. ISO/IEC 11179 Information technology – Metadata registries (MDR)