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Exploring Geovisualization

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Chapter 8

### Exploratory Visualization with Multiple Linked Views

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*Keywords:* multiple linked views, coupling, linking, coordination, exploratory visualization

#### Abstract

Exploratory visualization enables the user to test scenarios and investigate possibilities. Through an exploration, the user may change various parameter values of a visualization system that in turn alters the appearance of the visual result. For example, the changes made may update what information is being displayed, the quantity or resolution of the information, the type of the display (say) from scatter plot to line-graph. Furthermore, the user may generate additional windows that contain the visual result of the new parameters so they can compare different ideas side-by-side (these multiple views may persist such that the user can compare previous incarnations). Commonly these windows are linked together to allow further investigation and discovery, such as selection by brushing or combined navigation. There are many challenges, such as linking multiple views with different data, initializing the different views, indicating to the user how the different views are linked. This chapter provides a review of current multiple linked-view tools, methodologies and models, discusses related challenges and ideas, and provides some rudiments for coordination within a geovisualization context. The types and uses of coordination for exploratory visualization are varied and diverse, these ideas are underused in geovisualization and exploratory visualization in general. Thus, further research needs to occur to develop specific geovisualization reference models and extensible systems that incorporate the rich variety of possible coordination exploration ideas. 38

#### 8.1 Introduction

This chapter advocates the use of many lightweight views that are linked together. They are lightweight in that they are: (i) easy to generate by the user, where the user does not spend unnecessary time and effort to explicitly link the new view to existing ones; and (ii) do not take many computer resources (e.g., memory, computation). Such multiple linked

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45 views (MLVs) enable the user to quickly view a scenario, compare it with previous 46 realizations, examine properties such as dependencies and sizes, put this view to one side 47 and try out another scenario. There are many good principles that can be learned from 48 examining how other systems achieve this MLV exploration. In geovisualization, the 49 explorer often generates many spatial or abstract representations. With such exploratory 50 environments, the user is able (even encouraged) to take a hands-on approach to gain a 51 deeper understanding of the underlying information. They may examine multiple 52 different graphical realizations that reveal different aspects of the data. These principles 53 are applicable to the geovisualization domain (indeed, many MLVs use spatial 54 information databases to demonstrate the techniques). This chapter highlights current 55 trends in MLVs. In order to provide an overview of different multiple-view exploration 56 strategies, we start by placing the MLVs in context, then discuss exploration strategies 57 and expand upon appropriate methods to enable interactive and effective investigation 58 and management techniques that oversee and encourage the user to explore. 59

#### 8.2 **Current Themes in Exploratory (Multiple View) Visualization**

61 When carrying out research, analysts often proceed by using an experimental cycle where 62 the experiment is set up perhaps with some default parameters, the results are noted 63 down, then the parameters are adapted and the results are compared with previous 64 versions. Each new investigation enhances the analyst's knowledge and understanding. 65 When starting the investigative process we may not know anything about the database 66 let alone what questions to ask. DiBiase (1990) focusing on the role of visualization in 67 support of earth science research, summarizes the research process as "a sequence of 68 4 stages: exploration of data to reveal pertinent questions, confirmation of apparent 69 relationships in the data in light of a formal hypothesis, synthesis or generalization of 70 findings, and presentation of the research at professional conferences and in scholarly 71 publications". Gahegan (Chapter 4) offers a perspective for "the entire process of 72 GIScience". The need for exploration techniques grows as the data become larger and 73 more complex. In such cases, the important aspects of the data are smaller, in comparison 74 with the whole, and specific details are more likely to be hidden in a swamp of elements. 75 Thus, in general, exploration techniques allow us to sift through volumes of data to find 76 77 relationships, investigate various quantities and understand dependencies.

One method to achieve this exploration, which has been the trend in the recent 78 years, is by "dynamic queries" (Shneiderman, 1994). These are highly interactive 79 systems that enable the visualizations to be manipulated, dissected and interrogated. The 80 user dynamically interacts with the visualization by adjusting sliders, buttons, and menu 81 items that filter and enhance the data and instantly update the display. By doing so the 82 83 "user formulates a problem concurrently with solving it" (Spence, 2001). For instance, 84 what was once a dark dense black region on a scatter plot can be immediately changed into a colourful and meaningful realization (see Chapter 6). Systems that use this 85 technique include HomeFinder (Williamson and Shneiderman, 1992) and FilmFinder 86 87 (Ahlberg and Shneiderman, 1994) both now regarded as seminal work on dynamic 88 queries. Ahlberg and Wistrand (1995a,b) developed these techniques into the Information

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Visualization and exploration environment system (IVEE). In one example, they depict an environmental database of heavy metals in Sweden; IVEE was then developed into the commercial Spotfire system (Ahlberg, 1996). Another early example is the "density dail" (Ferreira and Wiggins, 1990), where visual results were chosen dependent on the dial position. More recently, Steiner et al. (2001) provide an exploratory tool for the Web and the Descartes system (Andrienko and Andrienko, 1999a-f) both provide dynamic queries; these systems include map-based views linked to other views.

96 As an alternative to adapting sliders and buttons (as used in dynamic queries), 97 the user may directly manipulate the results; such direct manipulation may be 98 implemented using brushing techniques (Ward, 1994) or methods that select to highlight 99 or filter the information directly. Much of the original work was done on scatter plot matrices (Becker and Cleveland, 1987; Carr et al., 1987). Brushing is used in many 100 101 multiple-view systems from multi-variate matrix plots, coplot matrices (Brunsdon, 2001) 102 to other geographic exploratory analysis (Monmonier, 1989). One map based 103 visualization toolkit that utilizes multiple views and brushing is cdv (Dykes, 1997a,b). 104 cdv displays the data by methods including choropleth maps, point symbol maps, scatter 105 plot and histogram plots. Statistical and geographic views are linked together, allowing 106 elements to be selected and simultaneously highlighted in each. MANET (Unwin et al., 107 1996), developed from the earlier tools SPIDER and REGARD, provides direct 108 manipulation facilities such as drag-and-drop and selection and control of elements in the 109 display, for example.

110 Moreover, other direct manipulation techniques allow the inclusion of 111 manipulators and widgets; for example the SDM system (Chuah and Roth, 1995) 112 provides the user with handles mounted on visual objects to control the parameters 113 directly. Often the widgets are applied to the objects when they are needed and provide 114 additional functionality. The widgets may be multi-functional, where different 115 adornments provide specialized manipulation. Figure 8.1 shows a jack manipulator 116 where the outer cubes allow rotation; both the horizontal plane and vertical tubes allow 117

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Figure 8.1. Diagram taken from the Waltz visualization system (Roberts, 1998a,b), showing the use of the Inventor Jack manipulators.

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133 constrained planar translation. This manipulator is provided by Open Inventor libraries 134 and integrated in the Waltz multiple-view visualization system (Roberts, 1998a,b). In the 135 figure, the manipulator has been attached to an object that has been moved along the XZ plane (using the large horizontal rectangle). Other manipulators exist; for example, 136 137 selection in Mondrian (Theus, 2002a,b) may be operated through the use of rectangle areas. In this tool, the user may modify the regions by selecting handles on the rectangles, 138 multiple selection areas can be used at once, and the selected items are highlighted in 139 140 related windows. 141

#### 1428.3Strategies of Exploration

143 In any interactive visualization, the decision needs to be made as to where the 144 information goes, that is, when the parameters are changed does the new visualization 145 replace the old, get overlaid, or is it displayed alongside and in separate windows? 146 Roberts et al. (2000) names these strategies replacement, overlay and replication, 147 respectively. This is depicted in Figure 8.2. This fits in well with the design guidelines of 148 Baldonado et al. (2000), who describe the rule of "space/time resource optimization", 149 where the designer must make a decision whether to present the multiple views side-by-150 side or sequentially. 151

#### 8.3.1 Replacement

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The replacement strategy is the most common and has some key advantages, that is, the user knows implicitly where the information is updated and what information has changed. However, there are some major challenges with this strategy. First, there are



**Figure 8.2.** There are three strategies of exploratory visualization that determine where the information is placed: replacement, replication and overlay.

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problems by using such an ephemeral exploration environment. Information about 177 178 previous experimentations is usually lost, the user cannot compare different graphical 179 realizations side-by-side, and there is often little guidance as to the sensitivity of 180 different parameters (i.e., whether a small change of a parameter will make a small 181 change in the image, or in fact it makes a large amendment to the visualization). 182 Second, there is a risk of losing navigation context. For example, when a user zooms 183 into a subpart of the display the context of how the zoomed area fits in with the whole 184 is lost.

185 Some visualization systems overcome the transient nature of the display by 186 storing past visualization commands (as data or variable values) in a database, such as 187 Grasparc (Brodlie et al., 1993) and Tioga (Stonebraker et al., 1993). In the case of 188 Grasparc, or HyperScribe (Wright, 1996) as implemented as a module in IRIS Explorer, 189 the user can "roll back" to a predefined state and re-visualize the data with the "old" 190 parameters. As in the case of HyperScribe these states are usually stored in a "history 191 tree" where data arising from the experiment process is modelled in a tree structure and 192 the user can alter parameters and roll back to previous versions (Figure 8.3). 193

As the user explores, it can become unclear how the filtered, extracted and 194 specialized information fits in with the whole. Methods such as animation and distortion 195 help to keep this context. For example, animation is used in ConeTree (Card, 1996); in 196 this instance, a selected node is brought to the foreground by animating the 3D tree (for a 197 explanation and figure, see Schroeder, this volume, Chapter 24). The animation occurs 198 long enough for the observer to see a continuation and short enough so that the user still 199 observes the visual momentum. Moreover, there is a current trend towards generating 200 detail-in-context views also known as Context + Focus displays (Lamping et al., 1995). 201 Many implementations are non-linear magnification systems using methods such as those 202 described by Keahey and Robertson (1997). They appear with a linear (and traditional) 203 mapping in the centre or focus of the screen and squashed or distorted mapping outside 204 the focus area. For example, Snyder (1987) generated various magnifying glass 205 projections of the earth. Other people who use distortion to provide a clear field-of-view 206 to an interesting object in three dimensions include Sheelagh (1997). 207

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#### 8.3.2 Replication

Another way of working is to use a replication strategy for information exploration. In 223 this strategy, various parts of the information, parameters or views are copied or 224 duplicated and aspects are displayed in multiple ways and in different windows. 225 Replication refers to the action of the experimenter who wishes to repeat an experiment 226 or procedure more than once. Replication may be used to provide methodical or random 227 repetition of the experiment to confirm or reduce the error of the results (by perhaps 228 averaging the different findings) or to confirm the outcomes. Far too often a user relies 229 upon one display, presenting data by their "favourite" visualization algorithm. However, 230 they may be missing out on the richness of the underlying information. Hence by 231 duplicating and replicating the displays and slightly adapting the parameters for the next 232 incarnation the user is able to observe and compare the result of different scenarios and 233 experiment with the detail of their data. 234

Replication can be divided into two subcategories of usage: (i) the procedure – where the results that are generated by the change of parameters are displayed in separate windows; (ii) the course of action – where the same data may be presented by different mappings. These different forms of the same information are known as multiforms (Roberts et al., 2000).

It is useful to display the results of a parameter change in a new window: the user 240 can clearly observe and compare side-by-side the differences and similarities of the results. 241 For example, the user may wish to explore different isosurfaces depicting alternative 242 concentrations of some phenomena. If, as the user changes the threshold value a new 243 window appears displaying the new isosurface then the user can easily observe (and 244 compare) the varying concentrations from the current and previous explorations. As we shall 245 see in Section 8.4.4, such a dynamic replication could provide a multitude of views. Such 246 a view-explosion could confuse, rather than support the user in their exploration tasks. 247

Not only can different parameterizations be displayed in multiple windows, but 248 also the same information may be displayed in multiple forms. By doing so the user may 249 be able to see information that was previously obscured, or the different form may 250 abstract the information to provide a clearer and simpler representation, or the different 251 views may represent alternative interpretations on the same information (such as those 252 253 given by different experts). Indeed, the alternative view may help to illuminate the first. Yagel et al. (1995) advocate the use of "...visualization environments that provide the 254 scientist with a toolbox of renderers, each capable of rendering the same dataset by 255 employing different rendering schemes". Consequently, the user may gain a deeper 256 understanding of their data. For example, our eyes use binocular vision to present two 257 slightly different observations of the same scene, which provides us with a rich depiction 258 of the information. Certainly, we miss out when we look at one picture of something, such 259 260 as a still photograph of an historic building, and we gain a better understanding of the size, colours, textures and details when we browse through many photographic pictures, 261 fly through a virtual 3D model and view it from multiple viewpoints, and read written 262 263 explanations from an interactive guidebook. Likewise, it is often beneficial to the data 264 explorer to see the information from different perspectives and in different forms.

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265 There are many advantages in using replication, for example, the separate views 266 hold a history of the exploration, allow comparisons between images, and the multiforms 267 may emphasize different aspects of the information. Replication should be encouraged 268 (Roberts, 1998a,b). However, not many current systems inherently support many views 269 and the module visualization environments, which can display the data in many 270 representations, leave all the effort of duplication to the user. Indeed, such a replication 271 strategy is possible in the module building visualization environments, such as AVS, 272 IRIS Explorer and IBM Data Explorer (Williams et al., 1992). However, exploring the 273 information in such a way with these tools requires copying and reconnection of multiple 274 modules, and thus the replication strategy is not necessarily encouraged or easy to operate 275 in these module-building environments. It is not a lightweight operation. The system 276 itself should have the functionality to support multiple views, created with little effort 277 from the user, managed appropriately by the system and automatically coupled to other 278 views. Moreover, further understanding may be gained through linking and coupling of 279 information. For example, selections that are made in one view can be reflected in other 280 views, other operations such as zooming and rotation operations can be cordially applied 281 to any associated view - hence the phrase MLVs. 282

#### 283 **8.3.3 Overlay**

284 A third method of generating the visualization result is to overlay the visualization 285 method in the same display. Overlays allow different visualizations to share the same 286 coordinate space. Such a fan-in method allows different representations of the same 287 information in the same display to be layered together. The advantage of this is that it is 288 easy to understand each view in the context of the other, and the information may be 289 readily compared. Different representation methods may be mixed together in the same 290 view. For example, one view may include 2D pseudo-colour slices, surface 291 representations, legends and useful annotations. However, when too much information 292 is presented in the one view, or layered over a previous version, it may be difficult to 293 select and navigate through or understand specific information. This may be because the 294 presentation is too crowded and complex or that parts of the visualization are occluded. 295

Indeed occlusion may be a problem in 2D visualizations as the objects may lay 296 directly over each other. This may cause a misunderstanding of how many elements are in 297 fact at a particular coordinate. Solutions such as the use of transparency or randomly 298 jittering the points may help to clarify the depictions. Additionally, aggregation followed 299 by different mapping techniques may be useful, as demonstrated by the sunflower plot of 300 Dupont and Plummmer (2003). Obviously, the usefulness and appropriateness of the 301 overlay method depends on the graphical visualization technique and the visualization 302 tasks being used. 303

Related work includes the excellent Toolglass and Magic lenses (Bier et al., 1993) widgets that allow the user to see through and focus on details of the display. Geospace (Lokuge and Ishizaki, 1995) usefully employs translucency between the layers, and Kosara et al. (2002) uses a semantic depth of field to blur layers to keep the context. Döllner (Chapter 16) uses texture-mapping methods to implement a lens effect that draws upon transparent J.C. Roberts

layers. Moreover, Gahegan (1998) provides an example of an integrated display to achieve
 more complete integration of geovisualization views. Ongoing work on MANET (Unwin
 et al., 1996) is focussed on methods to overlay different plots on the same view.

The challenge here is to develop effective overlays that enable the user to keep the context information, understand the depth of knowledge and not become overwhelmed by a complex visual representation. Specific challenges include how to effectively operate the overlaid views – does the interaction go through a view or is only the top view active? How is the user made aware that the views may differ in their data? How are the data linked to the data, and can it be coupled?

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#### 8.4 Multiple Linked Views

321 Linking and relating the information in one view to that of other views assists the user in the 322 exploration process and may provide additional insight into the underlying information. 323 Certainly, "multiple views should be coordinated" (Carr, 1999). As the information is 324 explored and placed in separate windows, it is important that the relationships between the 325 views and the context of how one view relates to another are maintained. Indeed, 326 Shneiderman and North (2000) in their user experiments discover that MLVs are beneficial 327 and state that "the overview and detail-view coordination improved user performance by 328 30-80% depending on task". Such additional "overview" realizations provide context 329 information that enhances the understanding of the associated view. 330

Many different forms of information may be linked and coordinated. For 331 instance, manipulation operations (such as rotation, translation, zoom, etc.) may be 332 concurrently applied to separate views so as when one view is manipulated the other 333 views respond appropriately to the same manipulation operations; the spatial position of a 334 pointer or probe may be linked between multiple views; filter, query and selection 335 operations may be simultaneously applied. Moreover, these operations need only affect 336 the same information but, more interestingly, to collections of different information. 337 Coordination and abstract views provide a powerful exploratory visualization tool 338 (Roberts, 1998a), for example, in a 3D visualization, a navigation or selection operation 339 may be inhibited by occlusion, but the operation may be easier using an abstract view. 340 Fuhrmann and MacEachren (1999) describe the use of an abstract view to guide 341 navigation in a 3D geospatial representation, ideas that are further developed by 342 Fuhrmann and MacEachren (2001). Thus, a linked abstract view may be used to better 343 control and investigate the information in the coupled view. 344

Accordingly, there are different reasons for coordination. North and 345 Shneiderman (1997) state there are two different reasons for using coupled views, either 346 for selection or for navigation. Although Pattison and Phillips (2001) disagree by saying 347 that there are additional forms of coordination other than selection and navigation, for 348 example, "coordinating the data in preparation for the visualization such as sorting, 349 averaging or clustering". Likewise, Roberts (1999) believes in a broader use of 350 351 coordination, exemplified by the layered model (Roberts, 1999; Boukhelifa et al., 2003) 352 where the user may link any aspect of the dataflow and exploration process.

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Selection allows the user to highlight one or many items either as a choice of items for a filtering operation or as an exploration in its own right; this is often done by direct manipulation where the user directly draws or wands the mouse over the visualization itself (Cleveland and McGill, 1988; Ward, 1994). Becker and Cleveland (1987) describe this as a brushing operation. Examples, of systems that implement the brushing technique include XmdvTool (Ward, 1994), IVEE (Ahlberg and Wistrand, 1995a,b) and Spotfire tools (Ahlberg, 1996).

360 Joint navigation provides methods to quickly view related information in multiple 361 different windows, thus providing rapid exploration by saving the user from performing the 362 same or similar operations multiple times. Objects, such as pointers, annotations or meta-363 information, may be coupled. For instance, the developers of the visualization input 364 pipeline (VIP) (Felger and Schröder, 1992) describe an example that displays several views 365 of the data with the cursors linked together; movement of one pointer causes the others to 366 move correspondingly. Other forms of navigation include data probing, as implemented within both LinkWinds (Jacobson et al., 1994) and KBVision (Amerinex, 1992), and 367 368 changing the viewport information, as accomplished in SciAn (Pepke and Lyons, 1993) 369 and Visage (Roth et al., 1996), which provide coordinated manipulation of 3D views.

# 3708.4.1Linking architectures

The study of coordination is interdisciplinary and there is much to learn from other disciplines. Taking the simplistic view of coordination being "sharing things" then we may learn from areas such as sharing hardware devices in a computer system or managing, delegating roles in a human organization or collaborative support, for example, see Brodlie et al. (this volume, Chapter 21). For an in depth interdisciplinary view of coordination, see Olson et al. (2001).

In this particular chapter, we focus on four models: Snap (North, 2002), presentation graphics (McDonald et al., 1990) and the View Coordination Architecture (Pattison and Phillips, 2001) and a Layered Model for Coordination (Boukhelifa et al., 2003). Andrieko et al. (this volume, Chapter 5) provide an in depth discussion of software issues in geovisualization.

383 The Snap conceptual model (North, 2002) takes a data-centric approach to coordination. It uses concepts from database design to provide the required interaction. 384 385 Relational database components are tightly coupled such that an interaction with one 386 component results in changes to other components. The Snap architecture is designed to 387 construct arbitrary coordinations without the need for programming. However, Snap's user interactions are currently limited to "select" and "load", whereas exploratory 388 389 visualization permits rich and varied interactions such as representation-oriented coordinations in addition to data-centric coordinations. 390

McDonald et al. (1990) describe a constraint system based on the presentationgraphics programming model (Figure 8.4). In this system, lenses map the subjects (objects) in the database into their visual presentations counterparts, a user interacts with the presentation and the subjects get updated through the input-translator, and finally, a constraint system updates corresponding properties and updates any other related graphical presentations.

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Figure 8.4. Presentation graphics programming model (McDonald et al., 1990).

411 Pattison and Phillips (2001) developed an architecture based on the model view 412 controller (MVC) design pattern that originated in the Smalltalk architecture 413 (Figure 8.5a). This pattern describes three objects: the model, view and controller, 414 where the model holds the state of the process and publishes notifications to the views 415 when its state changes, the view(s) reflect the state of the data model, and the controller 416 updates the model with requests from external events. The MVC architecture inherently 417 supports multiple views, and Pattison and Phillips (2001) have adapted the model for 418 Information Visualization (Figure 8.5b). Where the presentation component observes the 419 model for changes and updates its display as necessary, the model component observes 420 both the specification and data model components for change modifications to the 421 specification component are propagated up. This architecture fits in with the dataflow 422 paradigm (Haber and McNabb, 1990). 423

Rather than concentrating on the implementation architecture, our work has 424 focussed on a layered approach that is based on the dataflow model (Roberts, 1999; 425 Boukhelifa et al., 2003) and incorporates more layers than that of Pattison and Phillips 426 (2001). In this approach, the coordination may occur between any parameter at any level of 427 the visualization flow (Figure 8.6). Therefore, the user can link a broad range or aspects 428 between several windows, for instance, the view projection transformations can be shared (to 429 co-rotate several 3D objects included in separate windows) or characteristics of the objects 430 can be simultaneously changed (such as their appearance, colour, texture or position, etc.), or 431 window-operations can be coordinated (such as moving, deleting or iconizing windows). 432

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#### **8.4.2** The role of MLVs in the exploration process

The exploration process may be described as a history-tree, indeed, even if the views are a result of a set of random thoughts, each view still relates in some way (however tenuous) to former investigations. Often the newest explorations are close to the former; this is the case especially if the user makes minor amendments to a copy of the previous view. Consequently, it is sensible to consider clusters or groups of closely related views. This can occur as "render groups" (Yagel et al., 1995) where different renderers are used to

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Figure 8.5. (a) Left, depicts the traditional MVC pattern. The views reflect the current state of the model; the information held in the model is updated via the controller. (b) Right, shows the coordination model by Pattison and Phillips (2001) based on an MVC pattern, where the presentation component observes the model for changes and updates its display as necessary, the model component observes both the specification and data model components for change and changes to the specification component are propagated up.

display the same data filtering (at an equivalent the level to the "Data Model" in Figure
8.5). Information within each render group may be straightforwardly related to each other
such that default coordinations may be readily defined (Roberts, 1999).

Generating multiple views from any part of exploration process may be 473 useful; here the user keeps older versions of their investigations such that they can 474 compare previous incarnations. They provide a context of the whole exploration 475 process. However, linking outside render groups is challenging as some operations may 476 not be generally applicable such as highlighting elements between two disparate data 477 models when each contains a set of disparate non-intersecting elements. It is both 478 possible and often beneficial to coordinate outside the render groups, for instance, 479 multiple 3D worlds may be simultaneously rotated even if they contain dissimilar 480 realizations. There is an advantage in grouping the multiple views together as 481 Kandogan and Shneiderman (1997) discover through their evaluations: the user better 482 understands the relationships in the views, and can more easily find and drill down to 483 the important aspects of the display. 484



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**Figure 8.6.** The diagram shows a layer model, where many different forms of information may be linked and coordinated. For instance, manipulation operations (such as rotation, translation, zoom, etc.) may be concurrently applied to multiple views so as one view is manipulated the other views respond appropriately to the same manipulation operations, the spatial position of a pointer or probe may be linked between multiple views.

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### 8.5 Linking and Coordination Concepts

515 All the aforementioned ideas allow many windows to be created and linked with other 516 views, but, rather than arbitrarily creating and linking views there is usually structure in 517 an investigation. Certainly, when developing a coupled visualization system there are 518 many questions to consider about the coupling. What is being coupled? What are their 519 types? What gets changed? How does the information change? It may be that some links 520 do not make sense and in fact may confuse the user, especially in visualization applied to 521 exploration. Therefore, there are many challenges and much research still to be done. We 522 distil these ideas into some rudiments of coordination.

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#### 8.5.1 The rudiments of coordination

526 In essence, the linking of information between views may be described as "information 527 sharing" For example, if two objects in separate windows were projected using the same 528 shared transformation matrix then any change to that matrix would update both views

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simultaneously. Accordingly, coordination may be thought of as in terms of programvariables. Thus, using this analogy the links have the following elements:

- Coordination entities details what is being coordinated. For example, it could be aspects of the data, record, parameters, process, event, function, aspects of the window or even time.
- The type expresses the method by which the views are linked. Coordinating • 535 parameter values such as coupling binary threshold operations or selecting 536 ranges may be implemented by sharing primitive types (float, integer, etc.) 537 while other operations may use more complex data structures. Some form of 538 translation (or casting) may be required to coordinate entities with different 539 types. In addition to this translation function, it is often useful to allow more 540 intricate functions, such as to allow entities to be related via an offset (or by 541 some other relation). In virtual reality it may be useful to provide two 3D views 542 with one being at ground level and the other tethered above; the tethered view 543 could provide an overview and thus move correspondingly with the ground 544 view, for example, see Döllner (this volume, Chapter 16). The types may also 545 determine the directionality of the links whether unidirectional or bidirectional. 546
- Chronology details temporal aspects such as the persistence or lifetime of the 547 coupling, that is, how long the coupling exists? For example, it may be that 548 objects in the scene are coupled for a specific task and then uncoupled when the 549 task is over. Incidentally, like program variables, persistence and scope are 550 inherently related. Moreover, the coordination may be synchronous, asynchro-551 nous, reactive, and proactive. For example, it may be useful to join the rotation 552 of two views, one from a fast and the other a slow renderer, such that the slower 553 render gets updated at a lesser rate; additionally, the user may make and review 554 a change, then decide whether to commit or cancel this operation. McDonald 555 et al. (1990) describes these capabilities as markup and commit/cancel. 556
  - *Scope* controls the "area" of the correlation, whether two specific views, many realizations, or all realizations are coupled within an exploration. For example, the render group scenario is equivalent to a local variable and the global variable would be equivalent to coupling every view in the exploratory session.

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- *Granularity* expresses how many entities may be connected together. For
   example, how many entities are coordinated, how many views are connected in
   one coordination operation.
- Initialisation indicates who creates a correlation, whether the user or the system. 564 • 565 For example, in spreadsheet system it is possible to name particular views for specific operations, or by using a render group method it is possible to 566 automatically correlate aspects of the views. There is a similar issue regarding 567 the creation of the views themselves. Some visualization systems automatically 568 569 create the visualizations from a database of knowledge (metadata information) 570 and user requirements. The Vista tool (Senay and Ignatius, 1994), for example, 571 creates appropriate visualizations by asking the user to list the variables in order 572 of preference.

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• Updating describes how and when the information within the views and child modules are updated and refreshed, such as lazy update, or greedy update or user initiated. This is similar to the cold/warm/hot-linking concepts mentioned by Unwin (2001). Cold linking allows an adjacent view to be coupled once and ignores any changes to the former view (similar to copying values rather than copying a formulae in a spreadsheet), warm linking allows the user to decide when to update, hot linking provides automatic and dynamic updating of the linked views. Moreover, the interface should reflect the current state, for example by shading out the out-of-date views. However, it may be that views depend on other views and if the user is relying on the data-history it may be prudent to allow the user to force the update when required.

584 Currently, some general-purpose visualization systems do provide some of 585 these rudiments, for instance, IRIS Explorer allows parameters to be coordinated 586 through unidirectional events and more intricate functions may be formed using the 587 p-func editor; however, IRIS Explorer does not provide bidirectional links and 588 disallows simultaneously connecting the reverse linkage to inhibit circular event 589 explosions taking place. In geovisualization, a good example of linking is that of the 590 bi-directional link between ArcView and xGobi (Symanzik et al., 2000). 591 Coordination is used in other geovisualization systems; the GeoVISTA studio for 592 example (MacEachren et al., 2001) incorporate some coordination features. Many 593 systems provide an overview map to manage the manipulation of the whole (Steiner 594 et al., 2001; Andrienko and Andrienko, 1999a-f). Additionally panoraMap (Dykes, 595 596 2000) allows panoramic photographs (georeferenced with GPS positions) and other 597 information to be dynamically linked with an interactive map, other information such as key-points visited and qualitative and quantitative information collected on site are 598 599 also shown by icons and symbols on the map.

It is clear that there are many issues still unanswered regarding each of these rudiments, for example, are there specific rudiments for geovisualization? Or in general: does it make sense to coordinate different types together? And if so: what translators are required? How does the user recognize the scope of the coordination or indeed understand the persistence or recognize whether something is out-of-date? Moreover, many systems do not provide the full rich set of linking strategies that are possible.

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#### 8.6 Management of Views and Linkages

In addition to the linking concepts there are some subsidiary issues to consider, such as
managing the views and linkages, placement of the views and temporal aspects.

#### 611 612 **8.6.1 Managing the MLVs**

613 The essence of lightweight MLVs is that they are easy and quick to generate, but by 614 supporting such a strategy the user may generate many views (that will create a view 615 explosion) where many of the representations are only slightly different to the previous 616 This creates two main problems. First, these many representations may easily clutter

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617 the screen-space (there is a limited "real-estate" in any screen technology), and thus their 618 needs to be either some form of restraint to guard the user from generating too many 619 windows or management strategies to appropriately and automatically place each 620 window (the latter is detailed in §8.4.4). Second, the user may also be confused as to 621 "which image relates to which data-instance". The systems in the literature provide 622 different solutions.

623 One solution is to inhibit the number of views: Baldonado (2000) provides a 624 useful set of guidelines for using multiple views, and include the rule of parsimony – use 625 multiple views sparingly. Another solution is to trade space by time. Spence (2001) 626 discusses this solution and provides the idea of rapid serial visual presentation (RSVP); this 627 allows the user to rifle through a set of objects analogous to flicking through the pages of a 628 book in order to acquire some understanding of its content. This space/time trade off may 629 be described as an overlay methodology. Finally, a good policy would be to use the three 630 strategies (replacement, overlay and replication) together, allowing the user to replace 631 certain instances and replicate when they need to achieve side-by-side comparisons.

632 It is important that the user should clearly understand the relationship of how 633 each view relates to each data model. Many systems display the history tree (on a work-634 pane or canvas) allowing the user to rollback to previous versions (Brodlie et al., 1993; 635 Wexelblat and Maes, 1999). Then the problem becomes how to relate the views with the 636 canvas. This can be achieved using various methods. In the Waltz system (Roberts, 637 1998a,b), each window is labelled, relating it to its respective module on the work-pane. 638 This is a hierarchical numbering scheme, like the sections of a book, and is used to name 639 each view. The names are then displayed on the history tree. The spiral calendar 640 (Mackinlay et al., 1994) provides a graphical solution by using lines to relate one window 641 to another. 642

There is still much work to be done in developing effective view management strategies for MLVs; whether managing the placement of the views, controlling a possible view explosion, or relating the view information to that of the exploration hierarchy.

6476488.6.2 View placement strategies

The placement of the many windows can have a significant impact on the usability of the system: it is an important human computer interaction issue. Overlapping windows can cause the user to spend more time arranging the windows rather than doing the task (Kandogan and Shneiderman, 1997), whereas the screen may not be large enough to display each required view simultaneously. There are different placement strategies described as follows.

First, the user is given the responsibility to position, iconize and scale the windows. As it is often difficult to select and find occluded windows, the system provides a repository or toolbar to hold a list of the displayed windows. This may take the form of a list of the named views, collection of icons, or thumbnail representation of the current views.

659 Second, the system holds the responsibility for placing the views on the screen.660 These "intelligent" interfaces tile (or tabulate) the windows such that they appear

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661 adjacently without overlap. Elastic views (Kandogan and Shneiderman, 1997) provide a 662 good example; in this methodology, the windows are hierarchically placed on the screen 663 and dynamically scaled to fill the available space. Alternatively, spreadsheet styles are becoming popular (Chi et al., 1998; Jankun-Kelly and Ma, 2001) where the views are 664 665 positioned in a tabular formation. Furthermore, the strategy may depend on some aspect 666 of the data exploration or some other metric. For example, windows could be scaled 667 smaller if less important, implemented by a zoomable interface such as Pad++ (Perlin 668 and Fox, 1993), or presented in a scatter plot form where the placement of each is 669 dependent on two variables, or hierarchically as in the Flip zoom technique (Holmquist 670 and Ahlberg, 1997).

Many of the current multiple view visualization systems hand the responsibility
to the user, however, there is much benefit in structuring the position of the views relative
to each other. Thus, strategies for positioning the views appropriately should be
researched. Many questions remain including: are the requirements of an MLV
visualization system very much different to that of a traditional windowing system?

#### 676 677 **8.6.3 Chronology, animation and timing in MLV**

678 Many datasets are time dependent; their visualization in an MLV environment may be 679 treated in different ways. The simple case is to generate an animation of the data. In the 680 above terminology, each frame would replace the previous. Alternatively, each 681 individual frame (or a sample of frames) may be displayed in a separate view (or 682 stacked and overlaid in a single view). Coupling multiple-view animations would involve 683 synchronizing the two streams. This may be at a fine granularity (e.g., tightly 684 synchronizing each individual frame) or coarse granularity (e.g., synchronizing on 685 specified key-frames).

Additionally, it may be that there are objects animated or moving in the scene (such as people, planes or boats). It may be useful to couple one view to the moving object and provide another view of the whole environment. The linked view may be tethered such that it looks down on the object being moved (separated by an appropriate distance). For example, the GeoZui3D of Plumlee and Ware (2003) provide different "frame of reference coupling" methods that describe how the new view moves in relation to the animated objects.

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#### 8.7 Current Objectives and Challenges

Recent research has focussed on providing principles for multiple views (Baldonado et al., 2000) and examining linking methods such as Roberts' taxonomy of coordination (Roberts, 1999; Boukhelifa et al., 2003) and North's Snap-together system (North and Shneiderman, 2000a) that allows unforeseen combinations of coordinated visualizations.
This research is opening the way for more expressive investigation environments that support the user in their task rather than distracting the user from their task.

Currently many multi-view systems only really support a few views where the
 system determines what and how the information is linked. Thus, further research should
 focus on developing systems that utilize many lightweight views that are truly quick to

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705 generate and automatically linked with other information and implicit to operate. Indeed, 706 the system could be designed that would suggest or automatically generate other views 707 that the user had not thought of using. The user may find these non-traditional views unfamiliar, but this unfamiliarity itself may provide a better understanding. 708

709 There are many issues surrounding MLVs that are lightweight (some have been 710 highlighted in this chapter). To develop an appropriate MLV system that utilizes these aforementioned concepts, it may be that the system needs to automatically generate the 711 712 visualizations on behalf of the user, such as in the Vista system (Senay and Ignatius, 1994) 713 or at least make it as easy as possible to generate further representations (Roberts, 1998a,b). 714 Furthermore, if the system provides a diverse and functional-rich interface then the user 715 may be overwhelmed by the nature of the system. Overall, a balance needs to be found both 716 to generate the right amount of views for the task (whether they are by replacement, 717 replication or overlay), and to provide an expressive linking mechanism that also restrains 718 the user from performing incomprehensible and unprofitable coupling operations.

719 In addition, more empirical research needs to take place on the different designs 720 to evaluate what is useful. Kandogan and Shneiderman (1997) have evaluated the 721 effectiveness of certain multiple view systems and North and Shneiderman (2000b) have looked at coordinated views. However, more studies are needed. It is well understood that 722 723 the effectiveness of a particular system or design is highly dependent on the visualization 724 or investigative task and the domain; to this end Baldonado et al. (2000) offers some 725 guidelines, but it still remains unclear when the user should replace, replicate or overlay 726 the information to gain the best understanding.

727 The geovisualization domain poses many challenges (MacEachren and Kraak, 728 1992). Indeed, highly interactive systems have already been developed such as Descartes 729 (Andrienko and Andrienko, 1999a-f), GeoVIBE (Guoray Cai, 2001) and cdv (Dykes, 1997a, b). However, further research is required to put in place the tools and techniques that will allow 730 appropriate multiple-view exploratory geovisualization systems to be easily developed. 731 732

We propose the following strands of research:

- (1) Specific geovisualization reference models and toolkits need to be developed that incorporate lightweight MLVs and include the rudiments of coordination.
- (2) The tools need to support dynamic queries and complex coordination operations enabling highly interactive context + focus navigation.
  - (3) The developed systems need to be easily extensible that will allow the data from the ever increasing and diverse range of data to be suitably visualized.
- (4) Methods need to be developed that integrate a wide range of different presentation methods, thus, allowing the user to view the information from different perspectives and try out different scenarios.
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