Explaining Strategies of Integrating of Visualization into Automated Modeling Techniques for Data Analysis

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Abstract

The visual analytics process model [3] became the most widely used model in visual analytics research during the past decade. A plethora of approaches have been presented that integrate visualizations and automatic modeling techniques. Yet today, we consistently face the problem to explain approaches in terms of properties that are specific to visual analytics. To narrow the scope, we focus on modeling approaches that are supported or improved with integrated visualizations. At the theoretical level of the visual analytics process model, these properties are reduced to a single connection (i.e. between *visualization* and *model*, see Figure 1). This does not suffice to explain the variety of approaches. Explaining visual analytics at a concrete level by using examples is unsatisfying as well. Firstly, it requires a considerable focus on the details of visualization and modeling techniques, which are already covered by other fields. Secondly, this strategy actually masks the underlying ideas of visual analytics that are *independent from technique, implementation, or application*.

We posit a lack of theory between these two levels of abstraction. We expect such a theory (1) to explain why a technique is a visual analytics approach, (2) to explain ("hands-on") where existing techniques can be turned into visual analytics approaches, and (3) to explain the differences and similarities by parsimonious properties that are not being adopted from other fields of research.

The work closest to such a theory is the survey compiled by Bertini and Lalanne [1]. They distinguish and name different patterns to integrate visualization and automated techniques. We took Bertini and Lalanne's results as a starting point to refine its terminology. Their survey does not show underlying building blocks and similarities between the patterns. In particular, we were interested in crisp pattern definitions, that are based on more fundamental concepts. We refined the terminology in three steps. Firstly, we were interested if (some) patterns can be defined in terms of common terminology. Secondly, we extrapolated this terminology to hypothesize about other potential patterns. Finally, we surveyed if these potential patterns actually have been implemented in recent approaches.

The basis for our terminology is a generic decomposition of an algorithmic modeling approach by Fayyad et al [2]. We observed that many approaches can be described in terms of linked visualizations that show different modeling components. We distinguish patterns by the combination of components that are visualized or even modified by visualizations.

The patterns are idealized building blocks to support automated modeling techniques with visualization. These patterns help structuring the visual analytics solution space. Furthermore, they expose the leverage point to improve or modify existing techniques.

References

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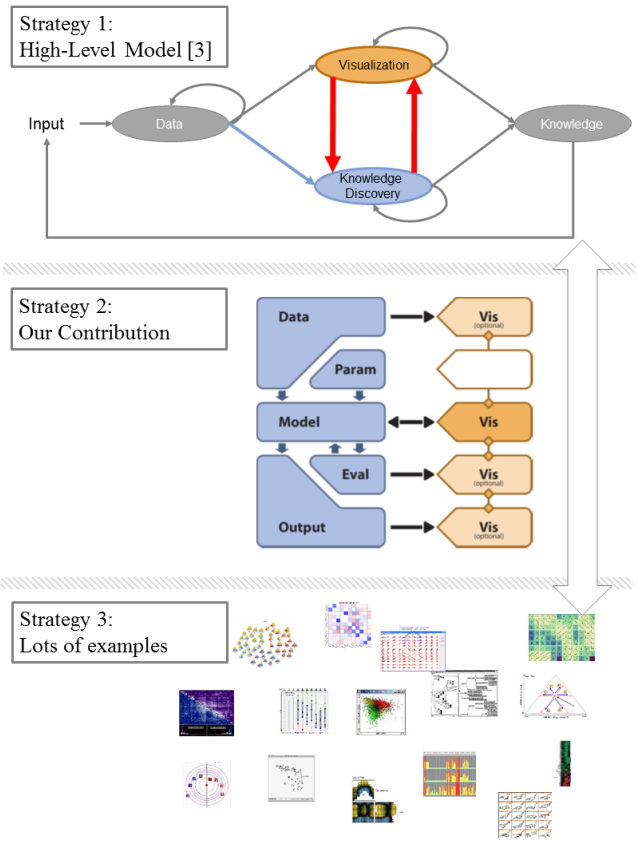

Figure 1: The Visual Analytics Process Model (Strategy 1) represents the abstract idea of integration. Presenting lots of examples (Strategy 3) shows the variety of approaches, but it masks VA concepts that are independent from techniques, implementation, or application. We prepose a terminology on the intermediate level, that is able to distinguish patterns of integrating visualization into the modeling process.