# Abstract

As sustainability becomes integrated into public policy decision making, comprehensive and easily accessible sustainability information will be needed to assist policy analysis. As visual analytics emerges as a major tool of policy analysis, sustainability information, particularly sustainability indicators, will need to be structured to work with visualization methods and tools. Numerous models for defining and organizing sustainability indicators have been published but there is limited literature on defining a theoretical framework for organization of such data so that it can be easily analyzed using visual analytic tools. This project is developing a framework for organizing and visualizing hierarchical based sustainability indicators within three scales, topical, spatial, and temporal. This will include quantitative and qualitative concepts and methods for analyzing large sets of sustainable data. Desktop and Internet based Visual Analytic

## Introduction

Sustainability concepts now span such a broad range of topical areas that few, if any, individuals can be experts in all aspects of sustainability. Most sustainability researchers and advocates either focus on a broad context of sustainability, environment, economy, etc, or they focus on a one particular area of sustainability, such LEEDS. These approaches are useful when the focus of decision making is sustainability itself, however such opportunities in public policy making are rare. If sustainability is to be successfully inserted into public decision it will need to be one of many factors that may be of importance to policy makers (EUROCITIES, 2004) and sustainability information will have to be relevant to a wide range of specific economic, social or rights issues (Clark, 2003; Nyerges, 2002). Given the complexity of these issues and sustainability, decisions makers will need sustainability information simplified to a manageable level so that they can be considered along with the other factors of importance to the decision at hand (Forester, 1989.; Lindblom, 1995). Indicators are one tool that can be used to help simplify the understanding of sustainability issues (Gudmundsson, 2003). Across most topics of sustainability there are a variety of measures that can be used as indicators of sustainability and a variety of models for organizing these measures and indicators have been proposed (See Table 1).

In general most sustainability indicator models report or summarize information across three basic scales: topical, spatial, and temporal. The interests and needs of decision makers can vary across these scales based on the nature of the various issues they are evaluating. (Prescott-Allen, 2001)

1d	ble1: Sustainability Indicator Models
	anada Sustainability Report (SRP, 2004)
	entral Texas Sustainability Indicators Project (Central
	exas Sustainability Indicators Project, 2004)
	cological Foot Print
``	Venetoulis, Chazan, & Gaudet, 2004; Wackernagel et al., 997)
	iteragency Working Group on Sustainable Development
	dicators
(	Sustainable Measures, 2002)
	eighborhood Plans
(0	Crossroads Resource Center, 1999; Manglani & Pijawka,
	003)
	regon Benchmarks
•	Sustainable Measures, 2002)
	ustainability Counts
	SDU, 1998) ustainable Seattle
	Best, Dusen, & Conlin, 1998; Sustainable Measures, 2002)
	he Montreal Process
	/IPO, 1995)
· ·	he Natural Step Process
	Natural Step, 1997)
Т	he State of the Nation's Ecosystems
· ·	leinz Center, 2002)
	N Indicators of Sustainable Development (Sustainable
	leasures, 2002)
	NCHS (Habitat) indicators program
•	Auclair, 1997) ale Environmental Performance Index
	Esty et al., 2006; Heinz Center, 2002)
	- 3 cy 5 c al., 2000, Homz Ochici, 2002j

Effectively delivering sustainability information to decision makers will require visualization techniques that allow decision makers to easily explore simple sustainability indicators at these various topical, spatial and temporal scales (Clark, 2003; Gallopín, 2004; Nyerges, 2001). This project is exploring the two key factors in providing this level of flexibility: 1) the method used to organize the indicators and 2) the techniques used to visualize the indicators.

### Current Concepts Organization

Most models for sustainability indicators use two basic concepts for organization. First environmental, social, and / or economic measures are used directly or in some normalized fashion to create indicators or a trend analysis. For example different types of crimes for an area may be reported, and then combined to create a crime index, such as total crimes per capita. Second these indicators are organized into categories, usually hierarchical, based on some topical or systems classification scheme. For example a Crime index may be combined with Health index under the category of Human Welfare. In some cases, these indices for Figure 1: Dashboard Display of the United States each of the topics may be combined to create an index for the category as a whole. Table 2 shows the organization structure for Prescott-Allen's The Well Being of Nations Sustainability Indicators.(Prescott-Allen, 2001)

Generally, there is little consistency among these indicator models in how indicators are developed or aggregated functionally, spatially, or temporally. Some indicators system just focus on natural environmental indicators (Esty et al., 2006; Heinz Center, 2002; Venetoulis et al., 2004), while most others include some human condition indicators. Generally at the highest topical hierarchical level



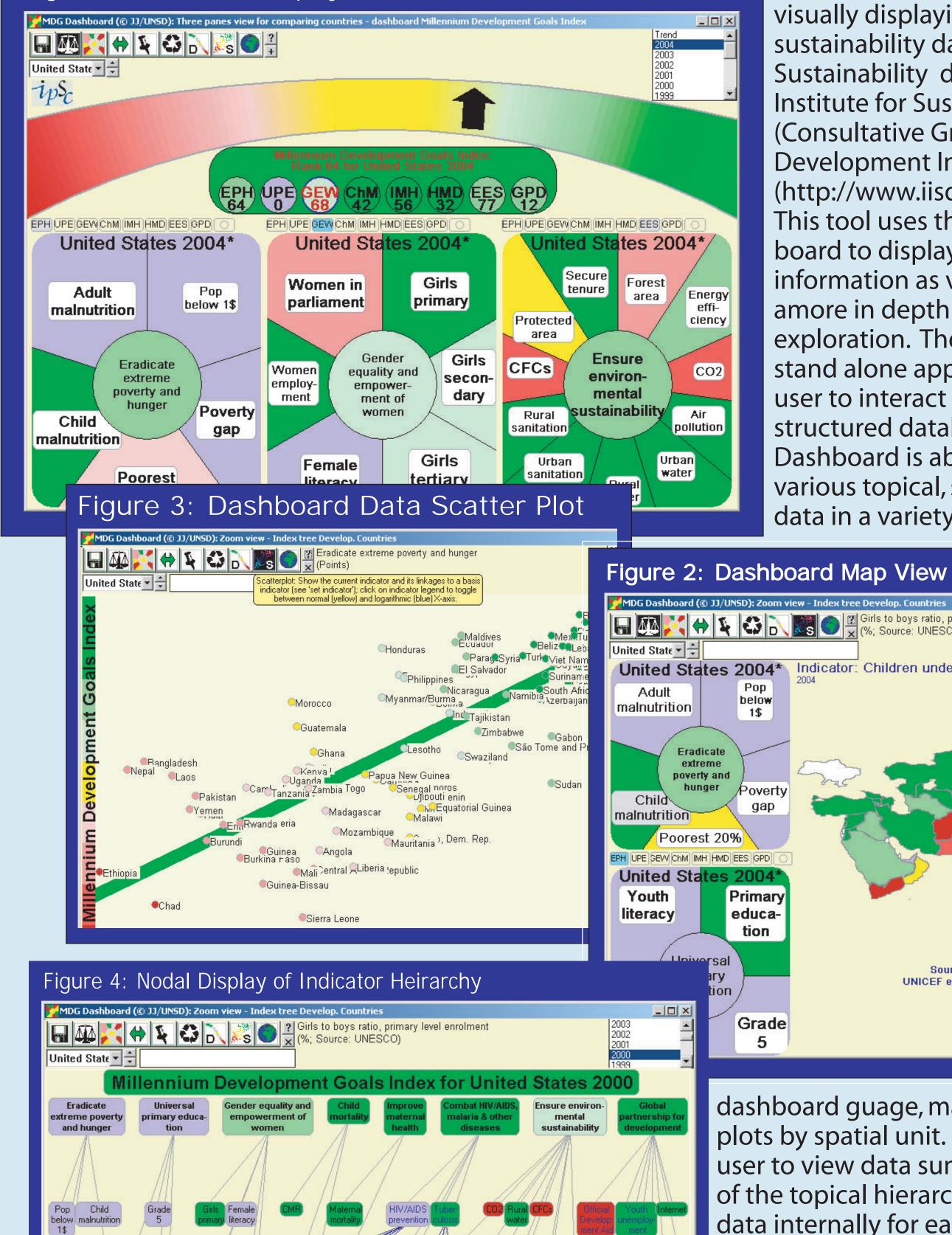
Condoms HIV Contra-hrs men knowledge ceptives married Malaria deaths bednets bednets preva-men ceptives married Contra-trade bednets preva-DOTS DOTS DOTS ODA Social Services Contra-trade capacity these indicators models have two main indicators, Human and Ecological. Below this level what data is used and how it is aggregated to different levels varies widely. Each model creates its own standard classification, weighting, and aggregation standards but the rules for such aggregation or weighting are seldom presented. For example, in The Wellbeing of Nations Prescott-Allen does provide rules for topical aggregation of the indicators but not rules for spatial aggregation. In the presentation of the data, tables of country indicators indices are grouped by region, however, no method is provided to create an aggregated index for a region. There has been some work on the methods that could be used for weighting and aggregation of data and indicators to create composite indicators for different hierarchical indicator levels (Nardo, Saisana, Saltelli, & Tarantola, 2005)

College of Design, PhD Program, Arizona State University, PO Box 871905, Tempe, AZ 85287-1905; College of Design, School of Planning, Arizona State University, PO Box 871905, Tempe, AZ 85287-1905; and School of Sustainability, Arizona State University, PO Box 872511, Tempe, AZ 85287-2511

# Visualization of Sustainability Indicators: A Conceptual Framework Ray Quay<sup>1</sup>, Khanin Hutanuwatr <sup>1</sup>, and David Pijawka <sup>2</sup>, 3

#### Visual

Though there is a rich set of systems for defining sustainability indicators, there has been less work on general methods of organization and visualization of these indicators (Williams, 2004). Each model is typically presented with one method of reporting its indicators. This may vary from a simple table such as used in the LEED system to maps that show index values for varies geographic units such as those used in The Wellbeing of Nations. None of the models utilize advanced methods for displaying and analytically exploring hierarchical data.



Currently the only published tool for visually displaying and exploring sustainability data is The Dashboard of Sustainability developed by International Institute for Sustainable Development (Consultative Group on Sustainable Development Indicators, 2006) (http://www.iisd.org/cgsdi/dashboard.asp). This tool uses the motif of a vehicle dash board to display sustainability status information as various gauges and allows amore in depth and interactive exploration. The tool is a windows based stand alone application that allows the user to interact with a hierarchical structured database of indicator data. Dashboard is able to display indicators for various topical, spatial, and temporal scale data in a variety of ways including the

educa-tion WE -a Source: UNICEF estimates dashboard guage, maps, scatter plots and value plots by spatial unit. The tool does allow the user to view data summarized at different levels of the topical hierarchy and does aggregate the data internally for each grouping of indicators. Three levels of hierarchy are supported, lower data level, group data indicator level, and then a single aggregated indicator. Figure 1 shows the typical Dashboard display of the United States with the indicator gauges. Each colored part of the gauge corresponds to a data indicator, with each center being the group aggregated indicator value. Different gauges can be

selected for viewing. Figure 2 Shows a similar data display but in map view. In this view the map is interactive and data from any country can be displayed in the dashboard by clicking on the map and data values for any country can be displayed by clicking on the dash board gauge. Dashboard gauges can also be displayed side by side with other countries (up to eight). Other views include a scatter plot of all countries (figure 3) based on values for two indicators, and a nodal view (figure 4) of the hierarchy itself for one country.

Though Dashboard provides a rich interactive environment, it structure around the dashboard concept is limiting when try to explore the hierarchical data within the three scales, topical, spatial, and temporal is difficult and no tools (visual or otherwise) are provide for doing analytical analysis nor is any method to produce a report at any selected topical, spatial, or temporal level

Best, A., Dusen, H.V., & Conlin, R. (1998). Indicators of sustainable community: Sustainable Seattle.

Esty, D. C., Srebotnjak, T., Kim, C. H., Levy, M. A., Sherbinin, A. d., & Anderson, B. (2006). Pilot 2006 en Center for Environmental Law & Policy.

Auclair, C. (1997). The unchs (habitat) indicators program. In R. Moldan & e. al (Eds.), Sustainable indicators: A report on the project on indicators of sustainable development. New York: John Willey& Sons.

ience: Challenges for the new millennium. University of East Anglia, Norwich UK: An address at the official opening and Technology, ECLAC. Santiago de Chile: ECL

Journal, 55(2), 199-217

Central Texas Sustainability Indicators Project. (2004). Fith annual report.Austin, Texas: Central Texas Sustainability Indicators Projec

onsultative Group on Sustainable Development Indicators. (2006). The dashboard of sustainability. Retrieved 3/17/2006, 2006, from

Crossroads Resource Center. (1999). Neighborhood sustainability indicators guidebook Minnesota: Urban Ecology Coalition (Minneapolis)

gap malnutrition

### Visual Analytics Conceptual Framework Organization



The calculation of an indicator is typically based on some rule which defines what data is used, what the calculation is (if any) to create a metric, and what normalization is done (if any) to create a numeric index or indicator. In addition to this numeric, these indicators have attributes of scope: topic, space, and time. These other attributes are not static and can describe as a hierarchical structure. Space can be defined as a single parcel of land, or aggregated into a single block, or to a square mile, or to a city, state, nation, hemisphere and planet. Topic can be described as a single measurement, such as CO2 levels combined with others to describe

green house gases, combined with

node may be linked to

structured to represent

nodal hierarchies See

described where it lies

Table 3). Measured

data can then be

within these scope

more than just a

of the hierarchy

summarization of

indicators from one

level to another is

based on rules of how

the indicators or data

from lower levels is

higher level. These

UROCITIES. (2004). Towards a strategy on the urban environment: Eurocities statement. In E.T. N. o. M. E. Cities (Ed.): European Union.

nundsson, H. (2003). Making concepts matter: Sustainable mobility and indicator systems in transport policy. International Social Science

leinz Center, T. (2002). The state of the nation's ecosystems. Washington, DC: The H. John Heinz III Center For Science, Economics, and the

indblom, C. E. (1995). Science of muddling through. In D. C. McCool (Ed.), Public policy theories, models, and concepts (pp. 142-157

aggregated at the

hierarchical

this level.

This data

hierarchies. This is

classification scheme.

In this case, each level

represents a summary

of all the values below

one or more other

described in XML

(which is well

nodes which can be

The conceptual framework of sustainability indicator organization and visualization includes five components.

- of topical, spatial, and temporal hierarchies,
- are topically, spatially, or temporally focused,
- and
- information relevant to their needs and interests.

other measures (Particulates etc) to describe air quality, or as part of a summary of environmental health or general global well being. Time can be described as now, or the day, or the month, year, decade, century or as the difference between two points in time.

<HIERARCHY NAME="TOPICAL";</p>

</HUMAN>

</ECOSYSTEM

</BEXAR

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</US>

</GLOBAL>

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Visualization research is rich in methods to display hierarchical and nodal based data. Visual analytics These hierarchy schemes of scope can be described research is also rich in methods to analyze hierarchical and network data. However, use of these independent of the data with in a a nodal network. Each techniques will require that that Figure 5: Interface Concepts sustainability indicator data be ble 3: Scope Heirarchy Definit organized to facilitate visualization, Select an Indicator Browser: Topical, **TOPICAL HIERARCHY XML** interactive exploration, and analytical Attribute selectors can display Spatial or Time. Each allows the assessment. the attributes based on different user to explore the indicator data HUMAN NAME="Human Well Being Index" EALTH NAME="Wealth Index"> </WEALTH> Further Research Needed views of the heirarchy: List, Map, based on a Topical, Spatial, or Timeline <VOTE NAME="Voting Rights Index></VOTE Tree classification heirarchy. 🚺 1) Some sustainability schemes are ECOSYSTEM NAME="Ecosystem Wellbeing Index"> not hierarchical, organizing AIR NAME="Air Ouality Index> <CO2 NAME="CO2 Levels"></CO2> indicators in hierarchical structures <OZ NAME="Ozone Levels"></OZ> needs to be researched. (Gallopín, Visualization of Sustainability Indicators: Concept 1 2004; Nyerges, 2002) emonstration of Sustainability Indicators Visualization Project Conceptual Framework 2) Most indicators are not normalized Select Data Browser: View inidcators by Spatial Hierarchy 🔽 SPATIAL HIERARCHY XML making comparison of indicators Indicators by Contry/ Region <HIERARCHY NAME="SPATIAL"> from different units of measure View Tree View 💌 View Tree View 💌 <GLOBAL NAME="World Wide";" Select Data View Map View Select Topic Select Time Period difficult. (Allard, Cherqui, Wurtz, & EMISPHERE NAME="Northern Hemisphere" Indicator 3 Year 2000 1990 - 1999 Indicator 1 NAMERICA NAME="North America"> Mora, 2004; Nyerges, 2001) 1990 - 199 US NAME="United States"> 🗟 🗟 🔒 <TEXAS NAME="State of Texas"> 3) Most indicator system define <BEXAR NAME="Bexar County"> <SA NAME="City of San Antonio"></SA> indicators one geographic scale ndicator 4 because of the inconsistent ndicator 5 1995 - 199 availability of data for all indicators Indicator 3 at all geographic scales, (N.L.Leake, Adamowicz, & Boxall, 🖸 2000 - 2009 2002) 2000 - 200 2000 2000 2001 **TEMPORAL HIERARCHY XML** Indicator 8 4) Most indicators do not provide HIERARCHY NAME="TEMPORAL" <1900CENT NAME="20<sup>th</sup> Centrury"> rules for summation of indicators 1990DEC NAME="Decade 1990-1999" to higher topical and spatial levels. <1990 NAME="1990"></1990> <1991 NAME="1991"></1991> (Nyerges, 2001) <1999 NAME="1999"></1999 5) There is general lack of historical indicator data.

rules will be different for different hierarchical schemes and indicators. Toipcal Air quality may be simply be done by averaging while spatial aggregation may be weigthed by size of the country. Thus within the hierarchical indicator scheme, rules must be developed for how each indicator is aggregated These rules can either be defined as part of the hierarchy, or simply calculated and included in the data and associated with the aggregated node. Averaging and weighted averaging would be the most common rules. Such simple methods could be reflected in XML scope hierarchies.

provide a main display frame, in which the user would browse data based on one of the hierarchies, based on single or multiple attributes selected from the other hierarchies. Figure 5 provides an overview of such and interface. Also conceptual frameworks and prototypes are being developed on this basis and are located at www.public.asu.edu/~mcquay/sivp

Lists Trees Graphs

Manglani, P., & Pijawka, K. D. (2003, November 9 - 12, 2003). Measuring environmental impacts of sustainable neighhood plans. Paper presented at the PLEA 2003 - The 20th Conference on Passive and Low Energy Architecture, Chile.

Nardo, M., Saisana, M., Saltelli, A., & Tarantola, S. (2005). Tools for composite indicators building.lspra, Italy: European Commission, Directorate General, Joint Research Center.

Nyerges, T. L. (2001, October 1-2, 2001). Research needs for participatory, geospatial decision support: Linked representations for sustainability

MPO, T. M. P. O. (1995). Criteria and indicators for the conservation and sustainable management of temperate and boreal forest

LLeake, Adamowicz, W. L., & Boxall, P. C. (2002). An examination of economic sustainability indicat

latural Step, T. (1997). The natural step

Visualization and Interaction

1) A data organizational system that defines indicator data base on hierarchies of topical, spatial, and temporal attributes;

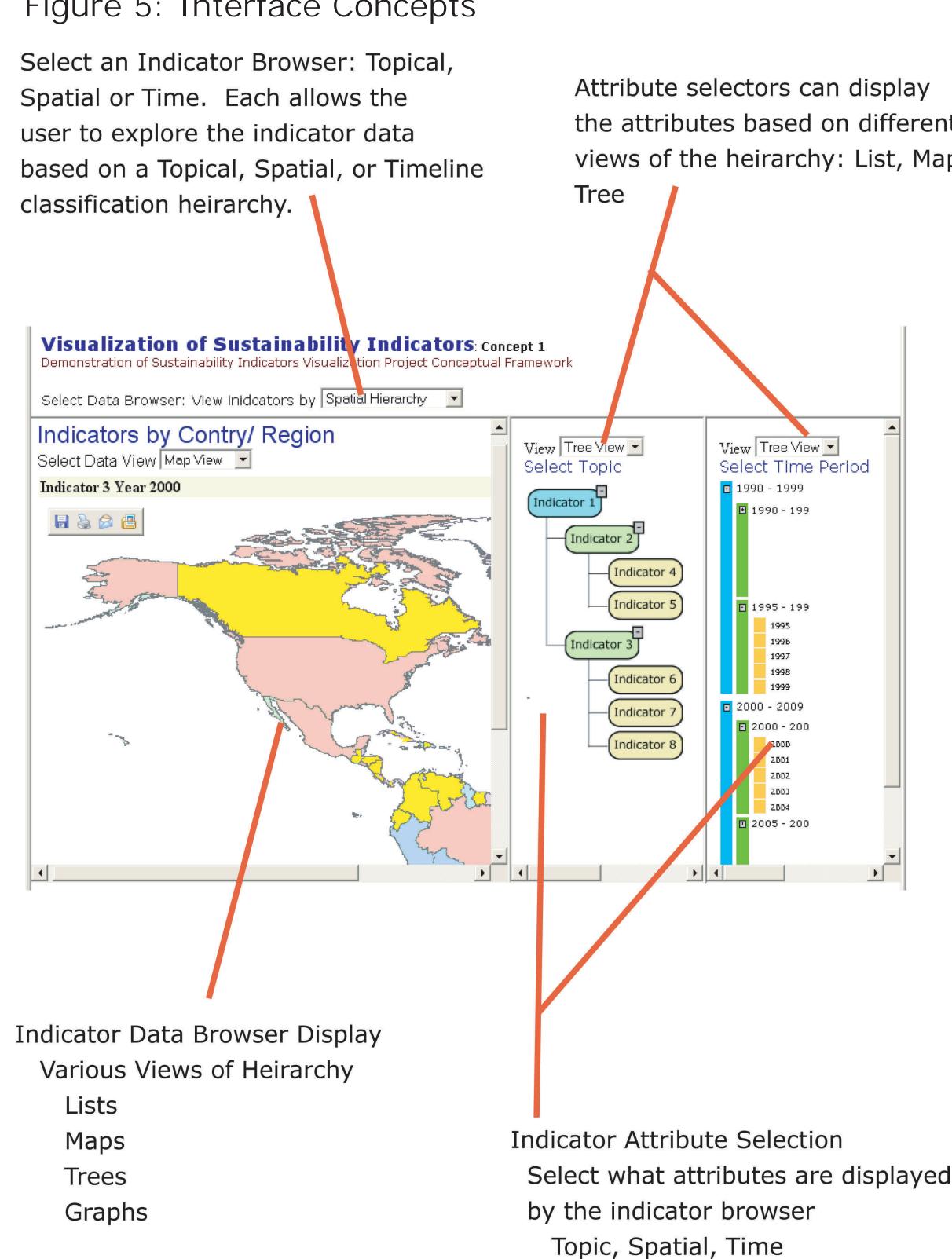
2) Methods for aggregation of indicator indices at various levels

3) Visual techniques to display indicator data in views that eithe

4) Visual Analytic techniques to analytically assess indicator da

5) A simple and intuitive visual interface that allows the decision maker to explore sustainability indicators and analysis to find

Public policy decision makers must are faced with a wide range of complex issues for which sustainability will be only one of many factors that will be considered. The environment of public decision making can be chaotic, and the focus on what aspects of sustainability are important to an issue may shift over the course of discussion of an issue. Thus there is a need for tools with high degree of flexibility providing both summarized and details in a variety of levels of place and time. A simple and intuitive visual interface that allows the decision maker to explore sustainability indicators and analysis to find information relevant to their needs and interests is proposed. Using this proposed framework of topical, spatial and temporal hierarchical data organization, an interface that allows the user to browse the data based on each hierarchy could be constructed. Such an interface would



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stainable Measures, I. (2002, 6/25/02). Comparative summary of existing indicator sets - part 2. Retrieved 9/15/05, 2005, fro

netoulis, D. J., Chazan, D., & Gaudet, C. (2004). Ecological footprint of nations:Redefining Progre

- 6) There currently appears to be little research into the use of sustainability indicators with futures analysis.

More Info? Contact ray.quay@asu.edu