# Information Visualization at UBC 

Tamara Munzner
University of British Columbia

## Information Visualization

- visual representation of abstract data
- computer-based
- interactive
- goal of helping human perform some task more effectively
- bridging many fields
- cognitive psych: finding appropriate representation
- HCl: using task to guide design and evaluation
- graphics: interacting in realtime
- external representation reduces load on working memory


## Current Projects

- accordion drawing
- TreeJuxtaposer, SequenceJuxtaposer, TJC, PRISAD, PowerSetViewer
- evaluation
- Focus+Context, Transformations
- graph drawing
- TopoLayout
- dimensionality reduction
- MDSteer, PBSteer


## Accordion Drawing

- rubber-sheet navigation
- stretch out part of surface, the rest squishes
- borders nailed down
- Focus+Context technique
- integrated overview, details
- old idea
- [Sarkar et al 93], ...
- guaranteed visibility
- marks always visible
- important for scalability
- new idea
- [Munzner et al 03]


Escherichia co Escherichia col
Amanita citrin Coprinus auric Multiclavula ve Trachymyrme: Ctenomyces st
Glomerella cin
Indigofera ger Eruca sativa. Drosophila me
Homo sapiel Trypanosoma Trypanosoma
Neopolystoma Neopolystoma
Thermococcus Thermococcus
Microbisporal Chloroplast Ps Chlamydomon

## Guaranteed Visibility

- easy with small datasets



## Guaranteed Visibility Challenges

- hard with larger datasets
- reasons a mark could be invisible
- outside the window
- AD solution: constrained navigation
- underneath other marks
- AD solution: avoid 3D
- smaller than a pixel
- AD solution: smart culling


## Guaranteed Visibility: Culling

- naive culling may not draw all marked items

no GV



## Phylogenetic/Evolutionary Tree



M Meegaskumbura et al., Science 298:379 (2002)

## Common Dataset Size Today



M Meegaskumbura et al., Science 298:379 (2002)

## Future Goal: 10M Node Tree of Life



## Paper Comparison: Multiple Trees

focus

context


## TreeJuxtaposer

- comparison of evolutionary trees
- side by side
- [demo: olduvai.sourceforge.net/t]]



## TJ Contributions

- first interactive tree comparison system
- automatic structural difference computation
- guaranteed visibility of marked areas
- scalable to large datasets
- 250,000 to 500,000 total nodes
- all preprocessing subquadratic
- all realtime rendering sublinear
- introduced accordion drawing (AD)
- introduced guaranteed visibility (GV)


## Joint Work: TJ Credits

- Tamara Munzner (UBC prof)
- Francois Guimbretiere (Maryland prof)
- Serdar Tasiran (Koc Univ, prof)
- Li Zhang, Yunhong Zhou (HP Labs)
- TreeJuxtaposer: Scalable Tree Comparison using Focus+Context with Guaranteed Visibility
- Proc. SIGGRAPH 2003
- www.cs.ubc.ca/~tmm/papers/tj
- James Slack (UBC PhD)
- Tamara Munzner (UBC prof)
- Francois Guimbretiere (Maryland prof)
- TreeJuxtaposer: InfoVis03 Contest Entry. (Overall Winner)
- InfoVis 2003 Contest
- www.cs.ubc.ca/~tmm/papers/contest03


## Genomic Sequences

- multiple aligned sequences of DNA
- now commonly browsed with web apps
- zoom and pan with abrupt jumps



## SequenceJuxtaposer

- dense grid, following conventions
- rows of sequences, typically species
- columns of partially aligned nucleotides
- [video: www.cs.ubc.ca/~tmm/papers/sj]



## SJ Contributions

- accordion drawing for gene sequences
- smooth, fluid transitions between states
- guaranteed visibility for globally visible landmarks
- difference thresholds changeable on the fly
- 2004 paper results: 1.7M nucleotides
- current with PRISAD: 40M nucleotides
- future work
- hierarchical structure from annotation dbs
- editing


## Joint Work: SJ Credits

- James Slack (UBC PhD)
- Kristian Hildebrand (Weimar Univ MS)
- Tamara Munzner (UBC prof)
- Katherine St. John (CUNY prof)
- SequenceJuxtaposer: Fluid Navigation For Large-Scale Sequence Comparison In Context
- Proc. German Conference Bioinformatics 2004
- www.cs.ubc.ca/~tmm/papers/sj


## Scaling Up Trees

- TJ limits: 500K nodes
- large memory footprint
- CPU-bound, far from achieving peak rendering performance of graphics card
- in TJ, quadtree data structure used for
- placing nodes during layout
- drawing edges given navigation
- culling edges with GV
- picking edges during interaction


## New Data Structures, Algorithms

- new data structures
- two 1D hierarchies vs. one 2D quadtree
- new drawing/culling algorithm



## TJC/TJC-Q Results

- TJC
- no quadtree
- picking with new hardware feature
- requires HW multiple render target support
- 15M nodes
- TJC-Q
- lightweight quadtree for picking support
- 5M nodes
- both support tree browsing only
- no comparison data structures


## Joint Work: TJC, TJC-Q Credits

- Dale Beermann (Virginia MS alum)
- Tamara Munzner (UBC prof)
- Greg Humphreys (Virginia prof)
- Scalable, Robust Visualization of Large Trees
- Proc. EuroVis 2005
- www.cs.virginia.edu/~gfx/pubs/TJC


## PRISAD

- generic accordion drawing infrastructure - handles many application types
- efficient
- guarantees of correctness: no overculling
- tight bounds on overdrawing
- handles dense regions efficiently
- new algorithms for rendering, culling, picking
- exploit application dataset characteristics instead of requiring expensive additional data structures


## PRISAD Results

- trees
- 4M nodes
$-5 x$ faster rendering, $5 x$ less memory
- order of magnitude faster for marking
- sequences
- 40M nucleotides
- power sets
-2 M to 7 M sets
- alphabets beyond 20,000


## Joint Work: PRISAD Credits

- James Slack (UBC PhD)
- Kristian Hildebrand (Weimar MS)
- Tamara Munzner (UBC prof)
- PRISAD: A Partitioned Rendering Infrastructure for Scalable Accordion Drawing.
- Proc. InfoVis 2005, to appear


## PowerSetViewer

- data mining of market-basket transactions
- show progress of steerable data mining system with constraints
- want visualization "windshield" to guide parameter setting choices on the fly
- dynamic data
- all other AD applications had static data
- transactions as sets
- items bought together make a set
- alphabet is items in stock at store
- space of all possible sets is power set


## PowerSetViewer

- show position of logged sets within enumeration of power set
- very long 1D linear list
- wrap around into 2D grid of fixed width
- [video]



## Joint Work: PSV Credits

- work in progress
- Tamara Munzner (UBC prof)
- Qiang Kong (UBC MS)
- Raymond Ng (UBC prof)


## Current Projects

- accordion drawing
- TreeJuxtaposer, SequenceJuxtaposer, TJC, PRISAD, PowerSetViewer
- Focus+Context evaluation
- system, perception
- graph drawing
- TopoLayout
- dimensionality reduction
- MDSteer, PBSteer


## Focus+Context

- integrating details and overview into single view
- carefully chosen nonlinear distortion
- what are costs? what are benefits?



## Focus+Context System Evaluation

- how focus and context are used with
- rubber sheet navigation vs. pan and zoom
- integrated scene vs. separate overview
- user studies using modified TJ
- abstract tasks derived from biologists' needs based on interviews


## Joint Work: F+C System Eval Credits

- work in progress
- Adam Bodnar (UBC MS)
- Dmitry Nekrasovski (UBC MS)
- Tamara Munzner (UBC prof)
- Joanna McGrenere (UBC prof)
- Francois Guimbretiere (Maryland prof)


## F+C Perception Evaluation

- understand perceptual costs of transformation
- find best transformation to use
- visual search for target amidst distractors
- shaker paradigm



## F+C Perception Evaluation

- understand perceptual costs of transformation
- deterioration in performance
- time, effort, error
- static costs: caused by crowding, distortion of static transformation itself
- high static cost
- dynamic costs: reorienting and remapping when transformation applied or focus moved
- low dynamic cost
- large no-cost zone


## Joint Work: F+C Perceptual Eval

- Keith Lau (former UBC undergrad)
- Ron Rensink (UBC prof)
- Tamara Munzner (UBC prof)
- Perceptual Invariance of Nonlinear Focus+Context Transformations
- Proc. First Symposium on Applied Perception in Graphics and Visualization, 2004
- work in progress: continue investigation
- Heidi Lam (UBC PhD)
- Ron Rensink (UBC prof)
- Tamara Munzner (UBC prof)


## Current Projects

- accordion drawing
- TreeJuxtaposer, SequenceJuxtaposer, TJC, PRISAD, PowerSetViewer
- Focus+Context evaluation
- system, perception
- graph drawing
- TopoLayout
- dimensionality reduction
- MDSteer, PBSteer


## TopoLayout

- multilevel decomposition and layout
- automatic detection of topological features
- chop into hierarchy of manageable pieces
- lay out using feature-appropriate algorithms



## Multilevel Hierarchies

- strengths: handles large class of graphs
- previous work mostly good with near-meshes
- weaknesses: poor if no detectable features



## Joint Work: TopoLayout Credits

- work in progress
- Dan Archambault (UBC PhD)
- Tamara Munzner (UBC prof)
- David Auber (Bordeaux prof)


## Current Projects

- accordion drawing
- TreeJuxtaposer, SequenceJuxtaposer, TJC, PRISAD, PowerSetViewer
- Focus+Context evaluation
- system, perception
- graph drawing
- TopoLayout
- dimensionality reduction
- MDSteer, PBSteer


## Dimensionality Reduction

- mapping multidimensional space into space of fewer dimensions
- typically 2D for infovis
- keep/explain as much variance as possible
- show underlying dataset structure
- multidimensional scaling (MDS)
- minimize differences between interpoint distances in high and low dimensions


## Scalability Limitations

- high cardinality and high dimensionality: slow
- motivating dataset: 120K points, 300 dimensions
- most existing software could not handle at all
- 2 hours to compute with O( $\mathrm{n}^{5 / 4}$ ) HIVE [Ross 03]
- real-world need: exploring huge datasets
- people want tools for millions of points
- strategy
- start interactive exploration immediately
- progressive layout
- concentrate computational resources in interesting areas
- steerability
- often partial layout is adequate for task


## MDSteer Overview


lay out random subset

user selects active region of interest

subdivide bins lay out another random subset

more subdivisions and layouts
user refines active region

## MDSteer Contributions

- first steerable MDS algorithm
- progressive layout allows immediate exploration
- allocate computational resources in lowD space
- [video: www.cs.ubc.ca/~tmm/papers/mdsteer]



## Joint Work: MDSteer Credits

- Matt Williams (former UBC MS)
- Tamara Munzner (UBC prof)
- Steerable Progressive Multidimensional Scaling
- Proc. InfoVis 2004
- www.cs.ubc.ca/~tmm/papers/mdsteer
- work in progress: PBSteer for progressive binning
- David Westrom (former UBC undergrad)
- Tamara Munzner (UBC prof)
- Melanie Tory (UBC postdoc)


## Summary

- broad array of infovis projects at UBC
- theme: scalability
- size of dataset
- number of available pixels


## InfoVis Service

- IEEE Symposium on Information Visualization (InfoVis) Papers/Program Co-Chair 2003, 2004
- IEEE Executive Committee, Technical Committee on Visualization and Graphics
- Visualization Research Challenges
- report commissioned by NSF/NIH


## More Information

- papers, videos, images
- www.cs.ubc.ca/~tmm
- free software
- olduvai.sourceforge.net/tj
- olduvai.sourceforge.net/sj

