A Principled Taxonomy of Software Visualization

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Received 8 January 1993 and accepted 18 June 1993

In the early 1980s researchers began building systems to visualize computer programs and algorithms using newly emerging graphical workstation technology. After more than a decade of advances in interface technology, a large variety of systems has been built and many different aspects of the visualization process have been investigated. As in any new branch of a science, a taxonomy is required so that researchers can use a common language to discuss the merits of existing systems, classify new ones (to see if they really are new) and identify gaps which suggest promising areas for further development. Several authors have suggested taxonomies for these visualization systems, but they have been ad hoc and have relied on only a handful of characteristics to describe a large and diverse area of work. Another major drawback of these taxonomies is their inability to accommodate expansion: there is no clear way to add new categories when the need arises.

In this paper we present a detailed taxonomy of systems for the visualization of computer software. This taxonomy was derived from an established black-box model of software and is composed of a hierarchy with six broad categories at the top and over 30 leaf-level nodes at four hierarchical levels. We describe 12 important systems in detail and apply the taxonomy to them in order to illustrate its features. After discussing each system in this context, we analyse its coverage of the categories and present a research agenda for future work in the area.

1. Introduction

A WELL-FOUNDED TAXONOMY can further serious investigation in any field of study. A common language or terminology facilitates communication about ideas or discoveries. Taxonomies provide this common language and allow new discoveries to be identified and catalogued. They also show where an apparently new discovery is a refinement or variation of something else. In the natural sciences, taxonomies (such as the periodic table of elements) have also served to predict where new discoveries will be made. An important feature of a taxonomy is that it allow for expansion; if a new branch of a field is discovered or invented it must fit smoothly into the taxonomy without requiring a re-ordering of all of the other items. If a particular area later warrants closer study then a finer subdivision must be allowed. Thus, a taxonomy must have a principled derivation, for an ad hoc approach invites chaos and frequent problems in categorizing new items.

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In this paper we present a new taxonomy for systems involved in the visualization of computer software. We seek to provide a detailed 'road map' of the work accomplished so far by identifying six broad categories of characteristics derived from an accepted model of software and by filling in the observed characteristics in each category. We describe 12 systems in detail and then apply the taxonomy to them in order to illustrate its application and to show how the systems span the taxonomy.

Many of the characteristics require a subjective evaluation to rank systems relative to one another. Each ranking is based on our understanding of the systems and in some cases on our personal opinion of their relative performance; this is the weakest point in our taxonomy and more rigorous methods are required for evaluation. In the discussion we look at the performance of each system in each category and comment on its contribution to the field. We also mention how the fields of cognitive science and software psychology have been underutilized by researchers building systems and suggest a number of ways in which this work can make a contribution. We conclude with a research agenda for the 1990s.

2. Definitions

Phrases like visual programming, program visualization and algorithm animation have been defined and used many times in the literature, yet future clarification is still necessary. The use of the word 'visual' in 'visual programming' can be misleading if one only considers the common definitions of the word 'visual'. In the Oxford English Dictionary [1] (p. 699), the first six of the seven definitions of 'visual' relate to information gained from the use of the human eye, while the seventh suggests the conveyance of a mental image. It is this latter definition that applies to 'visual languages' or 'visual programming' since a mental image can be formed as a result of input from any of the senses. All programming (at least in the last 30 years) is 'visual' in the common sense of the word, since it involves programmers reading printed code (with their eyes). Virtually all modern programming is also at least weakly visual in the 'mental image' sense, since human programmers do not read code serially as a stream of bits in the way an interpreter or compiler does. Even programmers who use a simple VT100-style terminal in a single-colour, fixed-pitch font can get a mental image that aids comprehension from the appearance of the indenting in their code [2, 3] and the relative sizes of code blocks (cf. Baecker and Marcus's [4] program maps).

Because it contains the root word 'visual', 'visualization' is often considered to be restricted to visible images (hence the coining of words like auralization). In fact, its primary meaning is 'the power or process of forming a mental picture or vision of something not actually present to the sight' [1] (p. 700), so a visualization can result from input from any combination of the human senses. Program visualization (PV) has been defined by several authors, but the general consensus is that it is the use of various techniques to enhance the human understanding of computer programs, while visual programming (VP) is the use of 'visual' techniques to specify a program in the first place. The problem with the term 'program visualization' is that it becomes ambiguous when considered in the context of its constituent parts. Algorithm visualization (or animation) is understood to be the visualization of a high-level description of a piece of software, which is in contrast to code or data visualization

(which are collectively a kind of program visualization) where actual implemented code is visualized. We prefer the term software visualization (hence SV) to include all of these because it eliminates the ambiguity and covers all of the software design process from planning to implementation. It also includes software composed of multiple programs.

We define SV as the use of the crafts of typography, graphic design, animation and cinematography with modern human-computer interaction technology to facilitate both the human understanding and effective use of computer software. Considered strictly, this means that the representation of a program written in a visual language is a kind of SV, although it would be considered a weak version since it is designed to facilitate specification rather than understanding. In this paper we will only consider systems employing intentional SV and thus no visual programming systems are mentioned. Figure 1 is a Venn diagram showing how each of the terms in the literature fit together under our definitions. We note that in some cases the boundaries in this diagram become blurred, such as when a very high-level program specification is visualized or when the division between instructions and data becomes unclear.

Some other terms require definition within the scope of this paper. We use the term programmer to refer to the person who wrote the original program that is being (or going to be) visualized. Programmers may not have known that their programs were going to be visualized when they wrote them. Another kind of programmer is the SV software developer who wrote the system used to create the visualization. We use the word visualizer to mean the person who created the visualization from the original

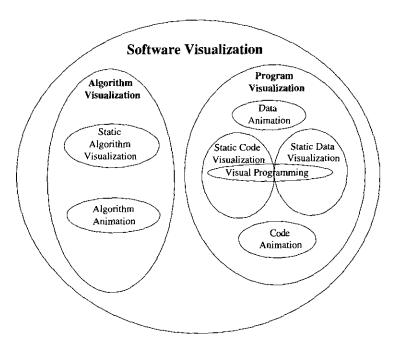


Figure 1. Venn diagram for each of the terms in the SV literature (the size of each area is not relevant and for simplicity the only intersection shown is that for visual programming)

program using the SV system and the word user to mean the person using the visualization to understand the original program. A single person may have more than one of these roles.

3. Other Taxonomies and Surveys

The best-known taxonomy and survey is probably that of Myers [5] which has been updated twice [6, 7]. In his first paper, Myers provided an excellent differentiation between programming by example, visual programming and program visualization. In his latest paper, he looked at 19 SV (PV in his nomenclature) systems and classified them along two axes: their level of abstraction (from showing code or data to showing algorithms) and the level of animation in their displays (whether static or dynamic). This resulted in a 2 × 3 grid with several systems falling into multiple categories. This taxonomy is a good starting point, but we believe that the variety of systems, goals and technologies available demands a more thorough approach. Myers's axes are certainly some of the most important characteristics of an SV system, but his section on 'General Problems and Areas for Future Research' reveals a number of characteristics which are worthy for distinguishing existing systems.

Stasko and Patterson [8] introduced scaled dimensions in their four-category taxonomy covering aspect, abstractness, animation and automation. Although the title of Shu's [9] book is Visual Programming, she discusses SV systems in the early chapters and her chapter and subheading breakdown indicates the same basic characteristics as Myers (data vs. code visualization and static vs. animated). Chang's [10] book surveys a large number of VP systems, many of which present visualizations of software. Other taxonomies and surveys with related work include Glinert's [11, 12] extensive survey of VP systems (which includes some SV) and Cypher's [13] comprehensive study of Programming by Demonstration (formerly Programming by Example) systems, some of which use visualization.

In choosing to expand these taxonomies we saw two important problems: to choose characteristics in a systematic way, and to allow for future expansion and revision as the field changes. We address the latter problem by building the taxonomy hierarchically so that new nodes can be added easily. We address the former problem by deriving the top level of the hierarchy from a basic model of software so that as characteristics are discovered they can be placed in the appropriate group to determine if they are in fact new.

3.1. A Brief History of Software Visualization

The importance of visual representations in understanding computer programs is by no means new. Goldstein and von Neumann [14] demonstrated the usefulness of flowcharts, while Haibt [15] developed a system that could draw them automatically from FORTRAN or assembly language programs. Knuth [16] developed a similar system which integrated documentation with the source code and could automatically generate flowcharts. Although early experiments cast doubt on the value of flowcharts as an aid to comprehension, recent results are more encouraging [17].

A different approach was taken with Knowlton's [18, 19] films, which showed list manipulation in Bell Lab's L⁶ language [20]. This work was the first to use dynamic,

as opposed to static, techniques, and the first to address the visualization of data structures. Baecker's [21] debugger for the TX-2 computer produced static images of the display file, but it was live and interactive. Baecker continued this work in a pedagogical direction which resulted in systems for showing data structure abstractions in running programs [22] and eventually in the film Sorting Out Sorting [23].

The 1970s also saw a return to flowcharting with the development of Nassi-Shneiderman diagrams [24] to counter the unstructured nature of standard flowcharts. Roy and St Denis [25] then developed a system for automatically generating Nassi-Shneiderman diagrams from source code through a specialized compilation process.

The remaining development from the 1970s was pretty-printing, a term coined by Ledgard [26] to describe the use of spacing, indentation and layout to make source code easier to read in a structured language. Many systems for automatic pretty-printing were developed, such as NEATER2 [27] for PL/I and Hueras and Ledgard's [28] system for Pascal. The techniques have proved relatively simple; however, recent extensions to this work have used computerized typesetting and laser printing to provide a much improved presentation of source code. This has ranged from a simple utility to change the style of the font depending on keywords [29] to the SEE Program Visualizer [4] which automatically takes a set of C programs and formats a 'program book' out of them. Knuth's [30] WEB system is similar, but combines the documentation and program in one document using a mark-up language.

The 1980s saw the beginning of modern SV research with the introduction of the bit-mapped display and window interface technology. The most important and well-known system of this era was BALSA [31], followed by Balsa-II [32], which allowed students to interact with high-level dynamic visualizations of Pascal programs. Many prototypes and production systems using modern human-computer interface technology have been developed since (see the next section for more detail on a number of systems or the work of Myers, Shu, Chang or Glinert, cited above, for a larger sample).

3.2. Current Uses of Software Visualization

The motivation for building 'visual' systems (both SV and VP) has been well-argued in the literature (see, for example, the discussion of the 'dual brain' in the introduction of Shu's [9] book or the introductions in any number of the other systems cited) so we will not repeat it here. While newer programming environments have begun to make use of more visual techniques to display information, the majority of professional programmers we have observed still rely on the old glass teletype technology: they may use multiple-scrolling windows on large-screen workstations, but by and large they still edit their programs in single-colour, fixed-pitch text and debug their programs using conventional debuggers. Even the latest workstation programming environments simply provide 'window dressing' on conventional debugging tools like Unix's clox. Modern CASE tools, such as 'Software Through Pictures' from Interactive Development Environments, Inc., employ static diagrams (see Martin and McClure [33] for detailed examples). These aid in structured analysis and design, but do not use any kind of run-time model or animation.

Why is SV technology not being used and why are the new visual systems not being

widely adopted? One likely answer is that software engineers (and their employers) have not seen demonstrable gains from using this technology. It is clear that if SV systems are to make a contribution to software engineering then solid results proving their benefits will be necessary. In the following sections we map the areas that have been explored so far and suggest where continued research will benefit professional software engineers.

4. Twelve Systems

It is easier to understand any taxonomy if one has a number of familiar examples to test against it. In the following sections we give a brief explanation of 11 different SV systems developed in university/corporate research environments, and one commercial workstation programming environment with SV features; we will refer to each of these systems later as we explain our taxonomy. We chose the research systems either because of their historic importance or because they illustrate a diversity of approaches (or both). These systems do not include all the historically important SV systems nor do they completely span the space of our taxonomy, but they do serve as concrete reference points for mapping the taxonomy into familiar examples.

4.1. Sorting Out Sorting

The first major SV work of the 1980s was the motion picture Sorting Out Sorting (SOS) [23], produced at the University of Toronto. This 30-minute, colour, narrated educational film uses animated computer graphics to explain how nine different sorting algorithms manipulate their data.

SOS begins by introducing the concept of sorting data and goes on to explain three insertion sort algorithms (linear insertion, binary insertion and shell sort), followed by three exchange sort algorithms (bubble sort, shaker sort and quicksort) and finishes with three selection sort algorithms (straight selection, tree selection and heap sort). At the conclusion, it shows a race of all nine algorithms running in parallel on large data sets. The film introduces each algorithm with an example showing how it affects on the order of 10 to 20 data items. The data items are typically represented by blue or green rectangles with each having a different height. When one or more data items are being considered by the algorithm, they are highlighted and when an element has reached its final (sorted) position it turns red. At the end of each section, the film compares each set of three algorithms running in parallel on large data sets.

After explaining all nine algorithms, SOS addresses the efficiency of each by comparing the $O(n^2)$ sorts with the $O(n \log(n))$ sorts. It illustrates the speed differences by showing each algorithm working on a data set of 2500 random elements. In this representation, the data are represented by tiny yellow dots on a graph, where the horizontal coordinate represents the element's current position in the data set and the vertical coordinate indicates the value of each element. When an element reaches its final (sorted) position along the main diagonal it turns red. Thus, unsorted data appear as a yellow cloud and sorted data appear as a diagonal red line. In the race of the nine algorithms (each running in parallel on processors of equal speed), quicksort and tree selection sort complete in less than a minute while the bubble sort takes nearly an hour (which is obviously not shown to completion). Figure 2 shows a portion of the race.

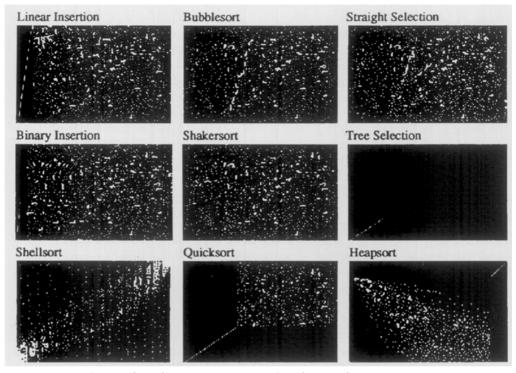


Figure 2. A single frame from the Sorting Out Sorting algorithm race (black and white version of colour original)

Today, SOS is sold commercially as a videotape and it is used widely for introductory computer science teaching at the secondary and post-secondary levels, although no formal empirical evaluations of its effectiveness have been performed.

4.2. BALSA

The first major interactive SV system was the Brown University Algorithm Simulator and Animator (BALSA) [31, 34, 35]. This pioneering work has become the benchmark against which all subsequent SV systems have been measured. BALSA was more than a research prototype: it evolved from a principled design and was in production use for years both as a teaching tool used by hundreds of undergraduates and as an aid to algorithm design and analysis [35].

BALSA was one of the earliest systems to take advantage of large-screen graphics and windowing-based personal workstations. Installed in the fall of 1983 on a set of 50 Apollo workstations in a purpose-built lecture theatre/laboratory, it allowed the instructor to give a running commentary on the prepared graphical animation running on each student's machine. Students could control these scripted animations (stop, start, speed control, replay, as well as standard window control, panning and zooming). Several of the animations could also be played backwards. The entire set of scripts was integrated with the textbook Algorithms [36] and BALSA was used by students in three undergraduate courses [37, 38].

BALSA itself was written in C but the algorithms that it animated were usually

coded in Pascal. It supported multiple simultaneous views of each running algorithm and it was the first system that could show algorithms racing with each other on the same display. The contents of each view window depended on what the visualizer had provided and could not be changed by the user. A code view was usually provided: it showed a pretty-printed listing of the current procedure with the current line highlighted. If another procedure was called then its window was stacked on top of the calling procedure. Views of data structures, however, were often far more enlightening and could range from the 'dots' or 'sticks' views of Sorting Out Sorting to complex graphs, trees or computational geometry abstractions. BALSA was able to display multiple algorithms running simultaneously as well as multiple views of the same data structure.

The BALSA visualizer built animations by starting with a standard Pascal implementation of an algorithm and annotating it with calls to BALSA's 'interesting event' manager at points where the code changed interesting data structures or entered/exited a subroutine. The visualizer could then build a view to respond to the event information by modifying an existing view from the BALSA library or by building a completely new view using the built-in graphic primitives. The final step would be to specify the input generator which provided valid input for the program. Users could run and manipulate the completed animation and record their actions in scripts which others could replay.

The initial versions of BALSA ran in black-and-white on Apollo workstations. Brown's subsequent version, Balsa-II [32, 34], ran in colour on Apple Macintosh personal computers and allowed rudimentary sounds to be associated with events. Synchronized multiple-algorithm displays which provide 'algorithm races' like those in Sorting Out Sorting are also within the scope of Balsa-II. Although no formal empirical evaluations were conducted, the authors reported on their experiences using BALSA in undergraduate teaching [37, 38]. Figure 3(a) shows a still from an algorithm race in Balsa-II while Figure 3(b) shows an image from the original BALSA with several view windows.

4.3. Zeus

The latest evolution of BALSA is Zeus [39], a system written for Modula-3 on DEC workstations. Like BALSA, Zeus supports multiple synchronized views and allows users to edit them. The user can change a data item's representation, once the animation is stopped, by text-editing, direct manipulation or invoking a function in the typescript window. All of the other views are updated following the change, and if the program continues it does so with the altered data. Figure 4 shows a snapshot of a Zeus session with several of the views. Zeus is also noteworthy for its object-oriented design, graphical specification of views and the fact that it is implemented in a multi-threaded, multi-processor environment, so it can easily animate parallel programs. Brown has also had considerable success with audio enhancements to Zeus using a MIDI synthesizer; his work with Hershberger [40] is an excellent introduction to the use of colour and sound in algorithm animations. The most recent work using Zeus has been a three-dimensional extension [41] which has examples illustrating uses of 3-D for encoding extra information. As it is a prototype, Zeus has seen limited use

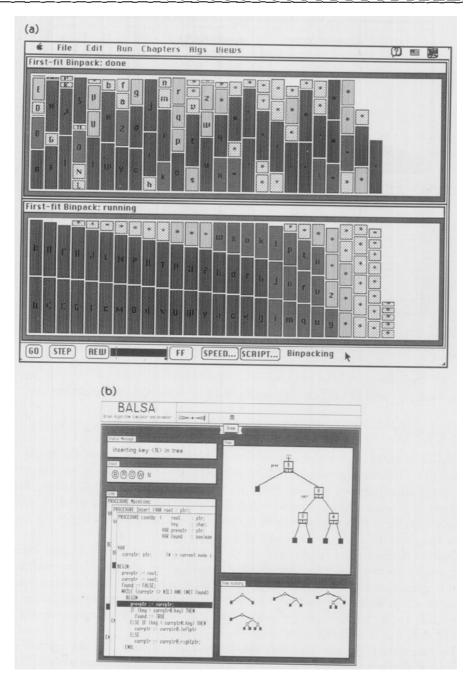


Figure 3. (a) A still from Balsa-II showing a race between two bin-packing programs (first-fit and first-fit decreasing). (b) A still from the original BALSA showing the code view, input, status message, current view of the tree data structure and a view of the tree history

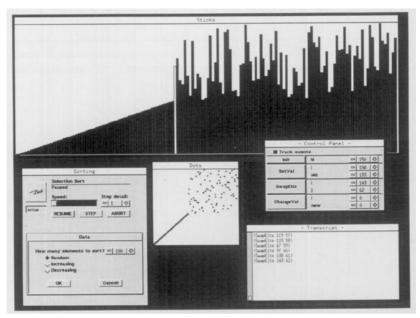


Figure 4. A still from Zeus showing the sticks, dots, transcript and control panel views for a sorting algorithm

outside the laboratory and no empirical evaluation has been performed, but it has been used as a tool for algorithm development by a number of researchers.

4.4. TANGO

TANGO [42, 43], also produced at Brown University, was built by Stasko on an algorithm animation framework which encompasses a new path-transition paradigm for easily incorporating smooth transitions into any algorithm animation. Most SV systems have used a simple erase-redraw technique for animating displays; TANGO allows visualizers to produce smooth cartoon-quality animation without the overhead of writing specific code for each step of a transition.

Stasko's framework is composed of three parts: defining the abstract operations and events in the program that drive the animation, designing the animation to simulate the abstractions and operations, and mapping the program's operations to the corresponding animation scenes. The first part involves inserting 'algorithm operation' calls in the source code, which can be done manually or with a special editor which does not modify the code itself.

The animation design part of the framework centres on the path-transition paradigm which introduces four abstract data types for defining transitions. These can define a trajectory (using an algebra of paths) or changes in size, colour or visibility. Stasko also built an 'example-based programming' tool [44] which can automatically produce the animation code from a user-demonstrated example of the animation.

The third component of the framework is the mapping from the actual program code and its execution to the animation. BALSA only allowed a one-to-one mapping between events in the program and the animation scenes, but Stasko uses a formal

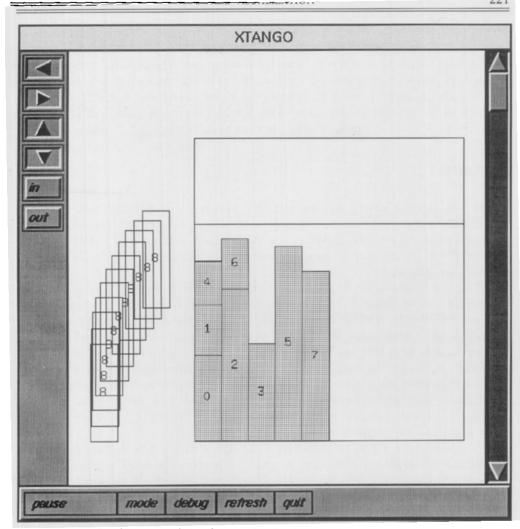


Figure 5. An overlayed image simulating the smooth animation in a TANGO solution to the bin-packing problem

framework that supports one-to-many, many-to-one and many-to-many mappings. Thus, the same animation components can be repeatedly referenced by many different algorithm operations within one program.

To animate a program in TANGO, the visualizer would first annotate the C source code with algorithm operation calls. Next, the animation scenes are designed, which are written as C functions that receive information from the driving program. Visualizers can make use of macro packages to create logical structures of objects using the four abstract data types. The final step is to write the animation control file which defines how algorithm operations map to the animation scenes. The animation is then ready to be run and the user is provided with rudimentary navigation controls for panning and zooming as well as pause, continue and speed control.

The original version of TANGO ran on BSD Unix workstations using a customized graphics package developed at Brown and provided silent two-dimensional colour animations of a wide variety of programs. The current version, called XTango [45], runs on most popular Unix workstations that can compile C and use the X11 Window System. It differs from most SV systems in that it is widely and easily available to the general public along with a large library of animated algorithms. Figure 5 shows a still image simulating the smooth animation.

4.5. ANIM

ANIM [46-48] is a simple but powerful SV system for producing both animated visualizations on a workstation (or simple terminal) as well as static snapshots ready for inclusion in documents. Developed at AT&T Bell Laboratories, ANIM follows the UNIX tool philosophy of having a simple generalized interface that is language and software independent.

ANIM is a 'post-mortem' system for making animations (movie) and still images (stills) from a script which is created as the program is run. Since the script is a set of plain text commands, ANIM is language-independent; any program can be annotated to output the commands. With only eight commands in total (four drawing commands: line, text, box and circle; and four control commands: view, click, erase and clear), it is easy to learn. Visualizers can get a visualization from a program simply by inserting some print (or print-to-file) statements at interesting points in the source code, and then compiling and running it. When the program has finished running, the resulting output script can be fed to stills for images to be incorporated into a document, or to movie for an interactive animation.

The authors chose a post-mortem technique rather than a 'live' system (where the visualization is displayed while the program is running) because it allowed rapid development using established Unix tools across a variety of architectures. The script can be viewed interactively on terminals of varying quality and the same script can be used to produce still images for documents. A post-mortem system can know the display space range that will be used throughout the visualization and can scale everything appropriately. A dozen lines of awk code allow the synchronization of different simultaneous views by merging a number of ANIM scripts to show an 'algorithm race'. Figure 6 shows the stills version of an algorithm race produced with such a script. Because the ANIM script language allows objects in the script to be named, it is easy to produce simple animations (since the re-drawing of an existing named object causes the old object to be erased). Since everything about the animation can be known in advance, it is possible for the user to have complete control of the animation speed and direction (forwards or backwards).

Although there has been no formal empirical evaluation, the authors report a number of practical applications from their users (ANIM is currently a limited-release research prototype). In giving a short lecture on sorting (for which Sorting Out Sorting was too long and covered some irrelevant algorithms), one author used ANIM to produce a 5-minute videotape covering five sorting algorithms. The sorting algorithms took two hours to write the 74 lines of awk required; a further 2 hours

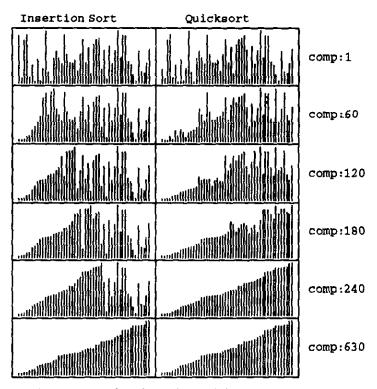


Figure 6. A snapshot of a synchronized algorithm race in ANIM

were spent setting up and shooting the video. Applications from other users included: a 3-D molecular modelling system, a 3-D stereo viewer on an SGI Iris workstation, parse trees of lambda calculus, numerical analysis visualizations, displays of simultaneous differential equations, the debugging of a matrix manipulation program, computational geometry abstractions, parallel algorithm visualization and dynamic statistical displays. The authors' conclusion is that a simple, easy to use and widely available animation system with a generalized interface can satisfy the needs of teaching, research and everyday computer programming.

4.6. Pascal Genie (Includes Amethyst)

Conventional textual debuggers have a distinct advantage over most SV systems in that they can be used to examine easily the contents of a variable without the effort involved in constructing a visualization. Automatic SV addresses this point by providing visualizations of arbitrary programs with minimal effort on the part of the visualizer or user. Myers's Incense prototype [49, 50], created at Xerox PARC, was the first SV system automatically to create graphical displays of program data structures. Myers and his colleagues at Carnegie-Mellon later created a production system called Amethyst [51] which was integrated with the MacGnome Pascal programming environment for Macintosh computers which is now known as Pascal Genie [52].

Incense ran on Xerox's Alto computer and took advantage of its mouse and bit-mapped display (both innovations in commercial systems at the time). It was written for Xerox's Mesa language, a strongly-typed language similar to Pascal, and intended for use by experienced programmers. The default displays (composed of text, boxes, lines, splines and arrows) included all of the basic Mesa data types, as well as records, arrays and pointers. The prototype read the symbol tables from the Mesa compiler and automatically produced a 'natural' graphical abstraction of program variables. This abstraction came from a built-in default for the data type and could be

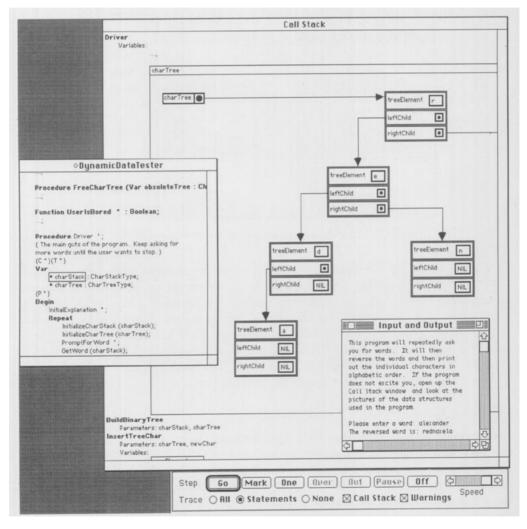


Figure 7. A snapshot of the Pascal Genie running a program. The source-code window (left) shows the currently executing line highlighted with several procedure bodies elided (indicated by elipses, expanded by clicking on them). The large window in the background is the call stack showing all of the data on the stack. Some variables are elided completely, some are shown by their name only, and the charTree is shown fully expanded with an automatically-generated binary tree showing the data. The program's Input and Output appear in the window near the bottom right and the execution control panel appears at the bottom

customized. Incense provided a framework for programmers to define their own visualizations, but Myers speculated that creating the custom visualizations was often more difficult than the actual data-manipulation algorithms, so programmers were not likely to create them [49].

Several of the basic ideas from Incense were incorporated into Amethyst, which can display both static and animated representations of data structures for Pascal programs written by the user. Amethyst differs from Incense in that it was specifically designed for use by students and was built in an integrated environment which included facilities for automatic display management and animation. As with Incense, it provides default displays for each of the simple data types, although it uses a convention of showing each type in a characteristically-shaped box. Aggregate types shown in nested boxes, visualization of pointers and support for detail suppression have been implemented since the last report. Amethyst is integrated into the MacGnome structured programming environment which is sold commercially as the Pascal Genie. The Pascal Genie has been used in secondary schools and undergraduate courses for several years and is in use daily by hundreds of students around the world. Emprical evaluations [53] suggest that using the entire environment (including, but not restricted to, Amethyst) is more effective than conventional program editing. Figure 7 shows a static view from the Pascal Genie environment.

4.7. UWPI

The University of Washington Program Illustrator (UWPI) [54] went one step further than both Pascal Genie and the conventional textual debuggers: it automatically provided visualizations for the high-level abstract data structures designed by the programmer, as opposed to the concrete data structures which appear in the implemented code.

UWPI [55] was implemented using 14 000 lines of Allegro Common Lisp on a DECstation 3100 running the X11 windowing system. It was also made publicly available by ftp and we found it relatively easy to port it to Harlequin LispWorks on a Sun SparcStation. It could animate abstract data structures in programs written in a subset of Pascal which included block structure, structured control statements, constant declarations, integers and one- or two-dimensional arrays. Users could simply feed the source code for their Pascal-ish program to UWPI which would analyse it and run the program through its interpreter. As the program ran, a pretty-printed version of the source code was shown with the current line highlighted. A data illustration window showed abstract views of the data structures according to the (previous) analysis. Users could manually pause and continue the program at any time by clicking on screen buttons, and could speed up or slow down the execution in 50-ms increments. The mouse-sensitive source code view allowed users to mark breakpoints in the code on variables (read or write) or statements (execute). Figure 8 shows a still from an animation of an abstraction for a breadth-first search.

The heart of UWPI was its 'inferencer' which analysed each of the data structures in the source code and suggested a number of plausible abstractions for each. Each of these was assigned a weight based on the closeness of the fit between the permitted operations on the abstraction and the operations found in the code. The abstraction with the highest final weight was chosen for each data structure in the code and the

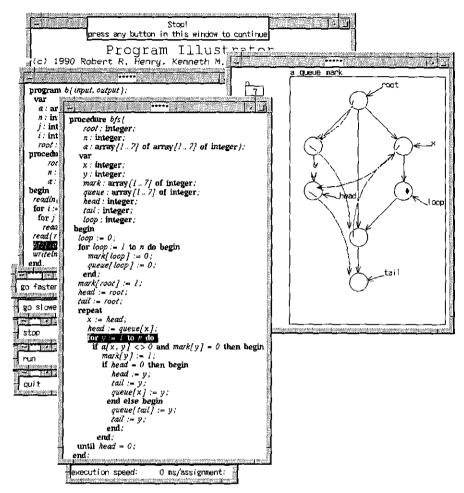


Figure 8. A snapshot of abstract data type animation of a Breadth First Search in UWPI. The currently executing line is highlighted in the source window with basic execution controls appearing on the left side. The abstract data-type animation at the right shows the simple counter, n, along with the graph being searched (layout and abstraction were automatically selected by UWPI). The graph is annotated with the pointer variables used in the search

results were passed on to the 'layout strategist'. The layout strategist knew which graphical representation to use for each data abstraction and it chose the largest and most complex one to use as the backdrop while the program was running, with all other abstractions moving on top.

In the released prototype, the authors implemented abstract representations for Booleans, pointers, indices, magnitude variables, enumerations, relations (or digraphs), queues and general linked lists. These allowed for reasonably effective visualizations of array sorting and graph search algorithms. UWPI was not designed to provide any kind of screen management nor was it intended to deal with large programs. The authors did not provide tools for experimenting with new graphical abstractions and most of the visualizations were borrowed from other popular SV

systems. No empricial evaluation of the system or its visualizations were reported and UWPI is not being developed further.

Although UWPI appears to have high-level knowledge of the program in that it showed graphical abstractions of data structures without any help from the programmer, it does not have a deep understanding since it did not know what the program was doing; it only gathered shallow information about how data structures were used and matched against a rule base. The authors note that their knowledge acquisition method was informal in that they simply began with an approximation of a rule and fine-tuned it until it worked for a particular example. Nonetheless, UWPI is the best example to date of automatic SV with any kind of applied intelligence.

4.8. SEE

One of the easiest yet rarely used methods of automatic SV is the pretty-printing of source code. When source listings are pretty-printed they rarely make use of the wide typographic vocabulary available in even the most rudimentary word-processing software (such as introductory textbooks which only show keywords in bold). The SEE visual compiler prototype [4, 56] is a fully-automatic and customizable SV system which makes extensive use of human factors research in typography to produce high-quality, hard-copy listings of C programs.

The model used by SEE's designers was to think of a printed computer program listing as a book or technical manual, with a table of contents, chapters and indices. Since SEE is a compile-time rather than run-time SV system, all of the information contained in the visualization is static and does not relate to any particular execution of the code. In a typical SEE listing of a C program (with the default parameters), functions appear in a large bold font with a thick line running across the page in the same way that a major section heading in a chapter of a book might appear. Parameters and local variables appear in a neat two-column (type-variable) list under the function header and all C source code is printed in a sans-serif font. Multi-line comments appear in a serif font on a grey background while in-line comments appear in a smaller serif font in the margin beside the line that they annotate. Figure 9 shows a typical function with comments.

Several of the ASCII characters in the C source code were changed by SEE in the printed output. The braces {} used to denote scope were removed (with one exception) and replaced with systemic indentation to encode visual hierarchy. The -> pointer dereference and record element retrieval was replaced by a simple arrow ->. Some of the more indistinguishable operators had their legibility enhanced by using superscripting or a larger font to make them clearer and each operator and keyword had its horizontal spacing individually adjusted to improve clarity.

In their example 'Program Book', the authors presented several views of the source code for an implementation of Eliza [57] that was produced 'almost totally automatically' (except for minor fix-ups relating to page breaks, headers and footnotes). Two tables of contents were given: the first gave the 'program meta text' showing user documentation, overviews of the code, profiles, the main module names, programmer documentation and various indices to the code; the second was for the 'program text' and showed each file, function and the data objects it contained with a page reference for each. One of the code overviews included a 'program map' which

```
explorer:/green/flaps/see/neliza/book
                                   interact.c (6 of 12)
                                                           20 Apr 17:19
                                                                                  Revision 3.1
                                                                                                          Page E33 / 189
                                                                                  Fliza
                                                                                                          Printed 2 Jun 12:08
Dynamic Graphics Project
                                   patrespond()
University of Toronto, with Aaron Marcus and Associates
Berkeley
                                         if (debug)
                                               printf("trying pattern '%s'\n", thispat + pat);
                                         strcpy(buf, sentence);
                                         if (!match(buf, thispat -- pat, parts))
                                               return (S_NEXTP);
                                         return (respond(thispat, parts, 0));
0 for print at once.
                                     respond - handle the response for a matched pattern.
                                   STATUS
                                   respond(thispat, parts, ismem)
                                         struct pattern
                                                                                  *thispat;
NULL-terminated.
                                         char
                                                                                  **parts;
                                                                                  ismem;
                                         int
For the memory?
                                                                                  *ŧ:
Current response.
                                         register struct text
                                         register int
                                                                                  Ì;
                                         'Find the "next" response.
                                         for (i = 0 , t = thispat → resps; t != NULL && i != thispat → nextresp;
                                              t = t \rightarrow tnext i^{++}
NULLBODY
Ran off the end.
                                         if (t ≈= NULL)
                                              thispat \rightarrow nextresp = 0;
                                              t = thispat + resps;
                                         thispat → nextresp++;
                                         Check for go-to-next-keyword response.
                                         if (STREO(t → chars, "+"))
                                               if (debug)
                                                    printf("---newkey\n");
                                               return (S_NEXTK);
                                         if (t \rightarrow chars[0] == '>')
                                               return (punt(t → chars, parts));
                                               memorize(format(t - chars, parts));
                                               return (S_NEXTK);
                                         Not memory, so just format and print the response.
                                         putline(format(t + chars, parts));
                                         return (S_DONE);
```

debug + 21 sentence + 28

Figure 9. A sample fragment of a formatted C function in SEE

showed each page of code scaled down to postage-stamp size with a label in a readable font beside each function declaration, thus allowing the programmer to navigate by the 'shape' of the functions. The book representation also provided a simple cross-reference in the footer of each page pointing to where global variables used on that page were originally defined.

Two other pretty-printing systems are the vgrind utility [29], which is part of the Berkeley Unix distribution, and WEB [30] which is part of the T_EX text mark-up language distribution. The vgrind utility is language-independent but it simply shows program keywords in bold, comments in italics and function names in the margin. With WEB, Pascal programs and their documentation are integrated in one T_EX document, which means that existing non-WEB programs cannot be visualized automatically and which requires programmers to edit marked-up code. This could be avoided by implementing a SEE-like pretty-printer in a WYSIWYG editor on a workstation. A prototype of this for the Turing language was developed by Small [58], but we are surprised that this technology has not been exploited given the speed (and idleness) of conventional desktop workstations. SEE itself is no longer being developed.

The authors subjected SEE to a modest empirical evaluation which revealed some improvement in comprehension (compared with conventional plain listings) among novices for a 200-line program. However, the same study also revealed a slight decrease in comprehension for a similar program which was much more 'dense' and had a large number of embedded comments. Although the evaluation is ambiguous, we believe that clearer presentation of source code is certainly an important part of SV.

4.9. TPM

Although much of the visible SV work has dealt with imperative languages, one of the most successful automatic systems is used as a graphical tracer and debugger for the declarative language Prolog. The Transparent Prolog Machine (TPM) [59-61], developed at the U.K.'s Open University, was first announced in 1986, but has since undergone considerable development and is now available in both commercial and public-domain versions. It uses an annotated tree with extensive navigation and trace facilities to explain the execution of both large and small Prolog programs to expert and novice programmers alike.

TPM itself is written in Prolog and, although the original version was developed on Apollo workstations, implementations now exist for a variety of 680XX-based and 80X86-based workstations [62, 63] and the most recent version runs on the Macintosh [64]. TPM provides two basic views for the user: the coarse-grained view (CGV) and the fine-grained view (AORTA diagram). The CGV is based on a traditional and/or tree; it shows the execution space of the entire program with nodes representing goals. Each node is coloured to indicate the current state of the attempted goal (pending, succeeded, failed or initially succeeded but failed on backtracking). The trees for non-trivial programs are usually too large to fit on one screen, in which case traditional window-scrolling techniques must be used. TPM also provides a very small-scale version of the diagram with a 'you are here' marker for tree-wide navigation on large programs. Squares are used to represent user-defined

code, whereas circles are used to depict system primitives. The user may also compress selected nodes to elide uninteresting subtrees, which are represented by triangles.

The fine-grained view allows the user to zoom in on a particular node to get details of data flow, such as variable instantiation. This view is called an AORTA diagram (for 'And/OR Tree, Augmented'); it shows the and/or tree hierarchy for some subtree with each goal node represented by a box divided by a horizontal line with a number of small vertical lines hanging off the bottom to indicate the goal's clauses (clause branches). The top of the box indicates the current status of the goal (a question-mark indicates that it is pending, a check-mark indicates success, a cross indicates failure and a crossed check-mark indicates initial success followed by failure on backtracking), while the bottom of the box contains the number of the clause currently being considered. The clause branches indicate the status of each clause in the current goal and if there were prior invocations of the goal then it is shown with a shadow. The current goal and its matching clause are shown in text beside each AORTA node with arrows showing input and output unification of variables and small 'lozenges' to show variable instantiations that have come from elsewhere. Figure 10 shows an example of the CGV and basic control panel while Figure 11 shows an AORTA view of a single goal node from the classic definition of 'append'.

TPM can run in live or post-mortem mode, which the advantage of the latter being that the entire tree is known so it can be laid out optimally (in live mode the user can request a redrawing at any time). The user interface provides standard 'video replay panel' buttons for rewinding the trace to the beginning or end, playing, fast-forwarding or single-stepping forward or reverse. Some degree of customization is provided to allow users to filter the goal tree and specify how a node and its links should appear.

In order to show that TPM is suitable for debugging large programs, the authors ran it on their own in-house knowledge-engineering toolkit called MIKE [65, 66],

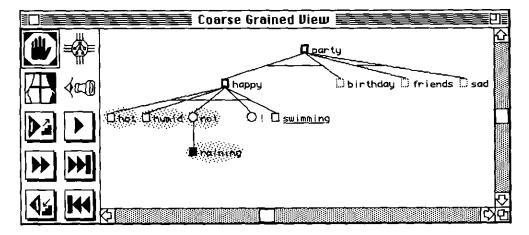


Figure 10. TPM's coarse-grained view of the query: party (Who), paused in the middle of a replay. The tool palette on the left includes six video replay buttons, and tools for pausing, refocusing, accessing other windows and zooming

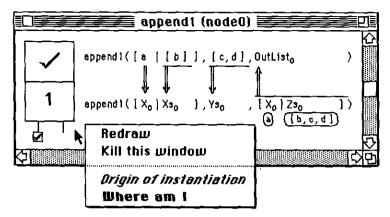


Figure 11. TPM's fine-grained (AORTA) view of a node showing variable instantiation given the successful completion of the goal append ([a, b], [c, d], OutList)

which consists of over 2200 lines of codes. In their example debugging session (using post-mortem mode), the entire execution space of the program was shown and both CGV and AORTA views were used to locate a bug successfully, thus suggesting that TPM might be useful to experienced Prolog programmers working on large programs. TPM and the AORTA notation have also been used extensively by students in the Open University's distance teaching programme [67], as well as interactive classroom teaching. No formal empirical studies have been performed on TPM, but Open University examiners have found that students spontaneously use AORTA diagrams in their ungraded 'scratch' work when writing their course exam, which suggests that they find the notation helpful.

4.10. Payane

Traditional SV systems have dealt with sequential programming languages, but recent work in high-speed computing has concentrated on parallel and massively parallel architectures. Programming and debugging in a parallel language can be much more complex than in sequential programming because of the greater number of computational elements interacting and the non-deterministic way in which a parallel program can execute. Several researchers have noted that concurrent programming is an excellent domain for SV because of the large amount of highly dynamic information present in a concurrent computation. Researchers at Washington University (St Louis) have developed a system called Pavane [68] which is designed to provide declarative three-dimensional visualizations of concurrent programs written in Swarm [69], with recent extensions allowing visualization of C programs.

Pavane was implemented in five parts: a parser which translates Swarm programs and their visualizations into an intermediate language (originally Prolog, but the most recent version uses C), a run-time package for the execution of compiled Swarm, a library of routines that is used when visualizing C programs, a second run-time package for the execution of compiled visualizations which produces the animation trace and a viewing program which renders the visualization and provides the user interface.

All these components are implemented in C and run under Unix; the viewing program runs on an SGI Personal Iris. A visualization consists of an underlying computation (either Swarm or C), a visualization computation (compiled visualization rules) and a viewing computation, all of which can communicate over Ethernet. In principle, this division allows any kind of underlying computation (sequential or concurrent, from any architecture) to supply information about its state changes to the visualization computation. The viewing program allows the user to stop, continue and step through the animation as well as rotate it in three-dimensions and zoom in and out.

Visualizations in Pavane are specified in a declarative style [70], in which the visualizer defines (declares) a transformation between the state of the computation and the final images. In the most simple case such a transformation may consist only of the declaration of a number of graphical objects whose parameters can be changed by program operations. But Pavane also provides much more powerful abstraction capabilities. In Pavane, the transformation is expressed as a series of mappings between spaces (collections of tuples), with each mapping composed of one or more rules. A rule specifies a relationship between two spaces—for example: 'For every tuple value (i, j, v) in the rule's input space, there is a tuple box (corner = [i, j, 0], xsize = 1, ysize = 1, zsize = v) in the output space'.

The declarative style stands in contrast to the imperative style of the BALSA 'interesting events' method where calls to visualization routines are inserted near 'interesting' code. In an interpreted declarative system, if the computation's interpreter is instrumented with 'probes' then there is no need to modify the source code. This can also be done in compiled languages by having the compiler automatically insert calls in the code, but this does change the execution of the program even though the source code that the user and visualizer see is untouched. This issue can be important in a parallel program where the execution is non-deterministic since invasive visualization code can change the outcome of a computation.

In addition to using this declarative specification technique, Pavane's authors also have a sound methodological foundation for choosing which visualizations they specify. They assume that the properties of a program which are necessary to verify its correctness are also properties which should be visualized, and they often refer to the first stage of visualization as the proof mapping. This mapping isolates the components of interest and helps decide how the components will be abstracted.

In their solution to the diffusing computations problem, the authors use one of the key invariants in the correctness proof to decide the basic layout of the visualization. This problem describes a number of active and inactive processes which communicate with each other and an external 'environment'. The invariant states that the parent information for active processes defines a directed tree rooted at the environment, so the authors chose to represent the graph-theoretic tree geometrically and use it as a basis for the visualization. Nodes represent processes and edges show connectivity. The tree has a given planar layout, but since the distance from each node to the root is important in the proof, this is encoded in the visualization as the depth from the viewer, thus making the tree three-dimensional.

The remaining important elements in the proof mapping are whether or not a process is active or inactive, which is encoded as a colour change from green to red,

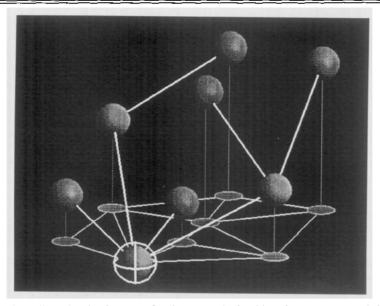


Figure 12. A three-dimensional animation of a shortest-path algorithm showing computed distances and paths from a particular node (marked with circles). The algorithm is operating on the depicted planar graph. Currently-known paths and distances are shown by the lines and spheres above the graph. Colours represent the status of a node in the computation, either scanned (green) or unscanned (red). This visualization attempts to capture the program invariant, 'The currently-computed distance of a node is the length of the shortest path all of whose internal nodes are scanned'. (Black and white still version taken from colour image)

and whether or not a message is being passed, which is encoded as a line growing from one node to another. The authors have published a videotape showing this animation [71] as well as a more recent videotape showing a wide variety of three-dimensional visualizations [72]. Figure 12 shows a still image from a graph-searching algorithm on this tape.

Pavane is an active research prototype and, although it has not undergone empirical evaluation, the visualizations presented are a compelling indication of the power of three-dimensional colour animations to aid in the understanding of both sequential and concurrent programs.

4.11. LogoMedia

Although several researchers have experimented with the use of sound to enhance the understanding of software, few have devoted serious effort to providing a usable interface for adding audio to a visualization. LogoMedia [73–75] is a prototype Logo programming environment developed by DiGiano at the University of Toronto, which allows programmers to associate non-speech audio with program events while the code is being developed. The interface is specifically designed for specifying visualization events with sound and it provides a number of 'smart' defaults for monitoring variables or control flow.

LogoMedia is based on an earlier prototype, LOGOMotion [76, 77], which provided extensions to the Logo language for non-invasively associating special animation procedures with program events. LogoMedia uses a similar technique, but the focus of

the current implementation is visualization using sound (or auralization as some have called it). LogoMedia is implemented as three distinct components: the Logo interpreter written in the C programming language, the LogoMedia interface and audio components written in C⁺⁺ and the visualization-class libraries written in Logo. It runs on an Apple Macintosh computer connected to a MIDI synthesizer or sampler through the Apple MIDI Manager. Although the highest-quality sounds can only be produced from an external MIDI device, rudimentary audio playback can be achieved using an internal MIDI sound generator which uses the Macintosh speaker.

LogoMedia uses probes to specify visualizations. Probes have an action which is the collection of external commands to execute and a trigger which determines just when during execution the action takes place. LogoMedia supports two types of probes: control probes and data probes. LogoMedia programmers use a special editor to annotate their software by connecting control probes to lines of code which trigger sound commands when execution reaches their associated lines. Data probes can be associated with arbitrary Logo expressions, such that changes to the expressions trigger sound commands as well. Sound commands can turn on synthesized musical instruments, play back sound samples or make adjustments to a sound's pitch or volume. Such audio probes cause subsequent runs of a program to generate and manipulate sounds which can aid in the comprehension and analysis of the program's behaviour.

Figure 13 shows the LogoMedia editor window. Control probes can be attached to a line of code by selecting the line in the editor window and then choosing a probe from a special set of menus that are part of every LogoMedia document. Data probes can also be connected to Logo expressions using a similar graphical interface. The programmer enters an expression in the Probe Sheet window shown in Figure 14, then chooses a probe to be triggered whenever that expression changes. The four icons correspond to different types of feedback which probes can generate in response to an executing program. From left to right these are: the audio probe for making sounds based on program events, the graphics probe for assisting in animation, the text probe for printing the messages and the values of program data, and the generic probe

Figure 13. When the recursive procedure flakeside is executed, a piano sound whose pitch is mapped to the depth of recursion will be heard at the start of each procedure call

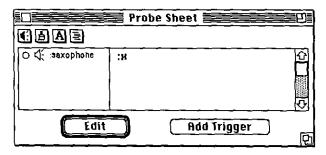


Figure 14. Assigning a saxophone sound corresponding in pitch to the value of x. The sound is heard whenever the variable changes. The circle icon indicates that properties of the saxophone instrument will be changed each time the probe action is triggered. By default, the value of the trigger expression is used to calculate a new pitch. By double-clicking on the probe, the user can specify a different instrument or change the mapping

for specifying arbitrary Logo commands. Generic probes can be used to specify complex audio visualizations through MIDI primitives added to the Logo language or to call sophisticated visualization procedures defined elsewhere. In the current implementation only the audio and generic probes are fully functioning.

DiGiano's evaluation of the effectiveness of sounds in portraying program behaviour and the appropriateness of the LogoMedia interface involved three subjects in a 7-hour observational study. Subjects were introduced to the LogoMedia audio probing techniques and then were asked to compose a new program and identify and correct four bugs in another program. After only 2 hours of training, all three subjects were able to use sound in various ways to locate problems in their code and verify corrections. Subjects were observed using the audio tools to test coverage, monitor the call stack, identify infinite loops and listen to one aspect of program data while another was changing on the screen. It is clear that more research and evaluation are needed in the use of audio to communicate complex information, but these results suggest that sound can be a significant aid to comprehension.

4.12. CenterLine ObjectCenter (Formerly Saber-C++)

Commercial programming environments have been relatively slow to take advantage of the workstation interface enhancements of the 1980s. The traditional tools employed by programmers trying to understand software, aside from comments and documentation, are program listings and cross-references. Those requiring a deeper understanding might employ a source-level debugger, such as Unix's dbx. The original textual version of dbx has a command-line interface with the ability to list sections of source code, single or multiple-step through a running program, set breakpoints and print the value of simple variables. By the late 1980s this kind of functionality had been dressed up with a conventional window interface where buttons could be used instead of line commands and separate windows could be devoted to showing the current source code and the values of any variables of interest. Many of the conventional programming environments in use today, such as Borland's Turbo C on IBM PCs or SunPro's SPARCworks on the Sun SPARCstation, use the same kind of variation on dbx. The ObjectCenter C and C++ (formerly Saber-C++)

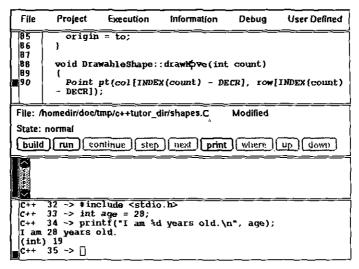


Figure 15. ObjectCenter's main window showing (from top to bottom) the menu bar, source browsing/editing window, main control button panel, warning/error message area and the workspace (interpreter/shell)

programming environment [78] extends dbx's functionality slightly and makes some use of graphics to convey information and thus qualifies as a kind of SV.

Unlike conventional debuggers and tracers which really only provide run-time information about programs, ObjectCenter can also provide static compile-time information about the source code at any time. Using the source-code browsing window (see Figure 15), which doubles as a basic mouse-based editor, users can select fragments of source code and invoke a menu command to get a pop-up window showing all of the functions that could be called if that code were to be executed. Similarly, the definition of any symbol can also be shown in a pop-up window. When a variable or function is selected a cross-reference browser can be invoked to show a graph of the selected object indicating all the places that the object is referenced and all of the functions and global variables that it references. Figure 16 shows the cross-reference graph for the function bounce in the class DrawableShape. The user can then select any of the objects in this graph and show a new cross-reference with the selected object as the focus. A similar interface is provided for browsing the class hierarchy showing base and derived classes as well as member functions and data

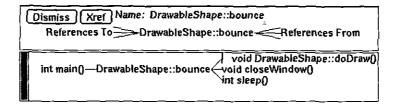


Figure 16. The ObjectCenter cross-reference browser. The graph indicates that the selected function DrawableShape::bounce is only called from main while it calls the virtual function DrawableShape::doDraw, and the functions closeWindow and sleep

members. ObjectCenter's run-time environment has a distinct advantage over conventional debuggers in that it provides a C++ interpreter built in, much like the Lisp Listener. This allows the user to modify global variables or call functions at any time by simply typing commands and having them 'executed' immediately, thus allowing for more experimentation without the overhead of re-compiling, linking and loading.

The run-time environment provides all of the breakpointing, stepping and display functionality of dox as well as the ability to trace the currently executing line in the source-code window, much like BALSA did (although it only shows the currently executing line as opposed to the stack of pending returned calls). As with the other conventional debugging tools, ObjectCenter can only display the basic C data types (int, char, float and pointers) in its data views, although it does display structs (records) with their programmer-defined field names. As with the compile-time information, when the running program is stopped at a breakpoint users can select variables and get a pop-up window showing their current value (which they can edit if they wish). One distinct advantage of ObjectCenter over its conventional counterparts is its ability to deal with pointers. Conventional debuggers usually show a hexadecimal number (representing a location in memory) when asked to print a variable representing a pointer, but ObjectCenter displays a small button beside each pointer in a data display. If the user clicks on the button then a line connects the pointer to a new window showing the contents of the object pointed to. Figure 17 shows a simple linked list which ObjectCenter has displayed by recursively following the pointer to the end of the list.

All of the information provided by ObjectCenter about the user's program can be obtained by the older text-based tools. Cross-referencers, tag programs and editors have been able to supply this kind of information in printed lists for many years, but the ability to see a cross-reference graph and to look up quickly or follow function calls and variables at a mouse click (as opposed to typing commands and loading new files) represents a tremendous speed-up in information retrieval and a decrease on the

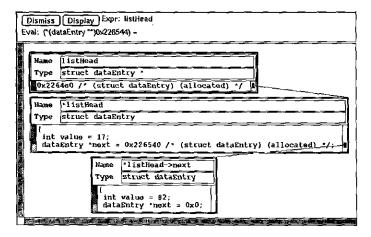


Figure 17. The ObjectCenter data browser showing the contents of a simple linked list. The user can click on the button that appears next to any pointer variable to get the next entry in the list or the browser can recursively follow all pointers until a null pointer is reached

cognitive load of the programmer. Even though the simple data displays pale in comparison to those in Pascal Genie, the ability to browse quickly the data space and follow pointers at the press of a button gives this kind of visualization a distinct advantage over conventional methods.

5. Deriving the Basic Categories

Previous taxonomies of SV have not provided a principled basis for their choices of categories, instead relying on common characteristics observed and deemed by their authors to be important. This is a common beginning for a taxonomy in any field, but, as SV becomes more mature and a wider variety of systems is implemented, it is clear that a more systematic approach should be attempted. In this section we describe the method that we used to derive the top-level categories in our hierarchical taxonomy, while in the next section we fill out the hierarchy beneath each category in an attempt to describe as completely as we can the characteristics of systems observed to date.

Any piece of computer software can be modelled as a black box which produces some output data based on the particular input data supplied to it. Typically, the output feeds back through the user, who considers it and bases the next set of input upon it, as shown in Figure 18. The input data can be multimodal: it can consist of files, typed commands, gestures, sound or speech input. The input data can be temporally static or dynamic in nature. The black box encloses a set of arbitrarily complex algorithms, which for compiled languages are represented as machine-level instructions running on a specific hardware architecture. Conceptually, however, the black box consists of the high-level algorithms and data structures originally conceived by the programmer. The output data can also be multimodal and temporally dynamic. The user can interact with the input and output data infrequently, as is the case with batch processing of scientific data, or on a continuous basis, as is the case with highly-interactive drawing applications.

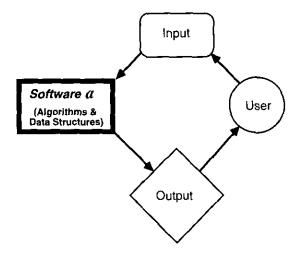


Figure 18. General model of computer software

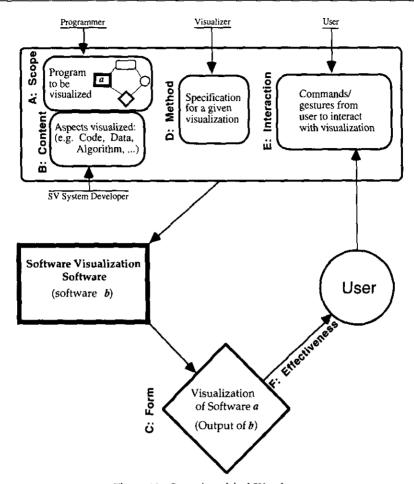


Figure 19. General model of SV software

This simple but complete model provides a conceptual basis for defining a structure for characterizing SV systems, since the SV software itself (and the software it is visualizing) can be described by this model. As there are four parties providing input to any software visualization (the programmer, SV system developer, visualizer and user), we refine the model to show how each party provides a distinct part of the input to a visualization. Consider a particular piece of software, a, which is visualized by a given software visualization system, b. As shown in Figure 19, a, its input and its output, comprise only one part, albeit an important one, of the input data to the SV system b. The SV system will only be able to visualize certain aspects of the program and its I/O data, hence the second box below the program. Another key component of the input data is the actual specification of the visualization to be performed by b on a. Finally, it is reasonable to expect that there may be some interaction with the user during the visualization process. These four components, representing the input from all parties involved, together characterize the complete input data set to b.

This analysis suggests the top-level categories of our taxonomy, which appear in

Figure 19 as vertical labels. The first category, A: Scope, describes the range of software that can be handled by a given SV system. Few systems (if any) are capable of visualizing a completely unrestricted set of programs, and this first category sets the basic limits of a SV system. Even though the complete information about a piece of software may be available, no known visualization system actually uses all of it. Our second category, B: Content, describes the subset of information from Scope that b really uses in constructing the visualization. The most important element from the point of view of the user is the output of the visualization, which is described in category C: Form. Since it is difficult to capture the essence of multimodal output in a structured taxonomy, this category concentrates on specifying the parameters and limitations which govern the output. The style in which a visualization is specified is an important distinction between systems since it affects their usability from the perspective of the visualizer. Category D: Method characterizes the important elements of the visualization specification. Category E: Interaction characterizes a system's interactivity by analysing the most important controls which are suitable for interactive manipulation.

Finally, while the SV system designer had a particular set of objectives in mind, there is no guarantee that the resulting system actually fulfills those objectives. Although our model does not indicate the designer's objectives nor how they affected the user, we believe that this is an important issue, otherwise the building of SV systems would have to be described as a black art with no measurement of a system's success. In order to evaluate the system's effectiveness objective empirical evidence is required and we propose a final category, F: Effectiveness, to provide a framework for such evidence.

6. Taxonomy Detail

Our derivation of the SV taxonomy yielded six distinct categories, as shown in Figure 20. We display these categories as a tree because they form the basis for our taxonomy, which, while extensive, is by no means 'complete'. As we mentioned earlier, a good taxonomy must be expandable to permit new discoveries to be catalogued and more detailed study in specific areas. We have identified a number of minor categories which make up each of the six major categories, and each of the minor categories may in turn have subcategories which may in turn have subcategories, and so on. Thus, the entire taxonomy may be described by a multi-level n-ary tree. We have designed the taxonomy structure so that new categories and subcategories may be added naturally without redesigning the entire tree.

Each category or subcategory that we use can be qualified for a particular SV system by a binary description (e.g. does the system support concurrent programs? yes/no), a range (e.g. to what degree does the system visualize data structures?) or a set of attributes (e.g. a subset of Pascal programs run under SunOS 4.2 on a Sun SparcStation running X11R5). For categories involving a range, we subjectively assign a ranking of lowest, below average, average, above average or highest (see Table 7). These rankings are derived from our understanding of a system based on the papers written about it and in most cases by our own use of the system or by consultation with its authors. Hand-designed visualizations, like those from BALSA/Zeus, TANGO, ANIM, Pavane and LogoMedia, were difficult to rank in many display-

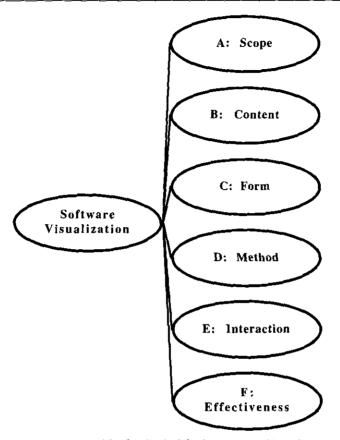


Figure 20. The first level of the SV taxonomy hierarchy

and interaction-related categories because their output is highly dependent on what the visualizer has designed for a particular program. For these systems, we have ranked them using their known capabilities as demonstrated by the example visualizations that we have seen. While it may be possible to achieve a certain effect with a particular system, we only consider it a feature if the system supports it in some way. If it requires a great deal of programming or workarounds to achieve then we would rank it low for that characteristic. When a characteristic was completely dependent on the choices of the visualizer we gave a rank of average.

Relative rankings are based on our understanding of the current state of SV technology. Although these assignments are somewhat arbitrary, we believe that they are useful for rough relative comparisons between the abilities of various systems, and we understand that an absolute ranking may change as technology improves (e.g. a system which is ranked high in intelligence today may be reassessed as medium in five years if AI technology improves markedly). A more formal ranking system is necessary for a fully-developed taxonomy, but this taxonomy should serve as a guide to areas of research in need of development. In the sections below we define each major category and its associated minor categories and subcategories and provide a relative ranking for each in Tables 1 through 6.

Table 1.	Evaluation of	of the 12	systems against	category A: Scope.
I able I.	LIVAIUALIULI	/I (IIC I &	materia agamat	category in occur.

				A	.1				A.2	
		A.1.1	A.1.2	A.1.	3 A.1.3.1		A,1.4 A.1.4.1		A.2.1	A.2.2
System Name	Generality	Hardware	Operating System	Language	Сопсипепсу	Applications	Specialty	Scalability	Program	Data Set
SOS	0				-	Sorting Algorithms	9 specific sorting algorithms	0	0	•
BALSA		Apollo, Mac	UNIX	Pascai	0	any in language	graph and array algorithms	0	0	•
Zeus	•	DEC	UNIX	Modula III	0	any in language	graph and array algorithms + others	0	0	•
TANGO	•	UNIX Workstns.	UNIX	c	0	any in language	data structures, especially animated	0	0	0
ANIM	•	any UNIX computer	UNIX	any	0	any	user defined visualizations	0	0	•
Pascal Genie	•	Mac	MacOS	Pascal, Obj. Pascal	0	any in language	basic compound data structures	0	0	Ō
UWPI	•	UNIX Workstns.	UNIX	Pascal subset	0	graph, list manipul	small set of sorting and graph algorithms	0	0	0
SEE	•	any UNIX computer	UNIX	С	0	any in language	large programs with many functions	•	•	•
ТРМ	•	Apollo, Sun, Mac	UNIX, MacOS	Prolog	0	any in language	sub-goal hierarchies, proof problems	•	•	•
Pavane	•	Mac+Iris	UNIX	Swarm, C	•	any in language	graph algorithms, inter- process comm. + others	0	0	•
LogoMedia	•	Мас	MacOS	Logo	0	any in language	monitoring data and control flow	0	0	0
ObjectCenter	•	Sun	UNIX	C, C++	0	any in language	linked lists, basic data struct. & code monitors	•	•	•

Table 2. Evaluation of the 12 systems against category B: Content.

			B.1					B.2			В	.3	1	B.4	
		В	1.1 B.1.1.1	В	J.2 B.1.2.1		В	.2.1 B.2.1.1	В	.2.2 B.2.2.1		B.3.1		B.4.1	B.4.2
System Name	Program	Code	Control Flow	Data	Data Flow	Algorithm	Instructions	Control Flow	Data	Data Flow	Fidelity and Completeness	Invasiveness	Data Gathering Time	Temporal Control Mapping	Visualization Generation Time
SOS	0	0	0	0	0	0	0	0	0	0	0				
BALSA	0	Ō	0	0	0	•	0	0	0	0	0		run-time	dynamic- dynamic	live
Zeus	0	0	0	0	0	0	0	0	0	0	0	•	run-time	dynamic- dynamic	live
TANGO	0	0	0	0	0	0	0	0	0	•	0		run-time	dynamic- dynamic	live
ANIM	0	O	0	0	0	0	0	0	0	0	0	•	run-time	various	post-mortem
Pascal Genie	0	0	0	•	0	0	0	0	0	0	•		compile- and run-time	dynamic- dynamic	live
UWPI	0	0	•	0	0	0	0	0	0	•	0		compile- and	dynamic- dynamic	live
SEE	0		0	0	O	0	0	Ō	0	0			compile-time		
ТРМ	0	0	0	0	0	0	0	0	0	0	•		run-time	dynamic- dynamic	live and post-mortem
Pavane	0	0	0	0	0	•	0	0	0	0	0	•	run-time	dynamic- dynamic	live
LogoMedia	•	0	•	0	0	0	0	0	0	0	0		run-time	dynamic- dynamic	live
ObjectCenter	0	0	0	0	0	0	0	0	0	0	•	•	compile- and	dynamic- dynamic	live

Table 3. Evaluation of the 12 systems against category C: Form.

	C.1									C.5
i		C.2.1	C.2.1.1	C.2.1.2	C.2.2	C.2.3		C.3.1		}
System Name	Medium	Graphical Vocabulary	Colour	Dimensions	Animation	Sound	Granularity	Elision	Multiple Views	Program Synchroniz.
SOS	16 mm film & VHS videotape	points, lines, enclosed shapes; position; colour, size;	0	0	0	0	0	0	0	•
BALSA	b & w/colour monitor	points, lines, enclosed shapes; position; colour, size, shape; plain text	0	0	0	0	0	0	•	•
Zeus	colour monitor, MIDI-audio	points, lines, enclosed shapes; position; colour, size, shape; plain text	0	•	0	0	0	0	•	•
TANGO	colour monitor	points, lines, enclosed shapes; position; colour, size, shape; plain text	0	0	•	0	0	0	0	0
ANIM	black & white monitor, paper	points, lines, enclosed shapes; position; size; plain text	0	0	0	0	0	0	0	•
Pascal Genie	black & white monitor	lines, enclosed shapes; position; size, shape; plain text	0	0	0	0	0	•	0	0
UWPI	black & white monitor	lines, enclosed shapes; position; size, shape; plain text	0	0	0	0	0	0	0	0
SEE	paper	lines; position; size, grey level, orientation; multi-font typographed text	0	0	O	0	•	0	0	0
TPM	black & white monitor	lines, enclosed shapes; position; size, shape, orientation, texture; plain text	0	0	0	0	0	0	0	0
Pavane	colour manitar	points, lines, enclosed shapes; position; colour, size, shape;	0	0	•	0	0	0	•	0
LogoMedia	colour monitor, MIDI-audio	points, lines, enclosed shapes; position; colour, size, shape; plain text	0	0	0	0	0	0	0	0
ObjectCenter	black & white monitor	points, lines, enclosed shapes; position;; plain text	0	0	0	0	0	0	0	0

Table 4. Evaluation of the 12 systems against category D: Method.

			D.1		D	.2	
		D.1.1		D.1.2]	D.2.1	D.2.2
	i			D.1.2.1	1		{
System Name	Visualization Specification Style	Intelligence	Tailorability	Customization Language	Connection Technique	Code Ignorance Allowance	System-Code Coupling
SOS	fixed		0				•
BALSA	library		0	interactive manipulation	instrumented	0	•
Zeus	library		•	interactive manipulation	instrumented	0	•
TANGO	library		0	procedural, interactive editor	annotated	0	0
ANIM	hand-coded		0	procedural	instrumented	0	0
Pascal Genie	automatic	0	0	interactive manipulation	probes	•	•
UWPI	automatic	0	0	interactive manipulation	parser, automatic annotation	•	•
SEE	automatic	0	0	command line	parser		0
TPM	automatic	0	0	interactive manipulation	probes	•	•
Pavane	hand-coded		0	declarative	probes	0	•
LogoMedia	hand-coded, library		0	procedural and interactive manip.	probes	0	•
ObjectCenter	automatic	0	0	interactive manipulation	parser, automatic annotation	0	0

	E.1			E.2_			E.3
			E.2.1		E.2.2.1	E.2.2.2	İ
System Name	Style	Navigation	Elision Control	Temporal Control	Direction	Speed	Scripting Facilities
SOS	forward-rewind tape	0	0	0	0	0	0
BALSA	buttons, menus, scripts; direct manip	0	0	•	•	•	•
Zeus	buttons, menus, scripts, direct manip	0	0	•	•	•	•
TANGO	buttons	0	0	0	0	0	0
ANIM	buttons	0	0	0	0	0	0
Pascal Genie	buttons, menus	0	•	0	0		0
UWPI	buttons	0	0	0	0	•	0
SEE	command line	0	0				
TPM	buttons, menus	0	0	0	0	0	0
Pavane	buttons	0	0	0	0	0	0
LogoMedia	buttons, menus	0	0	0	0	0	0
ObjectCenter	buttons, menus, command line	0	0	0	0	0	0

Table 5. Evaluation of the 12 systems against category E: Interaction.

All of these categories and subcategories together describe each SV system and the relative rankings indicate the strengths of each system in each of the areas. Because we see each system as a hybrid of many properties, it is not possible to 'pigeonhole' a system using this taxonomy (as, for example, is done in the taxonomy of living things where each creature has followed a distinct evolutionary path with a low degree of cross-mutation).

A: Scope

What is the range of programs that the SV system may take as input for visualization?

We see two major divisions of Scope information: generality and scalability. In Figure 21 we show a complete tree of all of the subcategories, described below, that we believe characterize the scope of an SV system. Table 1 summarizes the relative rankings for our 12 example systems against the Scope subcategories.

A.1. Generality

Can the system handle a generalized range of programs or does it display a fixed set of examples?

A generalized system can generate visualizations of arbitrary programs within a particular class while an example system displays a (possibly flexible) visualization of

	F.I	F.2	F.3	F.4
System Name	Purpose	Appropriateness and Clarity	Empirical Evaluation	Production Use
SOS	novice classroom demonstration	0	0	
BALSA	novice & expert demonstration and algorithm development		0	•
Zeus	novice & expert demonstration and algorithm development		0	0
TANGO	novice & expert algorithm development		0	0
ANIM	novice demonstration & expert algorithm development		0	0
Pascal Genie	novice debugging	0	0	•
UWPI	prototype, limited novice debugging	0	O	0
SEE	expert software engineering	0	0	O
TPM	novice & expert debugging	0	0	0
Pavane	novice & expert demonstration		0	0
LogoMedia	novice debugging		0	O
ObjectCenter	expert debugging, software engineering	0	0	•

Table 6. Evaluation of the 12 systems against category F: Effectiveness.

particular algorithm, system or set of existing programs. SOS is an example system, since its presentation is fixed on videotape, while the remaining systems are generalized to some degree. A generalized system will usually have some restrictions governing its capabilities:

- A.1.1. Hardware: what hardware does it run on?
- A.1.2. Operating System: what operating system is required to run it?
- A.1.3. Language: what programming language must user programs be written in?
 - A.1.3.1. Concurrency: if the programming language is capable of concurrency, can the SV system visualize the concurrent aspects?
- A.1.4. Applications: what are the restrictions on the kinds of user programs that can be visualized?
 - A.1.4.1. Specialty: what kinds of programs is it particularly good at visualizing (as opposed to simply capable of visualizing)?

The hardware platforms used by our example systems are split between Unix

Table 7. Explanation of symbols used in Tables 1 through 6.

Symbol:	0	0	0	0	•
Meaning:	Lowest or	Below	Average	Above	Highest or
<u> </u>	_ no	Average	f	Average	yes

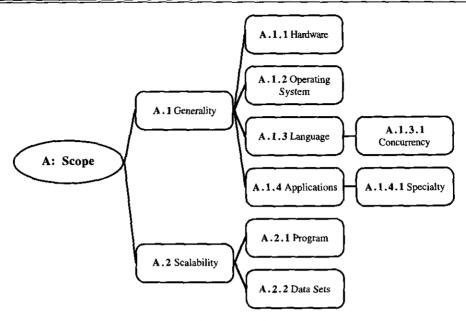


Figure 21. The subcategories of the Scope category

workstations and Macintoshes, probably due to the early availability of window-based graphics on these systems. Most of the systems, TPM, Pavane and LogoMedia excepted, only work on traditional imperative languages, while ANIM is noteworthy for its ability to work in any language. In other languages, Lieberman [79, 80] has produced interesting systems for visualizing Lisp, while London and Duisberg [81] did pioneering work with Smalltalk. Of the five systems that visualize languages with concurrency, only Pavane is truly designed to produce visualizations of concurrent elements. We have also built a prototype for a procedural language which shows process activity on a static representation of the module and procedure hierarchy, as well as individual views showing the status of each process [82, 83]. The MRE system of Brayshaw [84, 85] can visualize the logic language PARLOG, a parallel version of Prolog. For a detailed overview of concurrent SV systems, see Kraemer and Stasko's [86] survey.

Although most of the example systems are technically capable of producing visualizations of any application in the appropriate language, most have a particular specialty outside which the visualizations are not very informative. SOS specializes in exactly nine specific algorithms, while BALSA demonstrates some excellent visualizations of array and graph algorithms. Both Genie and ObjectCenter can show linked lists and trees well in their data views, while UWPI can only visualize simple data structures for a small set of graph-searching and array-sorting algorithms.

A.2. Scalability

To what degree does the system scale up to handle large examples? Scalability includes a combination of:

- A.2.1. Program: what is the largest program it can handle?
- A.2.2. Data Sets: what is the largest input data set it can handle?

This characteristic refers to fundamental limitations of the system only; see category F: Effectiveness to determine how well it presents visualizations of large programs. Most of the systems are technically capable of visualizing large programs and data sets, but only TPM and ObjectCenter have demonstrated examples. SOS visualizes large data sets, albeit fixed, while UWPI and LogoMedia, as prototypes, would not be expected to work on large programs.

B: Content

What subset of information about the software is visualized by the SV system?

Two of the most important parts of this information are the program, by which we mean the program source code, and the algorithm or 'high-level' description of the software. The differentiation between program and algorithm is subtle and can best be described from a user perspective: if the system is designed to educate the user about a general algorithm, it falls into the class of algorithm visualization. If, however, the system is teaching the user about one particular implementation of an algorithm, it is more likely program visualization. Signs that the line from algorithm visualization to program visualization has been crossed include displays of program code listings as opposed to higher-level abstract code diagrams, and labelled displays of the values of particular variables, as opposed to generic data displays. Some systems are sufficiently

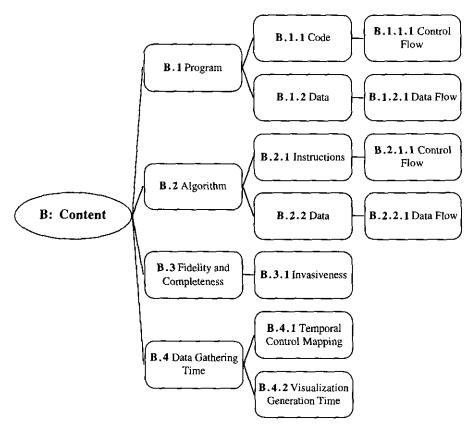


Figure 22. The subcategories of the Content category

flexible to produce both types of visualization, depending on what the user desires and specifies. Note that many authors may refer to their system as 'algorithm animation' when their visualization refers to program code or variables: this kind of system would be program, not algorithm, visualization in our taxonomy. The other two important parts of this category are *fidelity and completeness*, which characterize the accuracy of the visualization, and *data gathering time*, which describes the point at which information about the software is gathered. Figure 22 shows the complete tree for the subcategories described below while Table 2 summarizes the relative rankings of the example systems.

B.1. Program

To what degree does the system visualize the actual implemented program?

This category is further subdivided as follows:

- B.1.1. Code: to what degree does the system visualize the instructions in the program source code?
 - B.1.1.1. Control Flow: to what degree does the system visualize the flow of control in the program source code?
- B.1.2. Data: to what degree does the system visualize the data structures in the program source code?
 - B.1.2.1. Data Flow: to what degree does the system visualize the flow of data in the program source code?

While the distinctions between control flow and data flow become blurred when considering languages or architectures that use a message-passing paradigm, these characteristics are still generally applicable. Examples of code visualization include pretty-printed source code, structured diagrams and call trees. While the nature of the underlying code may be implicitly visualized by the way in which data evolves, this is not considered to be code visualization; a more concrete visualization of the code (either statically or in execution) is required. Program data visualization is characterized by drawings of compound data structures showing their contents in terms of simple data structures, while program data flow can be presented by data flow diagrams or live views of the call stack.

Table 2 shows that the debugging-type tools like Pascal Genie, SEE, TPM, LogoMedia and ObjectCenter fall firmly on the program visualization side with SEE being notable for its code visualization and Pascal Genie for its data visualization.

B.2. Algorithm

To what degree does the system visualize the high-level algorithm behind the software?

As with the program category, this can be further divided as:

- B.2.1. *Instructions*: to what degree does the system visualize the instructions in the algorithm?
 - B.2.1.1. Control Flow: to what degree does the system visualize the flow of control of the algorithm instructions?

- B.2.2. Data: to what degree does the system visualize the high-level data structures in the algorithm?
 - B.2.2.1. Data Flow: to what degree does the system visualize the flow of data in the algorithm?

As Table 2 shows, the higher-level display systems like SOS, BALSA, Zeus, TANGO, UWPI and Pavane are all firmly established on the algorithm side, although UWPI gets a lower ranking because its examples are not as closely hand-tuned as the others.

B.3. Fidelity and Completeness

Do the visual metaphors present the true and complete behaviour [87] of the underlying virtual machine?

Systems designed for software engineering may pose stronger demands than do pedagogical systems, since the latter may wish to take liberties in order to provide simpler, easier-to-understand visual explanations. Automatic systems like UWPI may produce a misleading abstraction for a data structure, while visualizers using a system like TANGO may only animate a particular part of an algorithm for expository purposes. As Table 2 shows, the highest fidelity and completeness values go to the systems that are tied closest to the program code while the hand-designed systems were difficult to rank because they depend so much on the individual visualizer.

 B.3.1. Invasiveness: if the system can be used to visualize concurrent applications, does its use disrupt the execution sequence of the program?

Disruptive behaviour is not desirable in a visualization system for concurrent applications, as the effect of activating the visualization system may change the relative execution rates of processes, thereby producing a different result. The system of Flinn and Cowan [88] used a bus monitor to avoid this, but all four of our example systems that handle concurrency are invasive.

B.4. Data Gathering Time

Is the data on which the visualization depends gathered at compile-time, at run-time, or both?

In general, systems which depend on data gathered solely at compile-time (such as SEE) are limited to visualizing the program code and its data structures. These systems cannot produce any visualization of the actual data values, since they do not have access to that (run-time) information. Visualizations of data gathered at compile-time are generally not animated, as there is no relevant temporal axis along which to change the visualization. Visualizations generated from data gathered at run-time can produce complex displays of the variable space used by the program, and often rely on animation for an intuitive mapping between the temporal aspects of program in execution and the presentation of the visualization. This is the most common style in interactive visualization systems. UWPI, Pascal Genie and ObjectCenter gather data at both compile-time and run-time to provide their displays.

This category can be subdivided into two other temporally-related subcategories which apply if the visualization is based on data gathered at run-time:

- B.4.1. Temporal Control Mapping: what is the mapping between 'program time' and 'visualization time'?
- B.4.2. Visualization Generation Time: is the visualization produced as a batch job (post-mortem) from data recorded during a previous run, or is it produced live as the program executes?

If the visualization is based on information gathered at a single point in time during the program's execution, and generates a static visualization, then its temporal control mapping is 'static to static'; the system generates a snapshot (Incense does this to draw data structure diagrams). If the visualization generated is animated, the mapping is 'static to dynamic'; we do not know of any examples of such systems. If the visualization gathers information over a span of time during program execution, and produces a single still visualization based on that information, the mapping is 'dynamic to static': the visualization system is generating a trace (the stills program from ANIM does this). If the visualization uses information gathered over a period of time during the program's execution to generate an animation (this is the most common type), then the mapping is 'dynamic to dynamic'.

The visualization generation time affects how the user can interact with the visualization. The post-mortem style of visualization (used by both ANIM and TPM) combines the advantage of the rich information available at run-time with the opportunity to lay it out in the most optimal way, since the entire range of display use (i.e. the 'future') can be known in advance. This also has the disadvantage of the user being unable to interact with the visualization based on program output and thus have an immediate effect on the visualization. Live is the most popular method, although TPM has versions with both live and post-mortem modes. Live visualizations have the advantage of allowing the user to specify interactively the dataset, perhaps using a graphical tool to specify data abstractions such as trees or graphs.

C: Form

What are the characteristics of the output of the system (the visualization)?

This category is concerned with how the fundamental characteristics of the system are directly related to what can be displayed, which we have divided into five broad areas: medium, presentation style, granularity, multiple views and program synchronization. Figure 23 shows the complete hierarchy while the rankings for each system may be found in Table 3.

C.1. Medium

What is the primary target medium for the visualization system?

While systems which are designed for one medium can often run on another (e.g. SEE, which was designed for a paper medium, can easily produce visualizations on workstations which support Display PostScript), we only list the primary target medium. Common choices include paper, film or videotape, plain terminal, or graphical workstation. We expect virtual reality environments eventually to become a

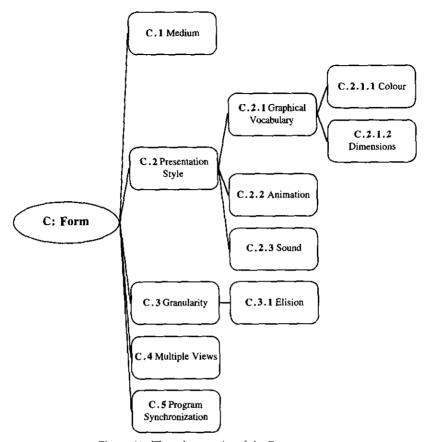


Figure 23. The subcategories of the Form category

target medium of SV systems. The most common medium for the systems in Table 3 is a black-and-white workstation monitor, with Zeus and Pavane being notable exceptions for their use of colour. SEE is an exception in that it only uses paper (although it could easily be implemented on a workstation monitor) while ANIM is capable of producing paper output using the stills program.

C.2. Presentation Style

What is the general appearance of the visualization?

Presentation style has no individual rankings because it simply serves to group the following subcategories:

- C.2.1. Graphical Vocabulary: what graphical elements are used in the visualization produced by the system?
 - C.2.1.1. Colour: to what degree does the system make use of colour in its visualizations?
 - C.2.1.2. Dimensions: to what degree are extra dimensions used in the visualization?

• C.2.2. Animation: if the system gathers run-time data, to what degree does the resulting visualization use animation?

 C.2.3. Sound: to what degree does the system make use of sound to convey information?

A system's graphical vocabulary provides some idea of the complexity of the visual primitives which make up the system's displays. Bertin [89] describes the primary feature of a graphical vocabulary as being made up of the marks used (which could be individual point objects, lines or enclosed shapes) which have a position in space. Each mark has six orthogonal retinal subtypes: colour, size, shape, grey level, orientation and texture. All of these can be used to encode information and an SV system can be characterized by the size of its graphical vocabulary.

Colour can be used to convey a great deal of information while imposing a low cognitive load, but has been greatly under-utilized in SV systems. Brown and Hershberger [40] note five effective uses of colour: to reveal an algorithm's state, to unite multiple views, to highlight areas of interest, to emphasize patterns and to capture history. As the table shows, relatively few systems have made extensive use of colour in visualizations.

Traditional systems have used simple two-dimensional graphics, although some recent work has used projections of three-dimensional images onto a two-dimensional screen. Pavane does this and provides tools for rotating the image in 3-space. Some high-speed workstations now allow alternating polarized spectacles to be synchronized with the screen display to provide a binocular depth illusion. Some displays in ANIM have been constructed using this three-dimensional technique. The emerging virtual-reality systems promise to provide an even better three-dimensional display and techniques such as Stasko's three-dimensional graph traversal [90] may become commonplace. Note that simply using a three-dimensional display to show information that is naturally three-dimensional is not necessarily the most effective use of the extra dimension; Brown and Najork's Zeus-3D system [41], Stasko's sorting animation in POLKA-3D [90] and recent work with Pavane [72] are examples of the use of the extra dimension to encode non-dimensional information. The three-dimensional views in ANIM are simply a three-dimensional projection of naturally three-dimensional data.

The most obvious and frequent use of animation in program visualization systems is to capture and convey the temporal aspects of the software in execution. Does the system make use of animation in any other novel ways? Note that animation is not a binary characteristic; rudimentary erase-redraw techniques such as those found in UWPI are considered to be animation when compared with purely static visualizations such as SEE, but they compare poorly with the smooth animations found in TANGO or Pavane.

The audio output capability of most computers in the early 1980s was limited to a single beep, but most modern workstations have digital sound capability. Gaver and his colleagues [91,92] have demonstrated how sound can be used to communicate complex information, but of the systems we are considering, only LogoMedia and Zeus have made effective use of it. Brown and Hershberger [40] have identified four distinct uses of sound in SV: to reinforce visual views, to convey patterns, to replace visual views (so that visual attention may be focused elsewhere) and to signal

exceptions. Other work includes that of Francioni et al. [93], who have investigated the use of sound in parallel programs.

C.3. Granularity

To what degree does the system present coarse-granularity details?

Many systems can visualize fine-grained details in a manner similar to that of a debugger, but the ability to filter out fine detail to get the big picture can be an advantage. The 'table of contents' view in SEE or the CGV in TPM are examples of built-in coarse-grain visualization support. A subcategory of granularity is:

• C.3.1. Elision: to what degree does the system provide facilities for eliding information?

An important feature for dealing with large amounts of information at one level of granularity is the ability to *elide* or temporarily hide sections that are not of immediate interest. As the table shows, the only systems to provide this feature to any degree are Pascal Genie, SEE and TPM.

C.4. Multiple Views

To what degree can the system provide multiple synchronized views of different parts of the software being visualized?

Multiple views might include simultaneous coarse-grained and fine-grained views of data structures, or a graphical view of changing program data with a corresponding view of the executing source code. This is different from the program synchronization characteristic because it shows different synchronized views of the same program as opposed to a race between different programs. Zeus has the best facility for multiple views because it allows each view to be edited by direct manipulation with the result directly affecting the data. ANIM can also produce multiple views although they require some work on the part of the visualizer. Pascal Genie, SEE, TPM, LogoMedia and ObjectCenter all provide multiple default views.

C.5. Program Synchronization

Can the system generate synchronized visualizations of multiple programs simultaneously?

This capability is useful for comparing the execution speeds of two programs (by running a race), for determining how one algorithm differs from another similar algorithm, and for investigating how a particular algorithm is flawed with respect to a correct algorithm. Note that modern windowing systems and operating systems will allow almost any window-based visualization system to be run in parallel. Running two versions of a system on two algorithms in different windows would not qualify under this category because there is no centralized control or synchronization between both running visualizations. Of the example systems, only SOS, BALSA, Zeus and ANIM provide this feature.

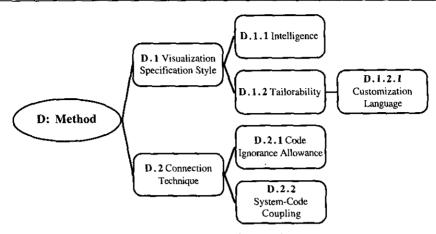


Figure 24. The subcategories of the Method category

D: Method

How is the visualization specified?

This area describes the fundamental features of the SV system which the visualizer uses to create a visualization. We have divided this into two areas, one describing the style in which the visualizer specifies the visualization and one describing the way in which the visualization and the program source code are connected. Figure 24 shows the complete set of method categories and subcategories while Table 4 indicates the relative rankings of the example systems.

D.1. Visualization Specification Style

What style of visualization specification is used?

Visualizations can be completely hand-coded (the user writes special-purpose programs which visualize a particular algorithm or program) as with ANIM, or they can be built from a library or hierarchy of existing visualizations as with BALSA and Zeus. SOS is a fixed system since it cannot be changed from the original specification (the programmer, SV system builder and visualizer were all the same person). Debugging tools (Pascal Genie, UWPI, SEE, TPM and ObjectCenter) which are tied tightly to the program code all use some degree of automation to specify the visualization, thus making them appropriate tools for programmers. The remaining systems use some degree of hand coding to produce visualizations, with BALSA/Zeus and TANGO providing a library from which to build them. Even tools which use a library can be refined further: TANGO provides specialized tools for describing smooth trajectories and the ALLADIN system of Heltulla et al. [94] provides rich graphical editing tools, thus making a high-level specification of the visualization easier. Automatic systems have the advantage of making the programmer, visualizer and user into the same person. They also take much of the work out of the visualization step and are more likely to be used by a professional or novice programmer looking for debugging assistance [95]. The subcategories of visualization

specification style include:

- D.1.1. Intelligence: if the visualization is automatic, how advanced is the visualization software from an AI point of view?
- D.1.2. Tailorability: to what degree can the user customize the visualization?
 - D.1.2.1. Customization Language: if the visualization is customizable, how can the visualization be specified?

Automatic visualizations using syntactic information to generate hierarchy diagrams, such as TPM, use a 'low' degree of *intelligence*, while systems that are able to recognize algorithms or high-level data structures and display abstractions of them would be classified as 'higher' intelligence. UWPI uses a moderate degree of intelligence because it can display abstractions, even though it does not 'understand' them. VCC [96] is an automatic prototype system which similarly generates abstractions of data structures in C programs and we are also working on more intelligent SV tools for C [95]. As Table 4 indicates, intelligence is sorely lacking among automatic SV systems.

In terms of tailorability, SOS is fixed and cannot be customized at all, while BALSA allows some interactive manipulation on the part of the user. The current X11 version of TANGO only allows window resizing, scrolling and zooming, but the original also had an interactive editor for customization. LogoMedia allows the user to choose which parts of the program will be visualized and which sounds will be associated with them (as well as change them while executing), while Zeus allows representations of data to be changed live by direct manipulation with the corresponding data in the program and the other views changed automatically. Note that being able to visualize different data sets does not qualify as customizing the visualization; the layout or presentation of the visualization must be changeable by explicit user instruction.

The customization language describes the way in which the system can accept customization instructions from the user. Systems which support interactive manipulation of the visualization, such as Zeus, have their visualizations specified interactively through direct manipulation. Systems which require the user to program explicit visualization code, like ANIM, rely on procedural visualizations. Systems which allow the user to describe the desired visualization using high-level tools or declarations, such as Pavane, support declarative specification. SEE uses simple command-line flags to customize the printouts. Visualization systems can easily support more than one of these approaches for different aspects of the complete visualization specification.

D.2. Connection Technique

How is the connection made between the visualization and the actual software being visualized?

Systems like ANIM and BALSA require the visualizer to *instrument* their code by adding statements to print visualization commands at interesting events. TANGO, with the Field Environment [97], and LogoMedia allow the visualizer to *annotate* a user program using a special editor so that the original source code remains

unchanged (although the executable code differs from the unannotated version). It is also possible to have code automatically annotated by a preprocessor before it is compiled or interpreted, but all of these techniques are an invasive form of connection and may be dangerous from a software engineering point of view. Pavane, LogoMedia and TPM provide an instrumented execution environment (interpreter or compiler) which allows the visualizer to attach non-invasive probes to data structures or code in a declarative manner so the structures can be monitored without affecting the source code at all. Another non-invasive technique is the use of a monitor which 'listens' to the bus or another part of the hardware and shows a live report of commands, such as the work of Zimmermann et al. [98]. Note that one system can use several connection techniques. Other subcategories related to connection technique include:

- D.2.1. Code Ignorance Allowance: if the visualization system is not completely automatic, how much knowledge of the program code is required for a visualization to be produced for the user?
- D.2.2. System-Code Coupling: how tightly is the visualization system coupled with the code?

As one might expect, all of the automatic systems have a high code ignorance allowance since they can produce visualizations without any code knowledge on the part of the visualizer, which is one of the main attractions of this approach. Visualization systems which require modifications to the program source, however, require the user to 'know' the program in order to produce a visualization of it. Systems which provide hooks or probes to which users can attach visualization code may require some knowledge of the program if the user wishes to make the best use of the potential probes available.

System-code coupling is a measure of how closely the SV system is tied to the program it is visualizing. Systems, like BALSA, are tightly coupled and require programs to be run and visualized within an environment, while some post-mortem systems, like ANIM, do not require any coupling at all since the visualization system simply reads an output file produced by print statements in the program. Most of the systems are tightly coupled with the programs that they are visualizing, with TANGO, SEE, ANIM and ObjectCenter being the exceptions.

E: Interaction

How does the user of the SV system interact with and control it?

We have found three major areas where interaction issues affect the fundamental design of SV systems: style, navigation and scripting facilities. The complete hierarchy is illustrated in Figure 25 and Table 5 shows how the example systems are ranked according to the following categories.

E.1. Style

What method does the user employ to give instructions to the system?

Examples include on-screen buttons, menus, command-line statements or scripted programs. A variety of techniques may be employed by a system depending on the

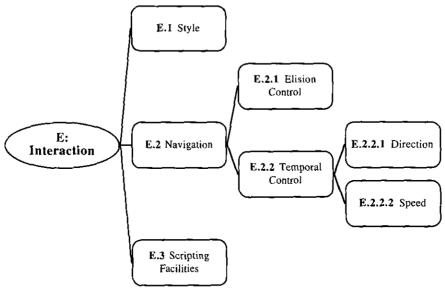


Figure 25. The subcategories of the Interaction category

action required. As the table shows, the most common style of interaction involves buttons and menus (as with most window-based programs).

E.2. Navigation

To what degree does the system support navigation through a visualization?

This is especially important when considering very large programs or data sets. If the system and its navigation tools do not scale up then they will not be useful for professional programmers. Eisenstadt et al. [87] suggest that navigability may be achieved by changes of resolution, scale, compression, selectivity and abstraction. As the table shows, few systems other than SEE and TPM support large-space navigation. Other navigation-related subcategories include:

- E.2.1. Elision Control: can the user elide information or suppress detail from the display?
- E.2.2. Temporal Control: to what degree does the system allow the user to control the temporal aspects of the execution of the program?
 - E.2.2.1. *Direction*: to what degree can the user reverse the temporal direction of the visualization?
 - E.2.2.2. Speed: to what degree can the user control the speed of execution?

Elision-control techniques are useful for information culling, the removal of excess information which is not relevant to the user's line of inquiry and which serves only to clutter the display. This also applies to audio visualizations, since temporal elision (speeding up sounds) can suppress audio detail. Elision is of primary use with large problems, for which the entire data set cannot be simultaneously displayed. As the table shows, few systems other than Pascal Genie, SEE and TPM provide elision-control facilities.

Temporal-control techniques allow the user to change the mapping between execution time and real time. The most common technique is speed, where the user can make the program stop and start as well as run faster or slower. Most of the systems at least allow the user to stop and start the visualized program, while BALSA, Zeus, Pascal Genie and UWPI all have an explicit speed control. Reversing the direction of time, so that the program runs backwards, is a rare feature as the table shows, but can be extremely useful when trying to understand an algorithm. Even the ability to 'rewind to the beginning', such as that provided by TPM, is a useful kind of temporal direction control.

E.3. Scripting Facilities

Does the system provide facilities for managing the recording and playing back of interactions with particular visualizations?

This facility is important when demonstrations are required, and it is particularly useful in classroom situations where a demonstration can be run like a videotape or students can go through it at their own pace. Even though many of the systems are designed for novice and expert demonstrations, only BALSA and Zeus have serious scripting support.

F: Effectiveness

How well does the system communicate information to the user?

This is a highly subjective measure and may be made of many factors. As shown in Figure 26, we see four categories characterizing the effectiveness of a given SV system. Table 6 shows the relative rankings for each of the example systems.

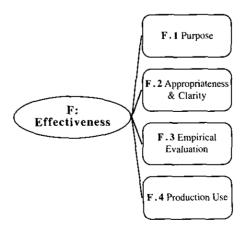


Figure 26. The subcategories of the Effectiveness category

F.1. Purpose

For what purpose is the system suited?

Once one knows what a system is intended to do, one can evaluate how effectively it achieves the intended goal. Many of the example systems are suited to novice classroom demonstration, while a few are intended for expert algorithm demonstration or debugging. Few are actually suited to expert software engineering, except those tied tightly to the source code.

F.2. Appropriateness and Clarity

If automatic (default) visualizations are provided, how well do they communicate information about the software?

This might also be expressed as: 'how rapidly do the visual metaphors inspire understanding?'. Among the example systems, we found that those tightly connected to source code, like SEE and ObjectCenter, received the lowest rating, while the others were difficult to distinguish because the quality of their output is highly dependent on individual examples.

F.3. Empirical Evaluation

To what degree has the system been subjected to a good experimental evaluation?

Most SV system developers perform little or no empirical evaluation, even though a sound scientific evaluation could prove the effectiveness of their system. One of the reasons that few studies are performed is the poor state of the art in software psychology, where there are no reliable methods for comparing programming environments. In this category we give our opinion on the evaluation reported in the literature (if any) for each system and the relative persuasiveness of the experiment based on the current state of the art. Overall, the number of systems that have been evaluated empirically is low. The systems with the most documented empirical evaluation were TANGO and Pascal Genie; although BALSA, SEE, TPM and LogoMedia have been subjected to some empirical study, much of it has been informal. A proper empirical study, in addition to convincing people of the efficacy of a system, can also serve to guide system improvements and help define new areas for SV research.

F.4. Production Use

Has the system been in production use for a significant period of time?

This category helps to indicate if people are actually using the system and to what extent. Production use includes publication, sale and distribution, or consistent use by students in a course. Several of the systems are publicly available over the Internet by anonymous ftp (indicated in the references), while others must be purchased from software suppliers. SOS, BALSA, TANGO, Pascal Genie and TPM have all been released publicly and used in schools and universities to varying extents.

7. Research Agenda

Although the 12 systems illustrate numerous positions along dimensions of the software visualization design space, there are still many outstanding research problems that need to be solved if SV is to aid significantly the practice of professional programming and software engineering as well as the learning of computer science by novice programmers [95].

The largest impediment to the use of SV by professional programmers is the issue of scope. Most SV systems are still dealing primarily with toy programs; many issues of scalability remain to be solved. While small-scale prototypes are useful for exploring new research ideas, there are also valid research issues involved in scaling these ideas up to larger implementations. The challenge now is to implement and test SV techniques on production-scale systems. Furthermore, SV has tremendous potential to aid in the understanding of concurrent programs and we expect more fruitful developments in this area as multiprocessors become more common.

The content of an SV display can vary widely over the program to algorithm spectrum. When designing an SV system, it is important to note the system's intended goals and select the content accordingly. For example, systems designed for classroom teaching might intentionally show algorithm-level displays and avoid program-level displays in order to keep the students' mind off implementation details. Systems designed for expert or even novice interactive use might require the ability to move smoothly between algorithm-level and program-level displays, depending on their needs. More work is needed to determine how SV systems can perform these kinds of transitions. Control and data flow are both important to software engineers, yet very little work has been done in showing effective transitions between these, especially in a run-time model. A dynamic-to-dynamic temporal-control mapping seems to be the overwhelming choice among designers, yet dynamic-to-static mappings have the potential to convey information in a much more concise manner.

Work to date has only scratched the surface in terms of the form of software visualizations. We have the beginnings of a diverse graphical and auditory vocabulary for communication, but much of our knowledge in this field is informal. New systems have only just started to explore the use of colour, sound and multi-dimensional output as a communication medium. We expect a great deal more work to be done in this area, but it should be done in conjunction with empirical evaluations and proper psychological studies to determine which techniques are effective. The automatic layout of information is crucial if we are to expand the scope of systems, as mentioned earlier. Research into the automatic choice of data displays has only just begun [99] and much more needs to be done if there is to be a chance of addressing scope concerns. The ability to change levels of granularity is often overlooked in SV systems, yet it has the potential to help overcome the boundaries of scale by providing a range of coarse- and fine-grained views. Providing multiple views of different elements in a visualization is well established and we expect interfaces for controlling multiple views to improve. The ability to compare programs with synchronized views provides a powerful teaching tool as well as a performance debugging resource for experts, but to date synchronized views have only been used on toy programs.

The methods for specifying software visualizations are quite crude and are a likely reason for the dearth of professional SV systems. If programmers are to use SV

systems as program understanding and debugging aids, a great deal more automation must be provided. Otherwise, the effort required to get a visualization will exceed the perceived benefit. Simple automatic displays, such as those provided by ObjectCenter or other conventional tools, are not enough: some of the power of automatic program understanding and data layout must be employed if the cognitive load on the programmer is to be significantly reduced. Requiring the programmer to understand the code in order to produce a visualization is not appropriate in such cases.

Software visualizations can be very large and complex, both spatially and temporally. Interaction with such visualizations requires facilities for advanced navigation through large programs and data spaces. We expect to see visualization prototypes which use virtual-reality technology to advantage for navigating large, complex spaces. Scripting facilities have not been used extensively in SV systems but their worth has been demonstrated in many kinds of software interfaces, so we expect that production SV systems would include at least rudimentary scripting facilities.

Over 100 software visualization prototypes have been built in the last 20 years, yet very few of these were systematically evaluated to ascertain their effectiveness. The number that have seen any kind of production use, particularly in the domain of tools for professional programmers, is particularly small. The most disturbing observation is the lack of proper empirical evaluation of SV systems, for if the systems are not evaluated, what is the point of building them?

If we can make progress with these issues, there are obvious benefits for the fields of software engineering and computer science instruction. Yet the potential goes beyond this to the entire domain of interactive systems, to the users as well as the programmers of interactive systems. Increasingly, the learning and use of complex systems is being facilitated by augmenting conventional textual and still graphic presentations with animation [100, 101], video and speech and non-speech audio [92]. Software visualization can therefore be applied to the development of self-revealing technology that can aid in demystifying and explaining system behaviour to users across the novice-to-expert continuum.

Acknowledgements

The initial ideas for this paper were presented in a conference paper [102], but many changes have since been made and we are grateful to a number of people for their advice and comments on earlier drafts. Marc Eisenstadt, John Domingue, John Stasko and Chris DiGiano read complete drafts of the paper and helped contribute to the ideas. The three anonymous reviewers provided excellent advice on structure and helped catch some of the errors. The authors and programmers (David Sherman, Marc Brown, John Stasko, Jon Bentley, Brian Kernighan, Brad Myers, Robert Henry, Alan J. Rosenthal, Marc Eisenstadt, Gruia-Catalin Roman, Ken Cox, Russell Owen and Chris DiGiano) of the first 11 SV systems that we presented helped a great deal with corrections to system descriptions and their ratings within the taxonomy, but any remaining errors are ours. We gratefully acknowledge support from the U.K. SERC/ESRC/MRC Joint Council Initiative on Cognitive Science and Human Computer Interaction (Project 90/CS66), the Natural Sciences and Engineering Research Council of Canada, Apple Computer, Inc., the Information Technology

Research Centre of Ontario and the Institute for Robotics and Intelligent Systems of Canada.

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