



# Managing the Evolution of Dataflows with VisTrails

Juliana Freire

<http://www.cs.utah.edu/~juliana>

University of Utah

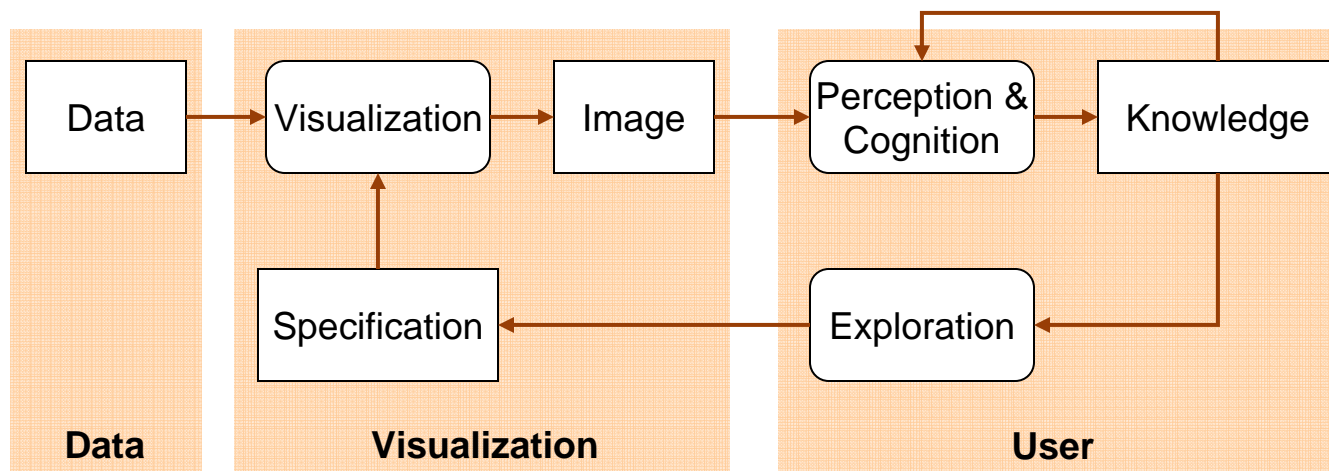
Joint work with:

Steven P. Callahan, Emanuele Santos,

Carlos E. Scheidegger, Claudio T. Silva and Huy T. Vo

# Data Exploration through Visualization

- ◆ Hard to make sense out of large volumes of raw data, e.g., sensor feeds, simulations, MRI scans
- ◆ Insightful visualizations help analyze and validate various hypothesis
- ◆ But creating a visualization is a complex process



# Visualization Systems: State of the Art

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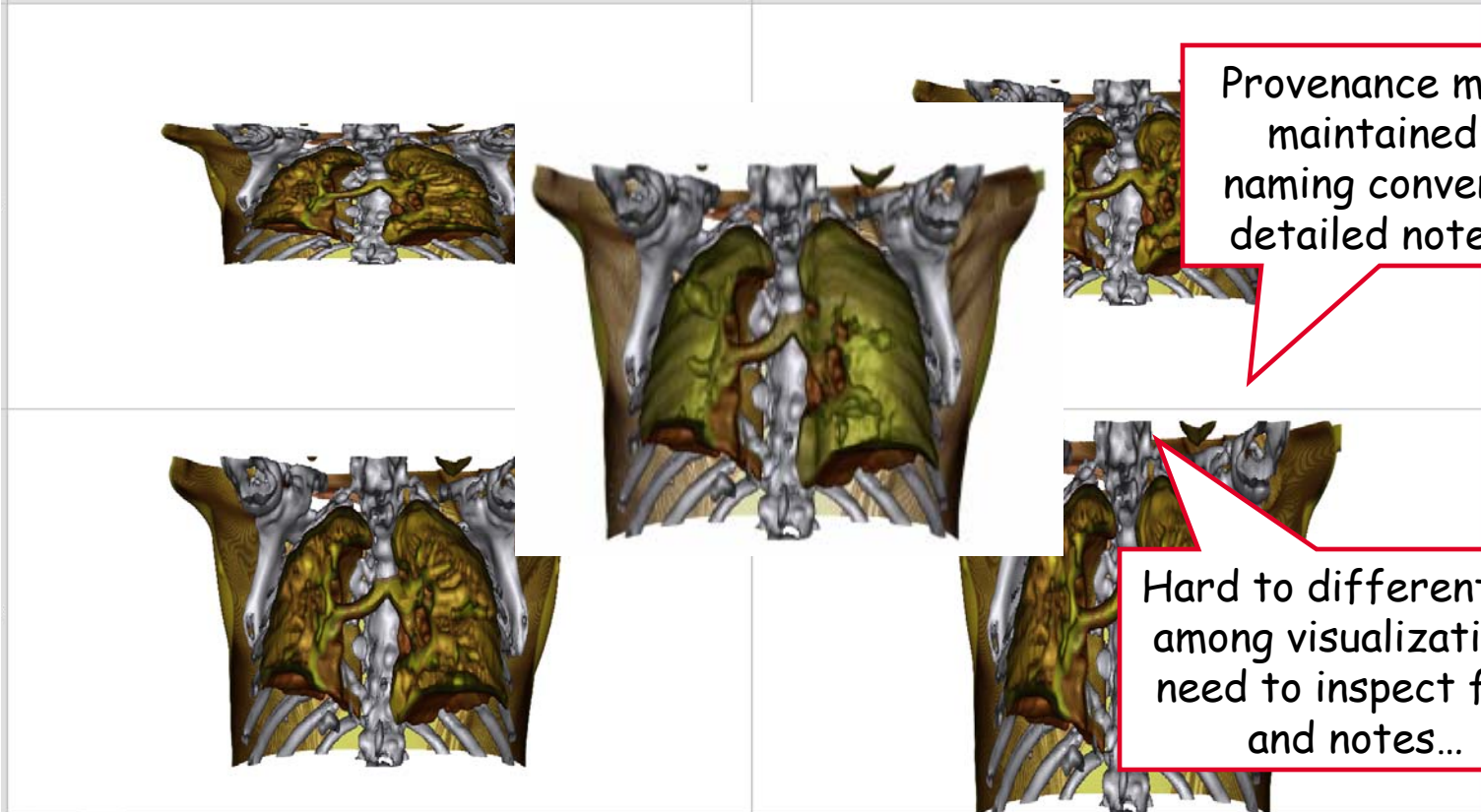
- ◆ Systems: SCIRun, ParaView
- ◆ Visual programming for creating *visualization pipelines*—dataflows of visualization operations
  - Simplify and automate and the creation of visualizations
- ◆ Hard to create and compare a *large number* of visualizations
- ◆ Limitations:
  - No separation between the specification of a dataflow and its instances
  - No provenance tracking mechanism
  - Users need to manage data and metadata

*The generation and maintenance of visualizations is a major bottleneck in the scientific process*

# Example: Visualizing Medical Data

anon4877\_original\_20060331.srn

anon4877\_voxel\_scale\_1\_20060331.srn



Provenance manually maintained: file naming conventions+ detailed notes kept

Hard to differentiate among visualizations: need to inspect files and notes...

anon4877\_voxel\_scale\_2\_20060331.srn

anon4877\_voxel\_scale\_3\_20060331.srn

# VisTrails: Managing Visualizations

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- ◆ Streamlines the creation, execution and sharing of complex visualizations
  - VisTrails manages the data, scientists can focus on *science!*
- ◆ Infrastructure for large-scale data exploration through visualization
  - **Systematic maintenance of visualization provenance**: akin to an electronic lab notebook
  - Interactive comparative visualization
- ◆ Not a replacement for visualization systems: provides infrastructure that can be combined with and enhance these systems
- ◆ Many important applications. Some ongoing collaborations:
  - Harvard Medical School (radiation oncology); OHSU (environmental observation and forecasting systems); UCSD (biomedical informatics)

# VisTrails

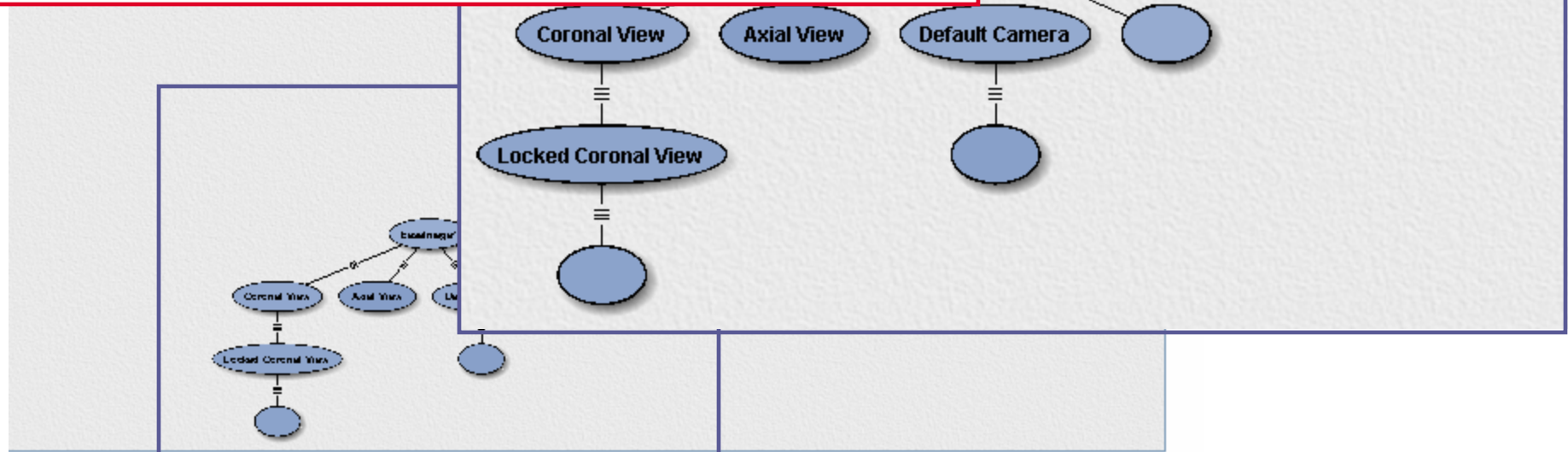
## Evolving dataflow

[Link to video:](#)

[http://www.cs.utah.edu/~juliana/talks/videos/vistrails\\_evolvedataflow\\_spx.avi](http://www.cs.utah.edu/~juliana/talks/videos/vistrails_evolvedataflow_spx.avi)

# Action-Based Provenance: Example

```
<action date="29 Mar 2006 09:22:56" notes="" parent="829" time="830" user="erik"
what="changeParameter">
  <set function="AddPoint" functionId="11" moduleId="2" parameter="(unnamed)"
parameterId="0" type="float" value="1990"/>
  <set function="AddPoint" functionId="11" moduleId="2" parameter="(unnamed)"
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user="erik" what="changeParameter">
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parameterId="0" type="float" value="1151"/>
  <set function="AddPoint" functionId="10" moduleId="2" parameter="(unnamed)"
parameterId="1" type="float" value="1"/>
</action>
```



# Action-Based Provenance

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- ◆ Uniformly captures both data and process provenance
- ◆ Records user actions—compact representation
- ◆ Detailed information about the exploration process
  - Results can be reproduced
  - Scientists can return to any point in the exploration space
- ◆ History tree structure enables scalable exploration of the dataflow parameter space through
  - Macros: re-use actions for repetitive tasks
  - Bulk updates: quickly explore slices of parameter space



# VisTrails

# Macros

[Link to video:](http://www.cs.utah.edu/~juliana/talks/videos/vistrails_macros.avi)

[http://www.cs.utah.edu/~juliana/talks/videos/vistrails\\_macros.avi](http://www.cs.utah.edu/~juliana/talks/videos/vistrails_macros.avi)

# VisTrails

## Bulk updates

[Link to video](http://www.cs.utah.edu/~juliana/talks/videos/vistrails_bulkupdates.avi): [http://www.cs.utah.edu/~juliana/talks/videos/vistrails\\_bulkupdates.avi](http://www.cs.utah.edu/~juliana/talks/videos/vistrails_bulkupdates.avi)

# VisTrails

## Generating animations

[Link to video](http://www.cs.utah.edu/~juliana/talks/videos/vistrails_animation.avi): [http://www.cs.utah.edu/~juliana/talks/videos/vistrails\\_animation.avi](http://www.cs.utah.edu/~juliana/talks/videos/vistrails_animation.avi)

# Conclusions

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- ◆ Identified the problem and proposed the first solution for managing fast-evolving workflows
- ◆ Detailed data and **process** provenance automatically captured
- ◆ The VisTrails system
  - Replaces the lab notebook*

*Enables large-scale data exploration through visualization*

*And scientists can do it!*

- ◆ Focus on visualization, but ideas are applicable to general workflows

# Current and Future Work



- ◆ Platform for collaborative visualization
  - Distributed synchronization algorithm
- ◆ XTrails: support for general workflows
  - Support for Web services (BIRN)
  - Execution over the Grid (Chimera)
- ◆ GUI---better interaction with history
- ◆ Mine trails—potentially useful information about good visualization strategies
  - Automate generation of visualizations

# Acknowledgements



- ◆ This work is partially supported by the National Science Foundation (under grants IIS-0513692, CCF-0401498, EIA-0323604, CNS-0514485, IIS-0534628, CNS-0528201, OISE-0405402), the Department of Energy, an IBM Faculty Award, and a University of Utah Seed Grant.
- ◆ We thank
  - Dr. George Chen (Harvard Medical School) for the lung datasets;
  - Gordon Kindlmann (SCI) for the brain data set; and
  - The Visible Human Project for the head.

# More info about VisTrails

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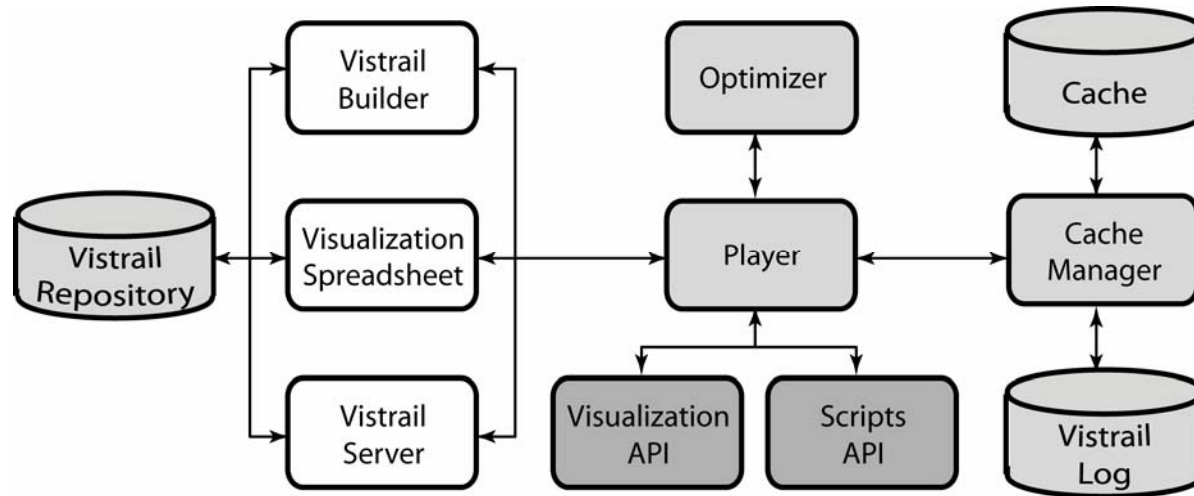
Google vistrails

Or

<http://www.sci.utah.edu/~vgc/vistrails/>



# VisTrails Architecture

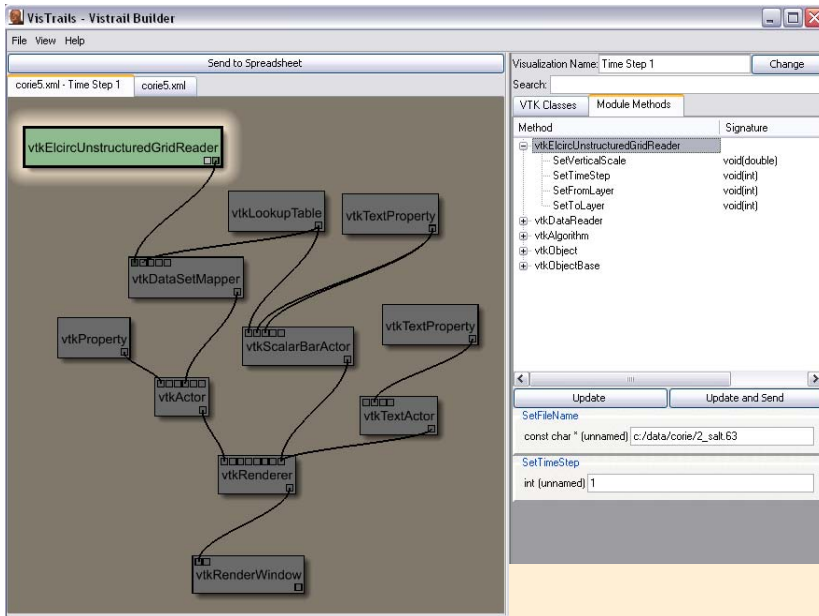


- ◆ 15-16k lines of python code
  - Easily integrate components
- ◆ Re-use existing free software
  - QT, OpenGL, VTK



# VisTrails User Interface

## VisTrails Builder



## VisTrails Spreadsheet

