

A Literature Review of Visual Formalisms

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1. INTRODUCTION

We have been representing information in a visual manner for centuries, long before computers had ever even been imagined. Pictures and drawings were probably the first methods of visually representing information followed by the written word which started to appear between 4000 and 3000 BC [2]. Maps and charts were being used as early as 2300 BC [1]. Today we are still using physical media to visually represent and communicate information, from graphs, maps, calendars, sketches etc. With the introduction of computers and especially with the advances in graphical drawing technologies we have reached a point where visual information representation can go far beyond any affordance of a traditional physical media like paper. We now have the ability to not just to create static visualizations, but rich, active visualizations with many interesting properties like sharing and mass distribution, versioning, history, dynamic updates, and support for manipulation. These are just a few of the advantages that can be leveraged by presenting information graphically. Formally, a visual formalism is simply a traditional visual notation like the maps and graphs mentioned above but designed for the computer. “Visual formalisms are diagrammatic notations with well-defined semantics for expressing relations. They are based on simple visual notations such as tables, graph, plots, panels and maps” [22].

1.1 Motivation

The interest in visual formalisms stems from the direct implications they have for my master thesis project. I am interested in leveraging a table visual formalism to create

an agile story card wall. In general, a card wall consists of stories and task, each of which are represented on small cue cards (or some similar medium) and organized into columns and rows on a wall. The table formalism will help put the focus on the structure and allowable manipulations of the cells and their presentations. The card wall a specialized implementation of the table formalism will define the contents of the cells (stories and tasks) and the operations that make sense within the confines and constraints of the table.

2. SUMMARY OF THE REVIEWED PAPERS

2.1 Summary: Information Visualization[14]

This paper explains that visualization is a technique used to display information in a graphical or visual manner with the intent of leveraging our natural visual capabilities. Visualization allows us to process, analyze and understand massive amounts of data very quickly. The problem with visualizations is that we are trying to use them to quickly understand more and more abstract data that does not always have an immediately obvious mapping to the real world. This presents a challenge in trying to develop reusable meaningful visualizations. There is ongoing research to try and leverage metaphors and to understand what types of analytic tasks could be enhanced by visualizations based on those metaphors.

The paper talks about visualization developments in several areas including, document and software visualization, distortion techniques, hierarchies, data integration (including data warehousing and data mining) and the world wide web. At the time of publication of this paper in the late 90's there were also some real world commercial applications including applications based on work done at Xerox PARC such as Perspective Wall, Cone Tree and Wide Widgets.

The author suggests that, at the time, there was still much work to be done in terms of understanding the potential and usefulness of the technology but it was clear that visualization would play a huge role in the future of computing. Gershon describes visualization as an emerging discipline which must progress through four fundamental stages and suggests that visualization is progressing at an accelerated pace because many of the steps are happening in parallel; “An emerging discipline progresses through four stages. First, it starts as a craft, practiced by artisans using heuristics. Second, researchers formulate scientific principles and theories to gain insights about the processes. Third, engineers eventually refine these principles and insights into production rules. Fourth, the technology becomes widely available.”

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[14]

The paper suggests that widespread usefulness of visualizations will be directly influenced by the content providers' (software design and developers) ability to create visualizations that are accessible and easily understood by a wide range of end users, making them equally useful for users of diverse backgrounds. In order to create these meaningful visualizations in real world applications the systems being modeled and the processes involved must be understood. This understanding in itself could lead to the correct visualization for any particular task.

There are many areas that we need to learn more about in order to better support human learning through visualizations such as what types of interactions make sense for any particular visualization, how we perceive and understand information both visually and non-visually as well as how we search for information and how we adapt those searches based on previous knowledge. A better understanding of these issues and how they relate to specific analytic tasks will inform the creation of more useful, meaningful visualizations that can truly help end users process more data more accurately and quickly. The ability to create more flexible task oriented user interfaces can also aid in the development of more useful visualizations.

An important point that Gershon makes in the paper is that we also need to understand when graphic visualization may, in fact, be less appropriate. Sometimes visualizations may be harder to understand than words; we need to weigh the options and choose the representation that is most appropriate to allow the users to accomplish the required task.

In conclusion the paper re-iterates that there is great need for the evolution of this emerging technology especially in "The development of scientific and engineering principles for the generation of visualizations (to users with diverse needs and capabilities) and a methodology for solving problems with information visualizations are badly needed." [14]

2.2 Summary: Situational Awareness Support to Enhance Teamwork in Collaborative Environments [21]

This paper was motivated by that fact that today, many modern teams are collaborating using a multitude of visualizations on multiple large format displays. During these activities the situational awareness of the teams is not always ideal. This paper attempts to develop some guidelines to help design better co-located collaborative systems for use with multiple large format displays with affordance for situational awareness.

There were several concepts developed to help support situational awareness on large shared displays including an interface the authors described as "Memory Board is an interface that automatically stores and visualizes the activity history" [21]. It provides participants access to historical annotations made on other views or visualizations and allows them to be aware of which member is controlling a particular visualization or display. They also developed the *Highlighting on Demand* interface which allows individuals to highlight or fade out any part of any display using a personal interaction device.

The paper argues that simply providing complex visualization across or using multiple displays may, in fact, increase the cognitive load and have a negative impact on the collaborative activity. Designing situational awareness into

these applications is necessary to properly coordinate team decision making and truly support the collaborative process. One reason is that the participants can be easily distracted by sub-tasks that should in fact be transparent to the activity but in reality are not, like who is in control of a shared artefact or which display or visualization is the one currently of interest. Shared awareness of these types of interactions are essential and can "leads to informal social interactions and development of shared working cultures which are essential aspects of group cohesion" [21].

Kulyk states that situated awareness is concerned with the individual's knowledge and understanding of the events, information and environment as well as the shared understanding of the team as a whole and their understanding of the past and present and even its impact on future events. Kulyk's work focuses on the following three main aspects which directly relate to and extend Endsley's [9] three levels of situated awareness:

- A person's previous knowledge and understanding which includes the source and nature of relevant events and information.
- Detection and comprehension of the relevant perceptual cues and information from the environment including the comprehension of multiple visualizations and their context.
- Interpretation of these visualizations and the continuous reconfiguring of understanding and knowledge during collaboration. This supports the awareness of changes in the environment as well as the ability to keep track of work in progress.

Kulyk is actually interested in the impact of situational awareness on team collaboration and specifically what she refers to as *shared situational awareness*. She defines it as the level of the group or team's awareness of individual situational awareness based on the above three points, "the degree to which every team member possesses the situation awareness required for his or her responsibilities" [10]. With respect to shared situational awareness, the paper is mainly concerned with answering the following questions:

- Understand the impact of situational awareness on collaboration.
- Understand how to support shared situational awareness in collaborative environments.
- Understand how to leverage the usage of shared large format monitors to support shared situational awareness.
- How can new interactive systems and visualizations be designed and evaluated based on their support for situational awareness and how might these systems actually stimulate new and existing forms of collaboration.

The paper points out that the level of support for situational awareness varies depending on the collaborative activity. For example a collaborative team that supports emergency dispatch would need a higher level of support when compared to a team working on scientific collaboration. In the long run, whatever the reason for the collaboration, mistakes cost and better situational awareness support can help reduce mistakes.

Next the paper talks specifically about situational awareness and scientific collaboration and in particular how large shared displays could be used to better support situational awareness in current omics experimentation in molecular biology. The following key points were made:

- Visualizations on a shared display encourages group discussions.
- The visualization of data on a shared display allows users to quickly determine the quality of the information or data-set.
- Multiple visualizations may be needed and when used there must be a clear visual relationship between these visualizations so as to avoid participants from getting lost, from being distracted or from being inflicted with change blindness which occurs when the participants do not realize that the focus of the discussion has changed.
- When multiple shared displays are being used with multiple co-related visualizations, changes in a particular visualization should also trigger changes in the other related visualizations.
- Difficulties arise when team members from diverse disciplines need to use the same visualizations that may have been designed to be understood by people with a specific background or skill-set as is the case in many scientific visualizations.

To address some of the problems related to situational awareness for shared displays the authors implemented Highlighting on demand interface which allowed the person currently controlling the shared display to highlight or fade out certain visualizations or areas of the shared display(s). This increased awareness among the team as to the relevant visualization at that moment. A second solution was the memory board interface which stores and visualizes the changes in real-time during team collaboration. This ensures that the entire collaborative process is recorded and all intermediate visualizations, annotations etc. can be retrieved and reviewed. A control interface is suggested as a means of controlling the shared displays and visualizations and giving access information about the visualizations and displays. This was envisioned to run on a shared touch screen as well as on the team members individual interaction devices. Knowing who is making changes and what changes are being made is critical to any collaborative effort and the control interface attempt to address this problem.

2.3 Summary: Beyond Models and Metaphors: Visual Formalisms in User Interface Design[22]

In this paper Nardi argues that the user interface can be designed to support the visual representation of the underlying program's semantics and can help offload cognitive load to facilitate problem solving. Nardi postulates that at the time this paper was published in the early 90's it was time to start focusing more attention on the semantic interface rather than the also important but less interesting syntactic interface design to relay user commands to the underlying application. She claims that design and analysis tasks are complex and software designed to support these activities

needs to be enhanced with well-designed visual interfaces from which the semantics of the application could be easily inferred by the users. The designers of this type of complex application would be well served to have a toolkit of computational building blocks, such that they could piece together the appropriate blocks which could support this visual transfer of application semantics.

Nardi argues that neither Mental models nor Metaphors are appropriate theoretical foundations to support such building blocks but that these blocks could be developed by leveraging the power of visual formalisms. She argues that different visual formalisms can be used as the building blocks for semantic interfaces and showed how a table visual formalism was implemented and explains the potential for it to be used as a building block. Nardi defines visual formalisms as objects that have their own inherent semantics and don't need to borrow the semantics from some other domains for users to understand them, "They are based on simple visual notations such as tables, graph, plots, panels and maps" [22]. Visual formalism can be specialized or extended to fit a particular problem or application. An example is the table formalism which has been tailor fit into applications such as spreadsheets, calendars, schedules etc. Nardi recognizes the potential for computer based visual formalism to support interaction, modification, relationships to other components, notation mapping including handwriting to text conversions etc. Nardi attempts to compare how mental models, metaphors and visual formalisms support the design and development of rich applications that convey the semantics of the application through the user interface and how they support application development "through reusable semantic objects that support application development at a higher level than general programming languages." [22].

In particular the paper is interested in the design of semantic user interfaces for software that supports complex, highly collaborative design and analysis, with explicit support for creative problem solving within the application. Nardi is quick to point out that the usefulness of mental models and metaphors are not being questioned in general, it is their usefulness for the specific task of creating collaborative software that supports a semantic user interface and complex problem solving that is being questioned. Nardi argues that visual formalism provide the correct level of abstraction to create a library of reusable extensible objects that can truly help the application developers of such systems.

The paper argues that many studies of mental models have shown results which lack support for their ease of use, and for our ability to use them to help with complex cognitive tasks. In fact there is little agreement among psychologist as to their exact definition or even of their existence. The paper uses an example of one experiment where participants found it difficult to perform seemingly simple cognitive tasks based on a mental image, a concept even simpler than mental models. To illustrate participants were asked to imagine a tiger, and, were then asked to count the stripes of the tiger, a task that most participants found difficult or impossible [25]. Other experiments by Reisberg also supported the apparent difficulty of accomplishing other simple tasks based on a clear and simple mental image. Reisberg concludes that mental images are less complete and more rigid than we imagine. Nardi provides support for the argument that if these simple tasks are difficult and the mental images

are rigid and incomplete then how will mental models provide adequate support for more complex, cognitively intense systems. Nardi cites work by Kintsch [20] who suggests a more flexible system, where the structure is generated in the context of the task and rules and propositions are composed based on context. Nardi argues that this more flexible strategy is what is needed for the complex systems under discussion. The work of Rips [26] is also referenced as evidence for the indiscriminate use of mental models. In many cases propositional or production rules derived by domain knowledge is simply re-cast as mental models, when they would be better off to be thought of as production rules. The paper argues that to match a mental model to a semantic interface would mean to devise a mental model that was “capable of running mental simulations (exactly as Hollan and his colleagues proposed)” [22]. Nardi doubts if this type of complex mental even exists. The paper suggests that the task placed on developers to understand the mental models and implement them in a semantic interface is overwhelming since, “This approach gives no tools to designers, but asks them to go out and do what professional cognitive psychologists have been unable to do - convincingly describe meaningful mental models of any but the simplest phenomena.” [22]. Nardi also argues against the views of Hutchins [19] that suggests that the user interface and the tasks’ must be matched with the user’s mental model of those tasks and that the interaction with the user interface should directly correspond to the user’s mental model. In this way reducing cognitive load because thoughts are easily translated into the actions needed to be performed on the interface to accomplish the goal. Nardi explains that this type of view limits the interface to a simple means to an ends instead of seeing it as having the potential to support cognitive offloading by providing the necessary visualizations for quick and accurate transference of semantic information about the system and the tasks at hand. It can help guide the user and support them in the processing of complex problem solving; “it is not a passive receptacle for thoughts emanating from an internal model, but plays an active role in the problem solving process” [22].

An ethnographic study was performed to try and understand how people use spreadsheets as computational devices to solve real world problems. The results of the study gave support for the idea that people do not tend to start from mental models, “but instead incrementally develop external, physical models of their problems” [22]. It was found that users tend to start off with unclear goals and through the use of the spreadsheet they are able to organize their data and start to see relationships which lead to the refinement of their problem set and ultimately to the solution; “the representation of the problem emerges through the medium of the spreadsheet. The representation is not “in the user’s head,” nor was it ever in the head, but becomes an artefact created by the user’s interactions with the program.” [22]. Nardi states that if the users are not using mental models as a means to solve their problems then how can developers design interfaces based on the mental models of the users? Tools like the spreadsheet leverage a table formalism to support the user’s own development of an external model of their problem set. Users are able to create personalized models of their explicit problem within the constraints of the tool and guided by the affordances of said tool. Nardi suggests that focusing on mental models distracts us from understanding user activities in terms of (1) high level task goals

and (2) the data structures and the operations that need to be supported to allow users to effectively model their unique problems. This evolutionary modeling results in an externalized model that can be used to leverage what is referred to by Reisberg [25] as perceptual knowledge and described it as knowledge that can only be accessed through interaction of external representations. This means that there are some forms of knowledge, that can only be accessed through visual cues. Nardi believes that it is more important to understand how external representations or models aide us in performing complex cognitive tasks and how we can build semantic interfaces to support the users’ ability to create and interpret these external visualizations using visual formalisms as the building blocks.

Next the paper attempts to provide support for the argument that metaphors are also “unsuitable for expressing rich application semantics, and inappropriate for the reusable computational structures we seek” [22]. Nardi states that the simple, once useful metaphors of the desktop, Rolodex, or trash can icons are no longer needed to help end users understand how to interact with their computers and applications. The user interface has also moved beyond simply relaying user commands to the underlying system, it now crucial to understand how the interface can convey rich application semantics and provide support for complex cognitive operations. Metaphors lack precision and are incomplete representations of any but the most simple of applications; “Metaphors are good at suggesting a general orientation, but not good at accurately encoding precise semantics” [22], but it is precisely those semantics that the interfaces under discussion are trying to capture, convey and support. Another problem is that metaphors are not reusable and not extensible and become stale, and therefore could not be used to support developers in creating these types of applications. Carroll and Thomas [6] suggest eight rules to help develop or recognize good metaphors, the first one states that metaphors are system dependent and must also account for the expected user of the system. This alone ties metaphors to the systems they represent and gives evidence for their lack of re-usability and extension. Also, metaphors, become stale, “However, for most computer systems there will come a point at which the metaphor or metaphors that initially helped the users understand the system will begin to hinder further learning... When the original metaphor begins to fail, either new, more detailed metaphors will have to be introduced or the metaphorical approach will have to be abandoned in favour of a more literal approach.”[6].

Nardi also talks about the impact of prior knowledge and how it can sometimes temp us into seeing and using metaphors which simply are no there. As an example Carroll [5] suggests that a ledger sheet is the metaphor representing spreadsheets, Nardi argues that in fact spreadsheets are simply tables and that there are no metaphors that can describe the generality and expressive power of the table. At best metaphors could be used to express specific uses of tables, but nothing that could come close to capturing the entire possible semantics. Nardi argues that it is far too easy to “confuse any kind of prior knowledge with metaphor ” [22].

Next the paper turn its attention of explain why visual formalisms are the appropriate method to help designer and developer convey application semantics through the user interface. Harel clearly expresses the need to support complex cognitive activities and problem solving through semantic

interfaces when he said, “They will be designed to encourage visual modes of thinking when tackling systems of ever-increasing complexity” [17]. We use physical or real visual formalisms all the time in everyday life, including maps, tables, sketches and graphs; digitized visual formalisms bring a new dimension previously unavailable. Notably, computerized versions can be stored, search, retrieved, versioned, they also afford virtually instant sharing (or even real-time sharing) and can support modification by collaborators near and far (with whom the visualizations were shared). These visual formalisms must provide support for the user to be able to draw meaning not just from viewing them in a static manner, rather, by the ability to manipulate, compose, add or subtract them, search, filter and combine them in ways that make sense for their particular application. Implementing these allows our designers and developers the opportunity to use them as building blocks to create complex semantic interfaces that support hard cognitive processes through visual guidance and visual support of semantic reasoning. Nardi suggests that visual formalisms are application frameworks because they provide the structure in which to support a specialized problem. As an example, the spreadsheet is a specialization of a table formalism, the table formalism provides the underlying base functionality of the system, but the specialized implementation (the spreadsheet in this case) provides the structure and constraints that allow the end user to focus on their dataset and allow the problem to emerge in the form of an external model, created and guided by, and within the boundaries of those constraints. In this way “The initial phase of a modeling problem is reduced to simply recognizing a format into which a problem is framed, rather than being faced with the necessity of inventing a format from scratch” [23]. Nardi describes the strengths and properties of visual formalism in the following list:

- *Exploitation of human visual skills.* Visual formalisms are based on human visual abilities, such as detecting linear patterns or enclosure, that people perform almost effortlessly. Visual formalisms take advantage of our ability to perceive spatial relationships and to infer structure and meaning from those relationships (Cleveland, 1990). Visual formalisms are capable of showing a large quantity of data in a small space, and of providing unambiguous semantic information about the relations between the data.
- *Strong semantics.* Of the visual formalisms we have identified, graphs have defined for them the most formal semantics, and panels the least. Any implementation of a visual notation as a visual formalism will supply its own formal semantics. A computer-based version of a panel may only specify that a panel is an arbitrary collection of objects that belong together. Its strength as a presentation format makes it an extremely useful object, and an implementation might have a great deal of presentation functionality in addition to the semantics of being able to handle a collection of objects correctly for a given application.
- *Manipulability.* Visual formalisms are not static displays, but allow users to access and manipulate the displays and their contents in ways appropriate to the application in which they are used.
- *Specializability.* Visual formalisms provide basic objects that can be specialized to meet the needs of specific applications. They are at the right level of granularity neither too specific nor too general. Visual formalisms are appropriately positioned between the expressivity of general programming languages, and the particular semantics of applications.
- *Broad applicability.* Visual formalisms are useful because they express a fairly generic set of semantic relations, relevant to a wide range of application domains. Because a large number of applications can be designed around a given formalism, visual formalisms will eliminate a great deal of tedious low-level programming, as well as give developers ideas about editing and browsing techniques with which they may not be familiar, such as the use of fish-eye views for large datasets [13][7].
- *Familiarity.* Because the standard visual notations are so useful, they are found everywhere. Not only do they draw on innate perceptual abilities, but through constant exposure we become very familiar with them. Our schooling explicitly trains us in the use of the basic notations; e.g., using calendars and learning matrix algebra provides experience with tables. Everyday activities provide opportunities to create and use visual notations, such as writing a laundry list or reading a map.

Finally to wrap things up, the paper discusses their implementation of a table visual formalism as an illustration of how a visual formalism (or more generally a set of them) can be used to help developers build rich semantic interfaces for systems designed to support complex cognitive tasks including problem solving.

To start, the implementation of any visual formalism must begin with by defining the semantics of the visual formalism. This involves identifying how individual components are structured, how they relate to each other and what operations need to be supported. The presentation and layout as a whole, and as individual components, must be considered and formalized. The application semantics within the constraints of the visual formalism must be clearly understood. This is really defining how the framework can express the underlying semantics of the system. Their implementation creates a more flexible table than you might find in a typical spreadsheet application but in keeping with the proclaimed advantages, it could be used to create a spreadsheet. The table formalism is a component that can contain other components (cells). Each cell is disjoint but can be set to span rows or columns as well as be merged with other cells or split into multiple cells. Cells can also be added (created), deleted, moved, copied and pasted. There is support for labeling rows and column as well as naming regions (a group of cells). The ability to iterate over cells or regions, to scroll, both horizontally and vertically as well as support for zooming in and out cells, rows, columns or regions. There is support for filtering (essentially temporarily hides certain cells, regions, rows or columns). Another big difference of the table formalism is that the cells can contain anything from a primitive to a complex class or widget or even an application.

To finish the paper provided strong support for the use of visual formalisms to aide developers in the design of complex systems. It clearly illustrates where mental models and

metaphors fall short as a theoretical foundation for the creation of these types of systems. Finally it gave a good concrete description of a table visual formalism.

2.4 Summary: Heuristics for Information Visualization Evaluation [31]

This paper defines heuristic evaluation as a quick and lightweight method to predict and spot issues related to the usability of an applications' user interface. The heuristic approach involves a small group, testing the system based on the heuristics or guidelines which are relevant to the system. Heuristics can often be used to teach novice users and as a method of identifying design patterns. Like design patterns, heuristics help by providing an overarching language from which the system can be discussed and they promote reuse especially through the emerging design patterns. Zuk describes heuristic evaluation as commonplace in the field of HCI but, its application to information visualization is still emerging. The author states that we are at a point where there is a need to create a small set of general overarching heuristics that could be applied to most information visualization systems, similar to Neilson's 10 usability heuristics for the design of user interfaces. The paper describes this as an exciting and open area for future study. Zuk suggests that a hierarchical grouping of existing heuristics combined with different tree searching algorithms could help in selecting a core set of heuristics. Otherwise, one could follow Neilson's method of reducing a large set of problems into a small set of easily understandable heuristics.

Next the paper describes the process of heuristic evaluation as something that is apt to evolve but nonetheless describes that an iterative approach using five evaluators has been found to be effective. In the first pass the evaluators try and get a general sense of the application and a second pass is used to focus on applying the heuristics to specific elements of the user interface. The exact number of evaluators will most likely be application specific and dependent on the complexity of the visualizations. The paper refers to work by Tory and Moller [30] who suggest using a combination of traditional usability experts and visualization or data display experts. It is still to be determined what the exact characteristics of an information visualization evaluator should be. The paper describes work done by Craft and Cairns [8] as determining that there is still much work to be done in this area, "They conclude by calling for a more rigorous design methodology that: takes into account the useful techniques that guidelines and patterns suggest, has measurable validity, is based upon a user-centered development framework, provides step-by-step approach, and is useful for both novices and experts." [31] The paper also warns that there could be problems if we blindly apply existing knowledge and methods of usability heuristics to information visualization and suggest that caution should be used and further study is needed. Zuk noted in the case study that the evaluators had problems with the heuristics that were too specific and felt a more general vocabulary would increase its usefulness. It was also noted that in general more precise, clear and understandable names and descriptions of each heuristic would facilitate their use. This would also help ensure that they are used as intended because there is less room for misinterpretation. The case study revealed that some problems were detected by distinct heuristics which the author suggested could be used as a way to see the problem from distinct points

of views and possibly could lead to multiple solutions. It was also found that assigned priorities could help resolve issues when conflicting heuristics were found. Another suggestion was to let domain experts resolve heuristic conflicts. The authors also identified some problems that may be common among visualizations in general. Some of the issues include:

- Poor contrast can produce hidden or difficult to see visual components.
- Poor choice of colors could lead to confusion in terms of understanding or misinterpreting the relationships between visualizations.
- Tool tips lack the detail required to make them useful.

The paper notes that some heuristics would be better used as guidelines for the designers and or developers of the system while others might be better for heuristic evaluation of the visualization. Zuk suggests that paired evaluator teams could be comprised of evaluators paired with domain experts, this could help in a more accurate application of the heuristics. It was also noted that usability heuristics could be useful in combination with the visualization heuristics but, notes that this requires further study. Another open research area would be to discover if tools could be used to support the evaluation of visualizations.

2.5 Summary: A Collaborative Dimensions Framework: Understanding the Mediating Role of Conceptual Visualizations in Collaborative Knowledge Work [4]

The goal as stated in the paper "is to identify the factors that contribute to the choice of an effective visual representation for collaborative knowledge work to support distributed cognition, and to organize them in a conceptual framework". Bresciani focuses on visualizations as artefacts and claims that this focus allows for decision factors to be expressed in terms of dimension that either support or interfere with certain kinds of visualization uses. These dimensions are not independent and often, supporting one dimension will have a negative impact on the support for another. Understanding the relationships between dimensions allows designers of collaborative visualizations to pick and leverage those dimensions that make the most sense for the application being developed. The author suggests that this approach will help build better support for collaborative activities then could be achieved using general guidelines that should apply to all visualizations as might be the case using a heuristic approach. This paper leverages research from three main fields including:

- Blackwell's work on the cognitive dimensions of notations framework [3] and Hunhausen's work on communicative dimensions framework [18]
- Star's research on the boundary object paradigm [28]
- Thirdly a literature review on visualization technologies, in particular the information visualization work of Shneiderman and Karabeg as well as the knowledge visualization work of Eppler and Suthers [11],[29].

Informed by this theoretical foundation and a combination of techniques used to gather the experience and knowledge of

expert practitioners who employ visualizations in their daily collaborative activities, a collaborative visualizations framework was developed to help understand how visualizations can be leveraged to support collaborative activities and how they can facilitate the distribution of knowledge across team members. The framework consisted of the following seven dimensions:

- *Visual impact*: The extent to which the visualization is attractive and if it facilitates attention and recall.
- *Clarity*: Is the visualization self-explanatory, easy to understand and does it reduce cognitive effort.
- *Perceived finishedness (provisionality)*: Is the visualization perceived by the user as a final product.
- *Directed focus*: Does the visualization direct the user's attention to any particular area or areas.
- *Inference support*: Do the constraints of the visualization help or support the creation of new and novel insights. "Inference support is the core differentiator and added value of visualization over text: it allows to gain new understanding "for free" just by changing the visualization type, the focus, or the representational constraints." [4]
- *Modifiability*: Is there support for dynamic modification of the visualization?
- *Discourse management*: Does the visualization support control over the discussion and work-flow of the activity.

The paper applied the dimensions to real world visualizations to determine to what extent the different dimensions were supported by the visualizations. They identified six different but common forms of collaboration and suggested that some dimensions would be more appropriate for certain collaborative activities. The following lists each of the six collaborative activities along with the dimensions that provide the best support for those activities:

- idea generation (high visual impact, low clarity, low perceived finishedness, high modifiability)
- general knowledge sharing (high visual impact, low perceived finishedness)
- problem analysis (low perceived finishedness, high clarity, high inference support)
- option evaluation (high clarity, high directed focus, high inference support, moderate-low modifiability)
- deliberation or decision elaboration (high clarity, high directed focus, high inference support, moderate-low modifiability)
- planning (high modifiability, low perceived finishedness)

As noted the above dimensions are not always independent and careful consideration must be made when deciding the level of support for each dimension. This concept of trade-offs between dimensions was first introduced by Green and Petre [15]. As an example of a trade-off referred to in the

paper in reference to the fireworks visualization from Let's Focus collaborative software which was used as one of the three visualizations to which they applied the collaborative dimensions. The application of the dimensions to the fireworks visualization revealed several relationships or trade-offs between the dimensions. Visual impact had effect on clarity and on directed focus. The high visual impact of the fireworks visualization was distracting and therefore reduced its clarity and it had reduced support for directed focus because of the appealing nature of the visualization in fact, "When the visual stimuli are very high, then the focus will diminish because the attention is caught more by the aesthetics than the content"[4]. There were also trade-offs between modifiability and perceived finishedness and between modifiability and discourse management. The visualization had a high level of support for discourse management through the Let's Focus software package that provided the visualization. It also had high perceived finishedness "because the diagram resembles a final piece of work instead of a discussion tool." [4]. If visualizations are perceived as finished, then it will be less likely that collaborators will feel like they should contribute or modify them. If there is no tool support for discourse management then high modifiability usually results in low discourse management because coordination of the group becomes more difficult.

Another important consideration is the medium on which the visualization is delivered. "The choice of alternative media such as a whiteboard, paper or computer-based interaction, strongly affects people's willingness to make contributions and collaborate." [4]. If people feel that modifications of the visualization are permanent then they are less likely to want to contribute, also the perceived finishedness can be affected by the medium, a piece of paper tends to be thought of as more provisional where as a visualization on a computer monitor has more of a sense of permanence even though the computer based visualization may in fact have high support for modification.

3. DISCUSSION

The papers were quite interesting and, when considered as a whole, reveal several important points about the design and use of visualizations and the complex applications designed to leverage them. One of the key points is the need for re-usable visualizations. We need to understand, when and where visualizations are appropriate and how they can be designed to support and convey the semantics of the problem or application. We have seen that through the development and implementation of visual formalism we can create a library of re-usable extensible or specializable visualizations that can be used by developers to create these complex applications. Visualizations give us the power to build applications designed to leverage our natural human ability to process and reason about information in a visual manner. At the same time computerized visualizations allow the end user of these applications to leverage everything that a computer is naturally good at like graphic display, sorting, searching, sharing, storing etc.

As noted by Gershon [14] the potential impact and usefulness of computer visualizations was recognized in the very early stages of this emerging technology and now, twenty years later, we should be in a better position in terms of understanding how to leverage them to support complex cognitive processes. I am not sure if we are truly there yet,

it seems at least on the basis of this literature in this review that we are still in what he described as the second stage of development of an emerging technology. This is the stage where researchers formulate theories and gain insights about the technology. Simultaneously we are also in the third stage where engineers refine and implement the findings and finally we are, at the same time, in the final stage where visualizations are massively available to the end user.

The work of some of the early practitioners in this area has shown a promising path to follow. Harel truly demonstrates the power of visual formalisms when he describes the graph as a visual formalism: “A graph, in its most basic form, is simply a set of points, or nodes, connected by edges or arcs. Its role is to represent a (single) set of elements S and some binary relation R on them. The precise meaning of the relation R is part of the application and has little to do with the mathematical properties of the graph itself. (Certain restrictions on the relation R yield special classes of graphs that are of particular interest, such as ones that are connected, directed, acyclic, planar, or bipartite.” [17]. I believe that Nardi provides some really good “engineering principles for the generation of visualizations” [22] but, this paper has not had the attention that I believe it merits. One possible reason is that the paper may have come before it’s time; we are now in a better position to leverage her work and implement a library of visual formalisms that leverage current technology in graphics, and collaborative multi-touch surfaces.

The fact that we are doing more and more team collaboration using software to support the process implies that the visualizations we create must also consider situational awareness. Collaborating by using visualizations means that the visualizations need to support techniques for individuals and groups to be aware of shared objects, transitions between different visualizations, and methods of interaction and communication. With the recent emergence of new smart handheld devices we also need to learn how to interface with these devices and leverage them as a method of interaction (and perhaps personal identification) with visualizations intended for collaborative environments. Furthermore large multi-touch enabled displays can help to solve many of the problems identified by Kulyk [21].

Direct manipulation of visualizations on large shared multi-touch enabled displays will help participants keep track and focus on the correct visualization or component under discussion. Shneiderman’s Direct Manipulation principles [27]: (1.) visibility of the component interest. (2.) Physical actions replace complex syntax. (3.) Incremental reversible operations whose effects are immediately visible. These principles can act as guidelines to help support situational awareness in visualizations. We must be able to see the visualizations and any components, in order to truly reap the benefit of the visualization. The direct manipulation of the visualizations and components must produce immediately visible changes in the visualizations as well as clear indications of changes in related components and other related visualizations.

How do we assess the quality of our visualizations? We need formal methods to help determine if our visualizations are actually delivering on their promise, i.e. do they successfully support making hard mental operations easier, semantic reasoning, inference and decision making? Heuristic evaluation is a feasible and interesting solution to this prob-

lem. One interesting point in Zuk’s paper is that he explains that through the process of determining the proper heuristics and through their use other useful things happen like the emergence of design patterns. Gershon [14] also mentions that in the first stage of development of an emerging technology that pioneers are guided by the heuristics of the technology. Can these heuristics be used as a starting point from which a more general set of widely applicable heuristics can be derived and for evaluations and design purposes? Determining this set is a major point of interest for Zuk and others. A recent paper by Forsell [12] uses an empirical approach as described by Zuk and previously by Nielsen [24] to create a set of ten general heuristics to help in the evaluation of visualizations. It is widely agreed that one of the most important features of a heuristic is how easily understood it is. The evaluators must understand the heuristic for it to be used as intended; to accomplish this there need to make the names and description as clear and precise as possible. This may lessen the temptation for evaluators to use the heuristics in a prescriptive manner instead of as intended descriptively. In a paper comparing the activity theory and distributed cognition, Halverson describes the importance of names, “Activity Theory has named its theoretical constructs well. Even though some names may conflict with common use of the terms, naming is very powerful - both for communicative as well as descriptive reasons” [16].

To end the discussion I would like to emphasize the importance of the collaborative dimensions framework of Bresciani. It gives a an excellent theoretical foundation for the design of visualizations intended to support semantic inference in a collaborative environment. In the rest of this discussion I will try and explain how the most important points of the reviewed papers relate non trivially to the seven collaborative dimensions [4] and suggest relationships to Blackwell’s cognitive dimension of notations [3].

3.1 Visual impact

The visual impact is directly influenced by our understanding of how we visually perceive and process visual information, Gershon discusses these points in the paper, Information Visualization. Visual impact can also influence support for situational awareness; high visual impact can aide in the detection and perception of changes in the visualization and related components.

Related Cognitive Dimensions.
(visibility, secondary notation)

3.2 Clarity

How easy it is for users to understand the visualization? Again this relates to Gershon’s point about understanding how we perceive and process visual information. In terms of situational awareness a high support of clarity may help the users see and understand the impacts of the modification of one visualization on other related visualizations.

Related Cognitive Dimensions.

(role expressiveness, hidden dependencies, abstraction, hard mental operations, consistency, closeness of mapping, secondary notation, diffuseness)

3.3 Perceived Finishedness

Provisionality as used in Cognitive Dimensions was a bet-

ter name for this dimension. The more polished the visualization the less likely it is that users will expect it to be modifiable. At the same time users are disturbed when a series of modifications are performed until a point where they consider the work a final product, at this point further modifications can be a source of frustration. There must be a balance between provisionality, modifiability and discourse management. Discourse management of course could provide the complete modification history in a versioned format that can be used to easily switch between different versions. The ability to finalize modifications or even be able to switch back and forth between a more polished presentation and a rougher sketch would be useful. Maybe support for switching between sketch and text modes, where handwritten annotations could be viewed as is or as text using a handwriting recognition package.

Related Cognitive Dimensions.

(provisionality, premature commitment, viscosity)

3.4 Directed focus

Visualizations can be designed to direct the user's attention to a specific area or component of a visualization or, to disperse their focus across multiple visualizations, displays etc. Support for this can increase situational awareness and help to avoid change blindness.

Related Cognitive Dimensions.

(visibility)

3.5 Inference Support

The syntactic interface designed to simply relay commands from the user to the application is important but less interesting than the semantic interface. Nardi talks about the need for the interface to support the transfer of application semantics to users. The ability to support complex cognitive tasks, decision making, idea generation and semantic reasoning is the goal of the types of visualization discussed in this paper. Dynamic, modifiable visualizations and semantic interfaces design with affordance for situational awareness for group collaboration is needed to support inference.

Related Cognitive Dimensions.

(role expressiveness, hidden dependencies, hard mental operations, premature commitment, viscosity, error-proneness, abstraction, secondary notation, consistency)

3.6 Modifiability

The ability to annotate and make modifications makes computer based visualizations very attractive. Direct manipulation of the visualizations or components affords user a sense of satisfaction and can help with situational awareness in terms of the users knowing exactly who is doing what and to which visualization or component.

Related Cognitive Dimensions.

(viscosity, error-proneness, premature commitment, abstraction, secondary notation, consistency)

3.7 Discourse Management

Situational awareness includes the ability to be aware of the history of a collaborative session and of the individual

contributions of the team members, this maps directly to discourse management and can be supported by some sort of versioned control management. The ability as to switch from a more provisional view to a one with a less polished feel could be supported by this dimension. This dimension is concerned with providing the ability to absorb, and develop ideas in conjunction with manipulation of the visualizations so as to generate a deeper understanding of the problem. This is similar to the way external representations evolved into more precise models and better understanding of the problems when working with the visual formalism of the table using the spreadsheet specialization.

Related Cognitive Dimensions.

(progressive evaluation, consistency, hidden dependencies, error-proneness)

4. CONCLUSIONS

This report has provided a summary of several papers related by their focus on visualizations. It has identified key properties of visualizations in general as well as specifics for their design, implementation and evaluation. Collaborative dimensions framework was introduced as a theoretic base from which to think about them and a development framework was described to help build a library of re-usable visual formalisms for designers and developers to create rich semantic interfaces for cognitively complex and scientific applications. Finally a heuristic based approach to evaluation was introduced to measure the usability of the visualizations.

4.1 Future Work

It should be noted that the paper on heuristic evaluation, the concepts described in the Collaborative Dimensions paper and its ancestor, the Cognitive Dimensions paper could all be interpreted as heuristics and the elucidation of these heuristics spans the boundary between artisans using heuristics and investigators trying to build a formal semantically strong model of visualizations. This latter work has yet to be undertaken, but the search for better heuristics is helping to map the territory such that subsequent investigators will have a substantial and stable starting point. Research could be done to relate the above papers and the work of Nardi on visual formalisms to create an overarching, coherent theoretical foundation from which to attack future work on complex collaborative visualizations.

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