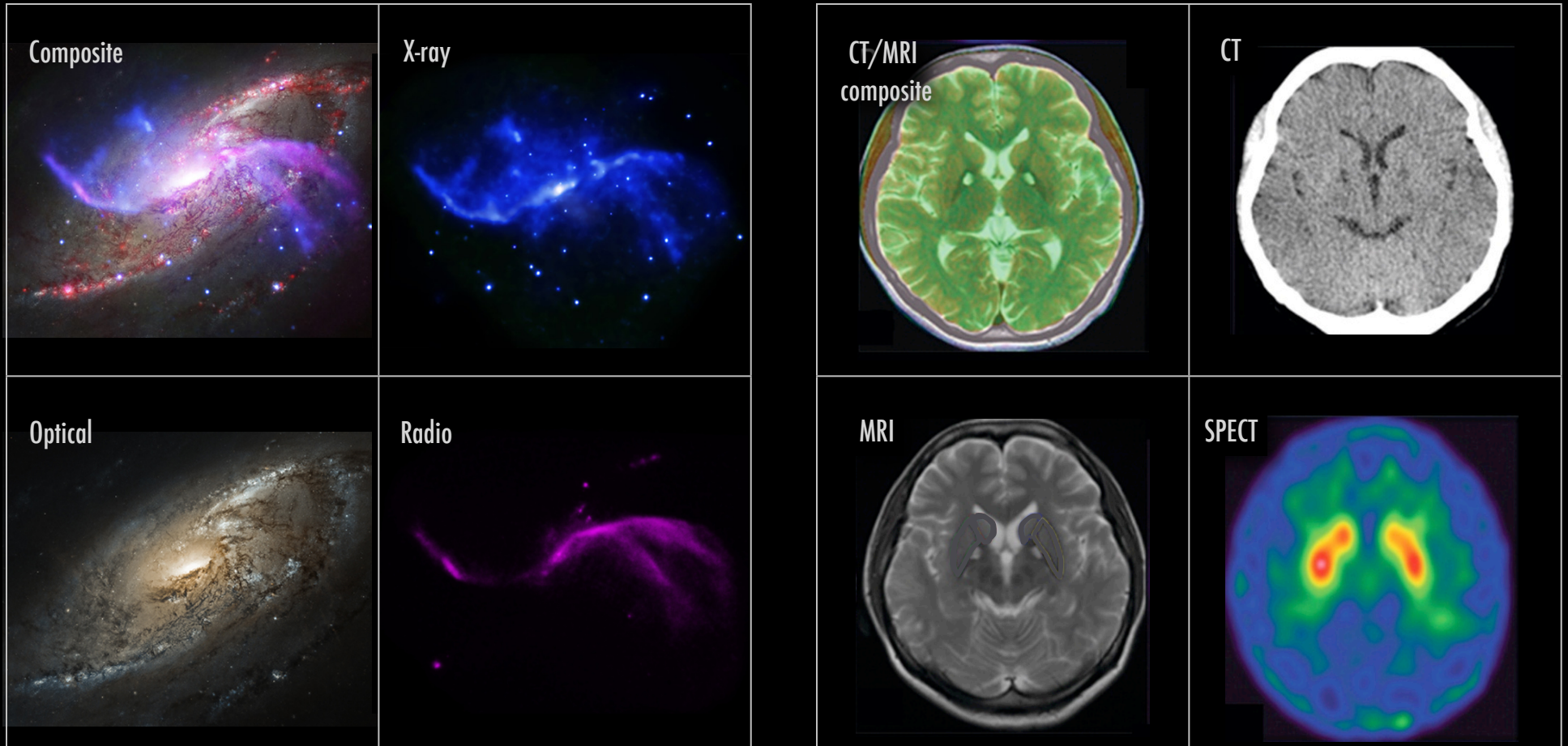


# ASTRONOMY, MEDICINE, AND THE FUTURE

ALYSSA A. GOODMAN, HARVARD-SMITHSONIAN CENTER FOR ASTROPHYSICS

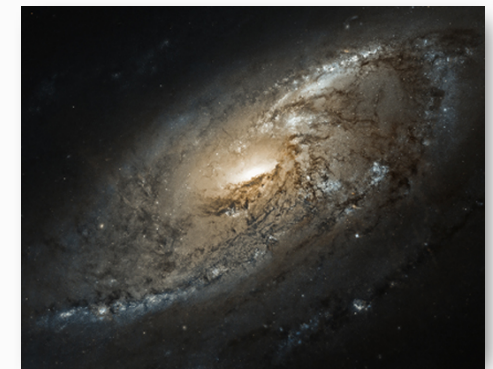
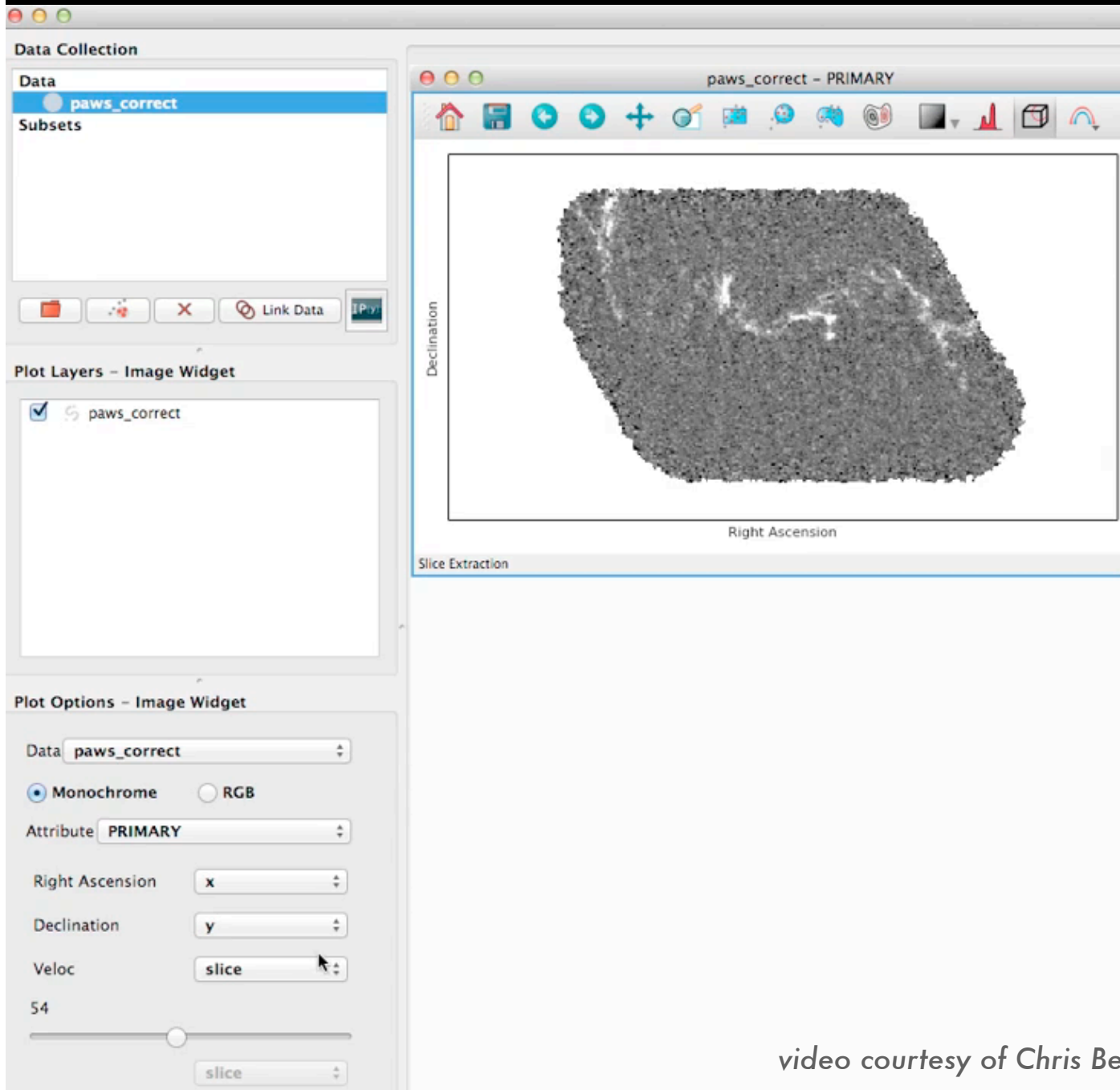


[chandra.harvard.edu/photo/2014/m106/](http://chandra.harvard.edu/photo/2014/m106/)

Chang, et al. 2011, [brain.oxfordjournals.org/content/134/12/3632](http://brain.oxfordjournals.org/content/134/12/3632)

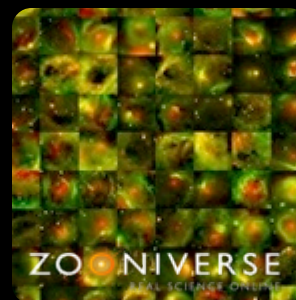
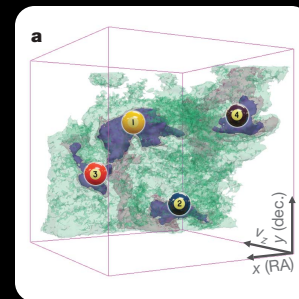
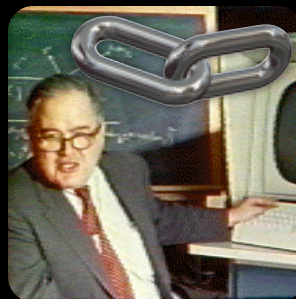
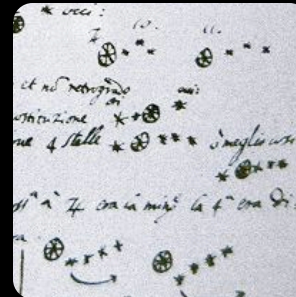
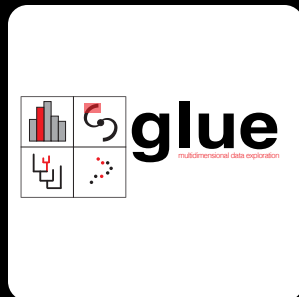
@aagie

# THIS WILL MAKE PERFECT SENSE, SOON...



*video courtesy of Chris Beaumont, lead glue developer 2012-14*





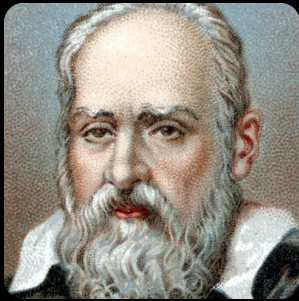
# RELATIVE STRENGTHS



**Pattern Recognition**  
**Creativity**



**Calculations**



# GALILEO GALILEI

(1564-1642)



*Sc. Principale.*

*Galileo Galilei, Familiare. Seruo della Ser. V. inuigilando*  
*do studium, et de ogni spirito di potere no solo scio sapia*  
*stuario che non della Lettera di Mathematici nelle Scuole*  
*di Padova,*

*Truare d'auere determinato di presentare al Sc. Principale*  
*l'istituto et il p. essere di giuramento inestimabile per ogni*  
*negotio et in ogni maniera o terrestre o celeste di tenere per*  
*lo nuovo artificio nel maggior profitto et utilita a disposizione*  
*di V. Ser. L'istituto cauato dalle piu re di speculazioni di*  
*prophetia in l'quantaggio di scoprire le cose et l'etere dell'inimico*  
*di V. Ser. et per di tempo prima et per di tempo poi et distinguere*  
*il numero et la qualita dei vasselli giudiare le sue forze*  
*per le forze alla caccia al combattimento o alla fuga, o pure alla*  
*nella campagna aperta vedere et particolarmente distinguere ogni suo*  
*motu et propriamente.*

*Adi 7. di Gennaio*  
*Gione si vede a V. Ser. \* \* \* \* \**  
*Adi 8. di*  
*Adi 12. di*  
*Adi 13. di*  
*Adi 14. di*  
*Adi 15. di*

|    |           |    |         |
|----|-----------|----|---------|
| 7  | * * O *   | 17 | * O     |
| 8  | O * * *   | 18 | * O     |
| 10 | * * O     | 19 | * O * * |
| 11 | * * O     | 20 | * O * * |
| 12 | * O *     | 21 | O * O O |
| 13 | * O * *   | 22 | ... O * |
| 14 | O * * * * | 23 | * O * * |
| 15 | O * *     | 24 | * O * * |
| 16 | O * *     | 25 | * O * * |
| 17 | * O *     | 26 | * O * * |

*SIDERIUS NUNCIUS*

On the third, at the seventh hour, the stars were arranged in this sequence. The eastern one was 1 minute, 30 seconds from Jupiter; the closest western one 2 minutes; and the other western one was 3 minutes removed from this one. They were absolutely on the same straight line and of equal magnitude.

On the fourth, at the second hour, there were four stars around Jupiter, two to the east and two to the west, and arranged precisely on a straight line, as in the adjoining figure. The easternmost was distant 3 minutes from the next one, while this one was 40 seconds from Jupiter; Jupiter was 4 minutes from the nearest western one and this one 6 minutes from the westernmost one. Their magnitudes were nearly equal; the one closest to Jupiter appeared a little smaller than the rest. But at the seventh hour the eastern stars were only 30 seconds apart. Jupiter was 2 minutes from the nearer eastern one, while he was 4 minutes from the next western one, and this one was 3 minutes from the westernmost one. They were all equal and extended on the same straight line along the ecliptic.

On the fifth, the sky was cloudy.

On the sixth, only two stars appeared flanking Jupiter, as is seen in the adjoining figure. The eastern one was 2 minutes and the western one 3 minutes from Jupiter. They were on the same straight line with Jupiter and equal in magnitude.

On the seventh, two stars stood near Jupiter. both to the east.





# "REMOTE SENSING"



## GALILEO'S "NEW ORDER"

Created by Alyssa Goodman, Curtis Wong  
with advice from Owen Gingerich and David



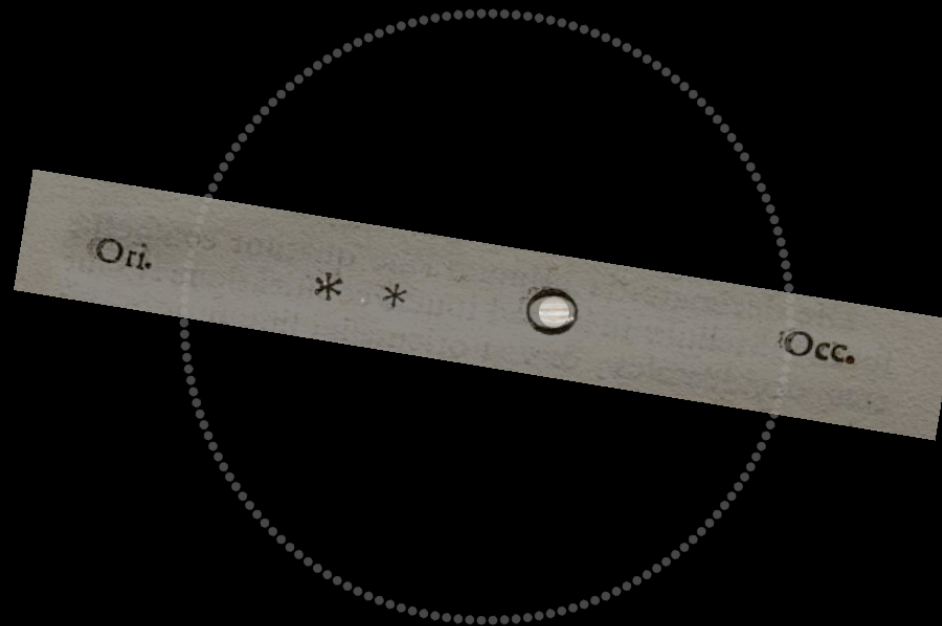
*Galileo's New Order, A WorldWide Telescope Tour by Goodman, Wong & Udomprasert 2010  
Microsoft Research WWT Software (~now "OpenWWT"): Wong (inventor), Fay (architect), et al.*



# REMOTE SENSING + 3D MODELLING

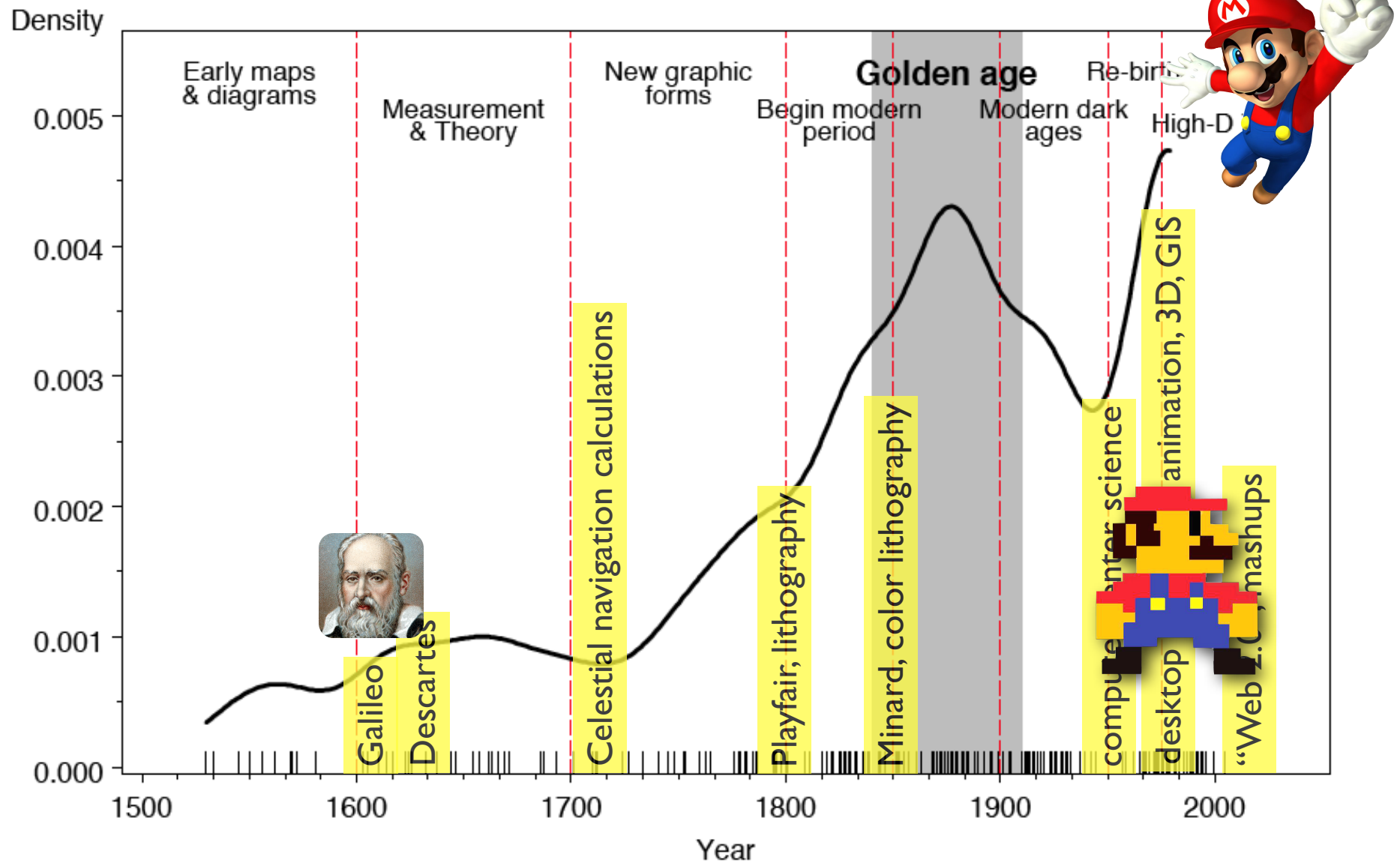


January 11, 1610



*Galileo's New Order, A WorldWide Telescope Tour by Goodman, Wong & Udomprasert 2010  
Microsoft Research WWT Software (~now "OpenWWT"): Wong (inventor), Fay (architect), et al.*

## Milestones: Time course of developments



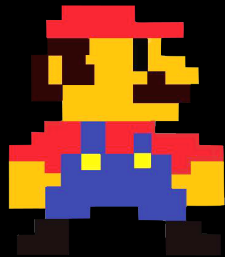
adapted from Friendly, "The Golden Age of Statistical Graphics," *Statistical Science*, 2009



1992



Super Mario Kart: Rainbow Road (1992)

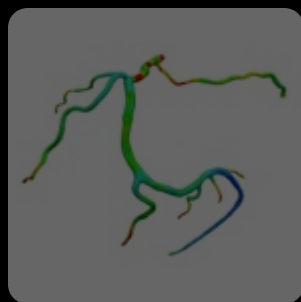
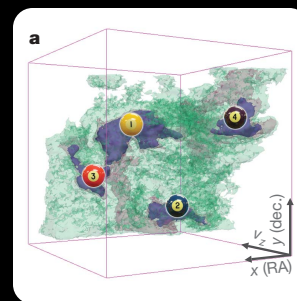
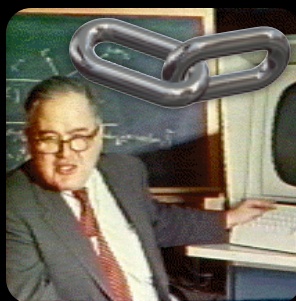
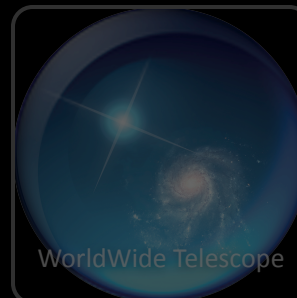
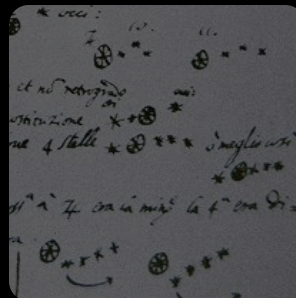
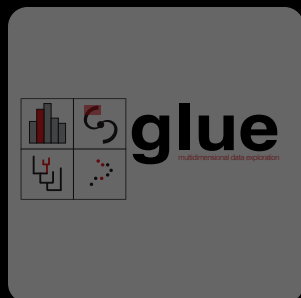


2014



Mario Kart 8: Rainbow Road (2014)





1610



SIDEREUS NUNCIIUS

On the third, at the seventh hour, the sequence. The eastern one was 1 minute, the closest western one 2 minutes; and the

East \* ○ \* West

10 minutes removed from this one. They were absolutely on the same straight line and of equal magnitude.

On the fourth, at the second hour, there were four stars around Jupiter, two to the east and two to the west, and arranged precisely

East \* \* ○ \* \* West

on a straight line, as in the adjoining figure. The easternmost was distant 3 minutes from the next one, while this one was 40 seconds from Jupiter; Jupiter was 4 minutes from the nearest western one, and this one 6 minutes from the westernmost one. Their magnitudes were nearly equal; the one closest to Jupiter appeared than the rest. But at the seventh hour the eastern 30 seconds apart. Jupiter was 2 minutes from the

East \*\* ○ \*\*

one, while he was 4 minutes from the next western one was 3 minutes from the westernmost one. They extended on the same straight line along the ec

On the fifth, the sky was cloudy.

On the sixth, only two stars appeared flanking Ju

East \* ○ \*

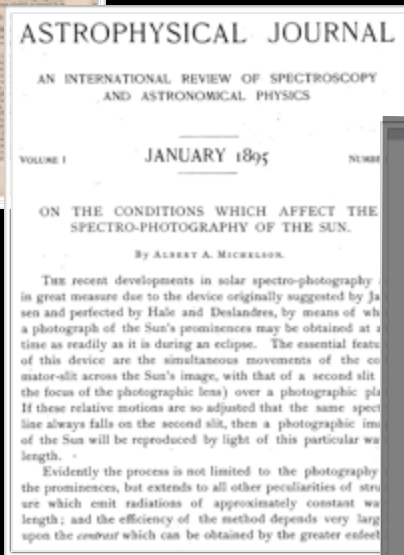
in the adjoining figure. The eastern one was 2 m western one 3 minutes from Jupiter. They were on th line with Jupiter and equal in magnitude.

On the seventh, two stars stood near Jupiter, b arranged in this manner.

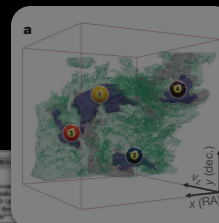
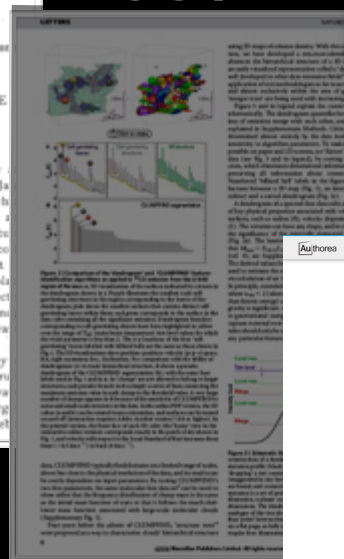
1665



1895



2009



2015





# The "Paper" of the Future

Alyssa Goodman, Josh Peek, Alberto Accomazzi, Chris Beaumont, Christine L. Borgman, How-Huan Hope Chen, Merce Crosas, Christopher Erdmann, August Muench, Alberto Pepe, Curtis Wong

+ Add author

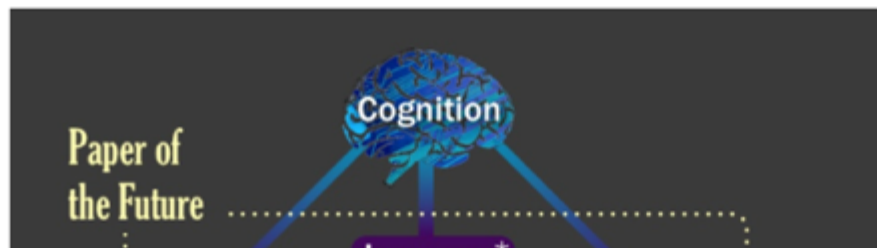
Re-arrange authors

A 5-minute video demonstration of this paper is available at [this YouTube link](#).

## 1 Preamble

A variety of research on human cognition demonstrates that humans learn and communicate best when more than one processing system (e.g. visual, auditory, touch) is used. And, related research also shows that, no matter how technical the material, most humans also retain and process information best when they can put a narrative "story" to it. So, when considering the future of scholarly communication, we should be careful not to do blithely away with the linear narrative format that articles and books have followed for centuries: instead, we should enrich it.

Much more than text is used to communicate in Science. Figures, which include images, diagrams, graphs, charts, and more, have enriched scholarly articles since the time of Galileo, and ever-growing volumes of data underpin most scientific papers. When scientists communicate face-to-face, as in talks or small discussions, these figures are often the focus of the conversation. In the best discussions, scientists have the ability to manipulate the figures, and to access underlying data, in real-time, so as to test out various what-if scenarios, and to explain findings more clearly. **This short article explains—and shows with demonstrations—how scholarly "papers" can morph into long-lasting rich records of scientific discourse, enriched with deep data and code linkages, interactive figures, audio, video, and commenting.**



3

Konrad Hinsén 3 days ago · Public

Many good suggestions, but if the goal is "long-lasting rich records of scientific discourse", a more careful and critical attitude towards electronic artifacts is appropriate. I do see it concerning videos, but not a word on the much more critical situation in software. Archiving source code is not sufficient: all the dependencies, plus the complete build environment, would have to be conserved as well to make things work a few years from now. An "executable figure" in the form of an IPython notebook will...

[more](#)

2

Merce Crosas 3 days ago · Public

Konrad, good points; this has been a concern for the community working on reproducibility. Regarding data repositories, Dataverse handles long-term preservation and access of data files in the following way: 1) for some data files that the repository recognizes (such as R Data, SPSS, STATA), which depend on a statistical package, the system converts them into a preservation format (such as a tab/CSV format). Even though the original format is also saved and can be accessed, the new preservation format gua...

[more](#)

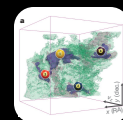
Konrad Hinsén 1 day ago · Public

That sounds good. I hope more repositories will follow the example of Dataverse. Figshare in particular has a very different attitude, encouraging researchers to deposit as much as possible. That's perhaps a good strategy to change habits, but in the long run it could well backfire when people find out in a few years that 90% of those deposits have become useless.

0

Christine L. Borgman 4 months ago · Private

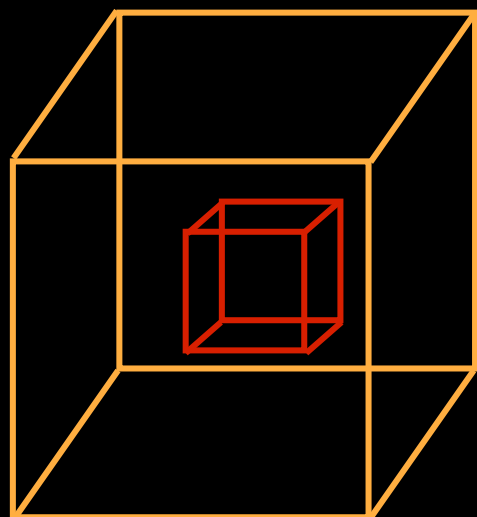
"publications"



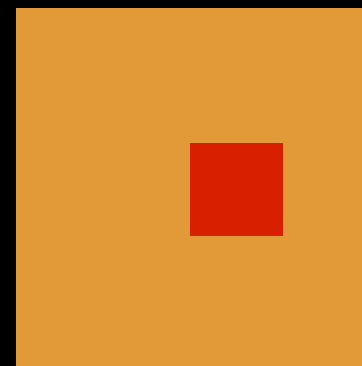
# LINKED VIEWS OF HIGH-DIMENSIONAL DATA



John Tukey

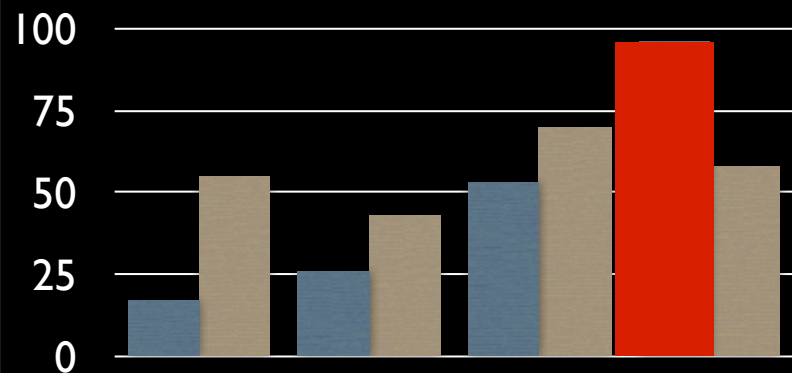


3D

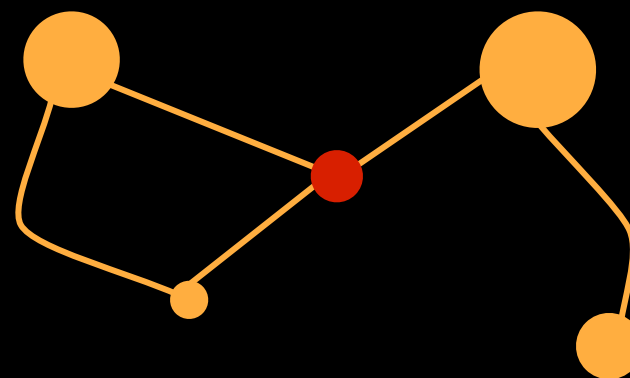


2D

## Statistics

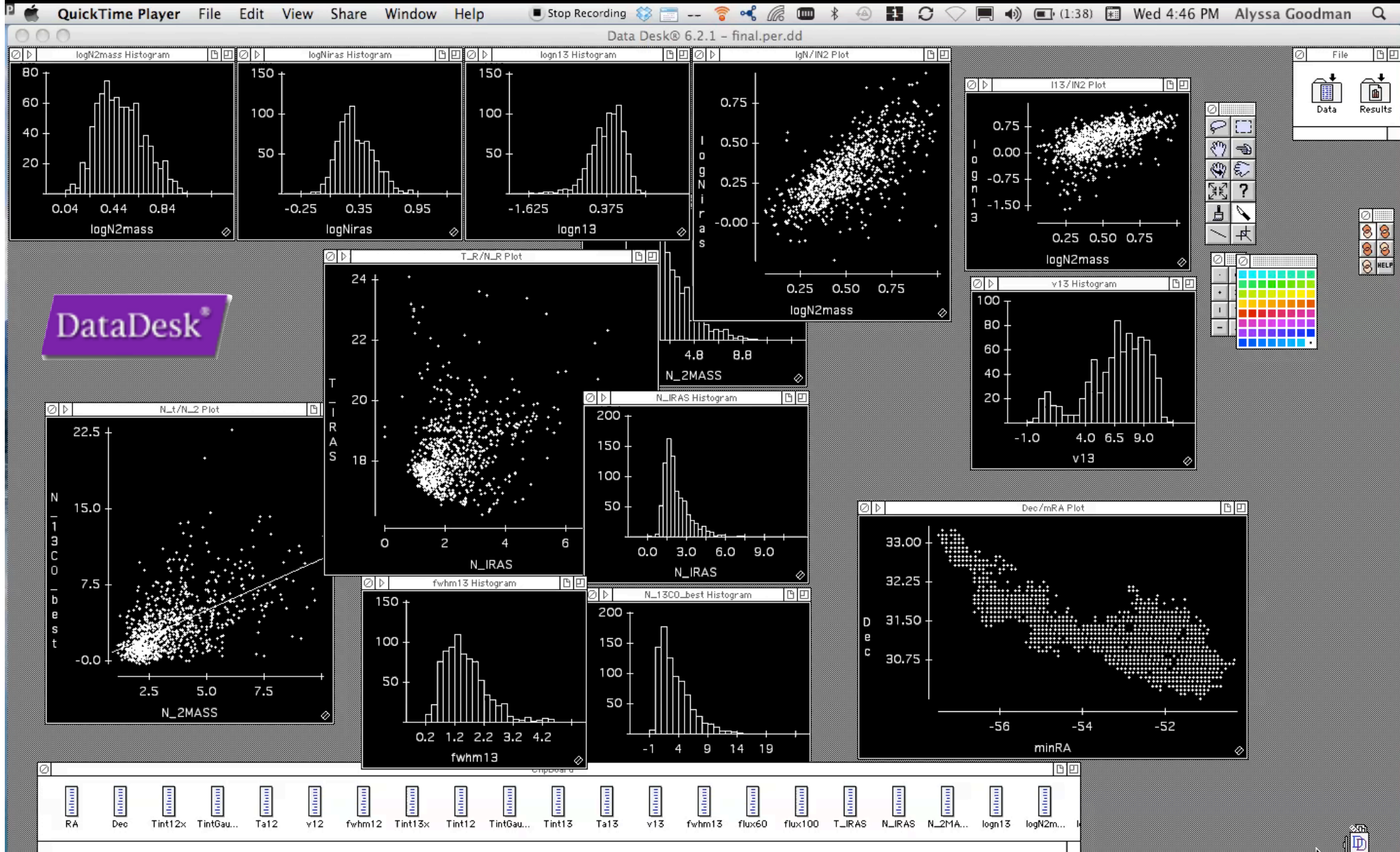


## Data Abstraction





# DATADESK (EST. 1986)





## A hand in a suit sleeve points to a diagram on a green chalkboard. The diagram shows a central node connected to several other nodes, with a play button icon in the center.

PRIM-H

# XGobi

# GGobi

RGGobi

# Polaris



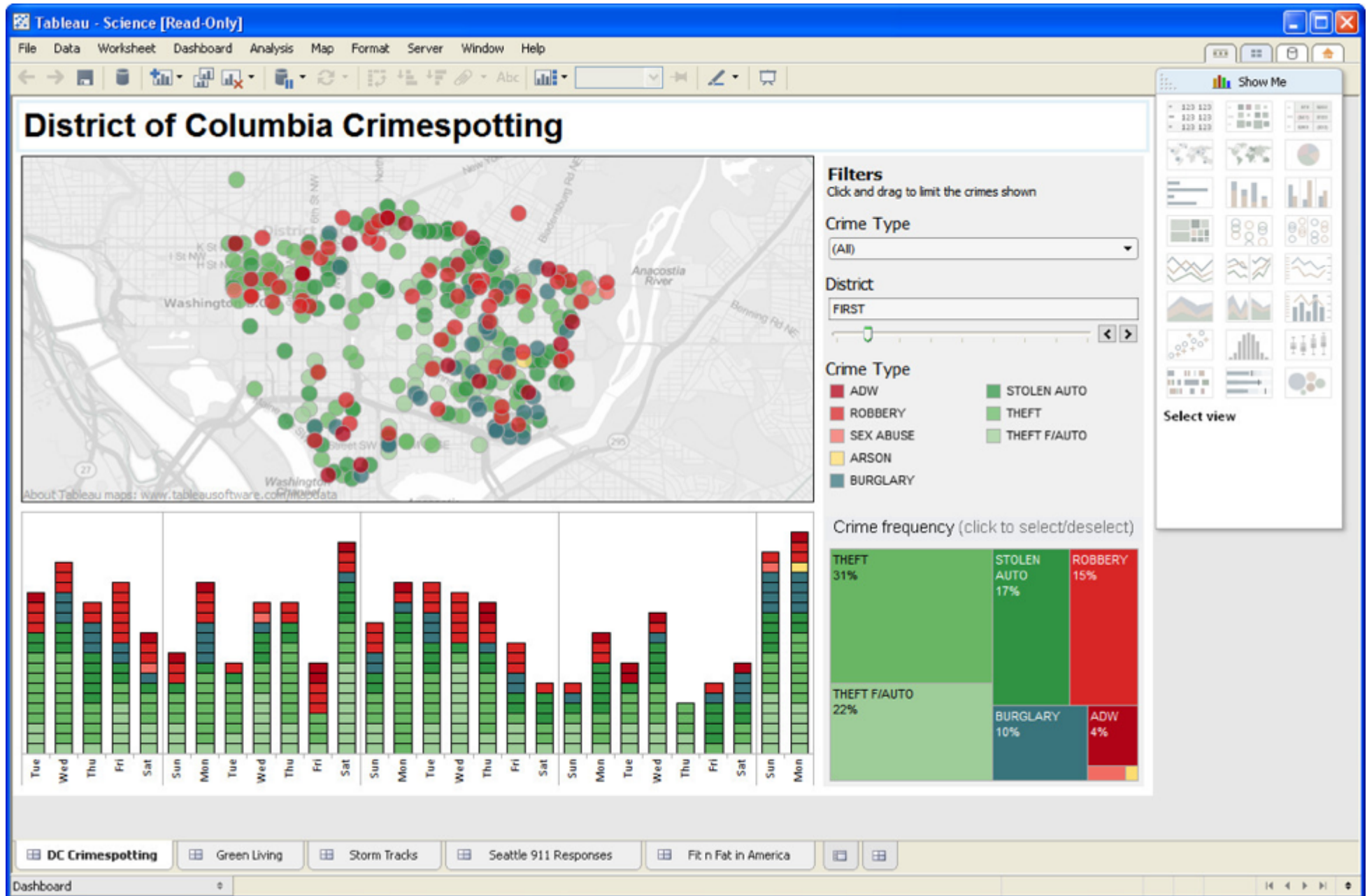
# 1970

# 1980

# 1990

# 2000

# 2010





# WIDE DATA

COMPLETE

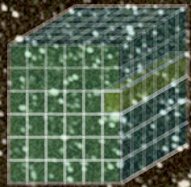
mm peak (Enoch et al. 2006)

sub-mm peak (Hatchell et al. 2005, Kirk et al. 2006)

$^{13}\text{CO}$  (Ridge et al. 2006)

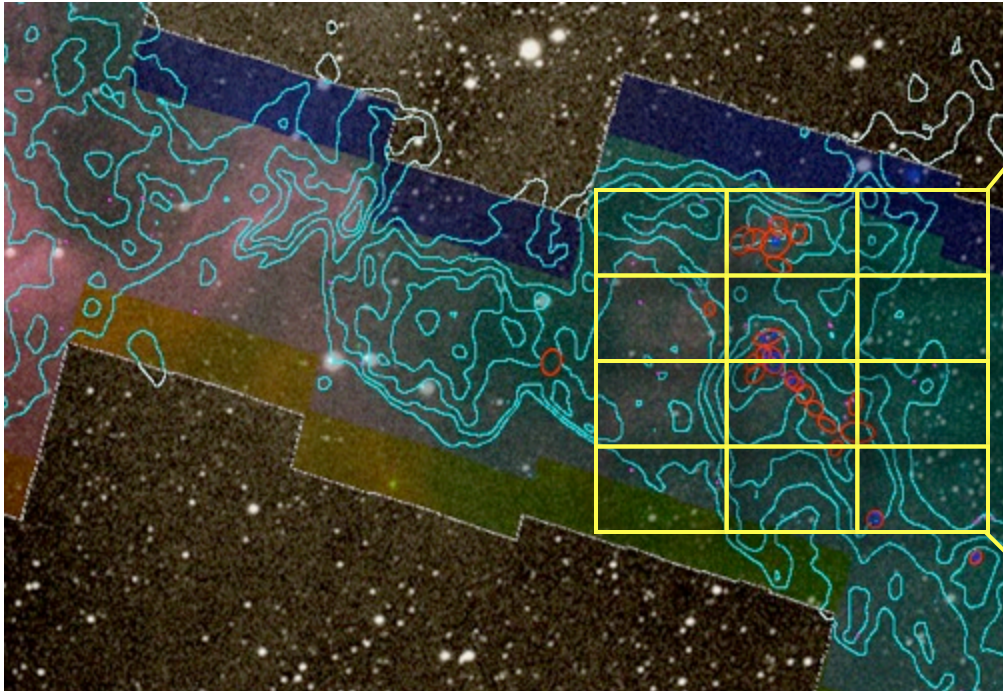
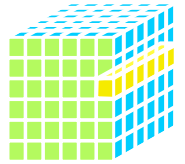
mid-IR IRAC composite from c2d data (Foster, Laakso, Ridge, et al.)

Optical image (Barnard 1927)

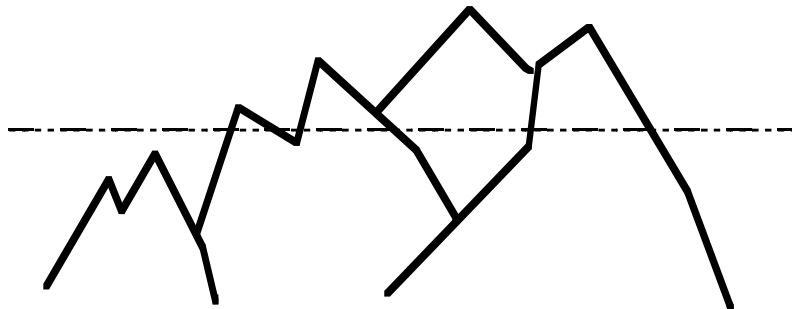
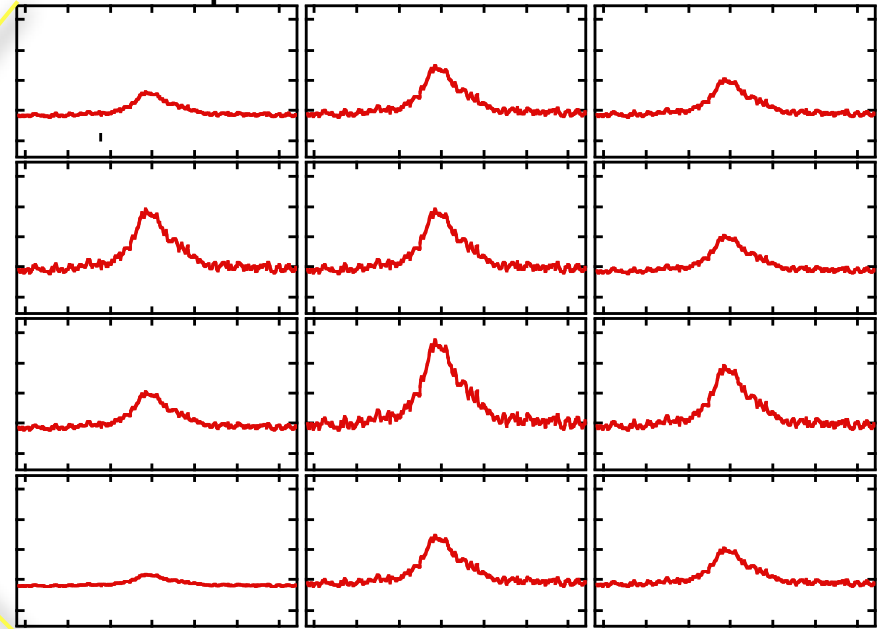




# HIDDEN "3D" IN ASTRONOMY



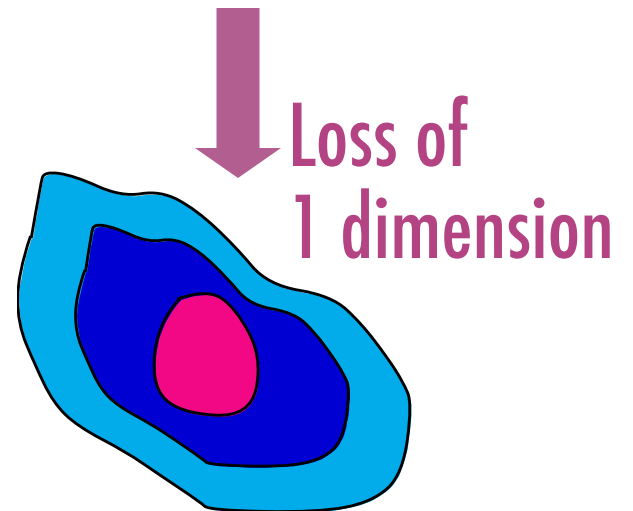
Spectral Line Observations



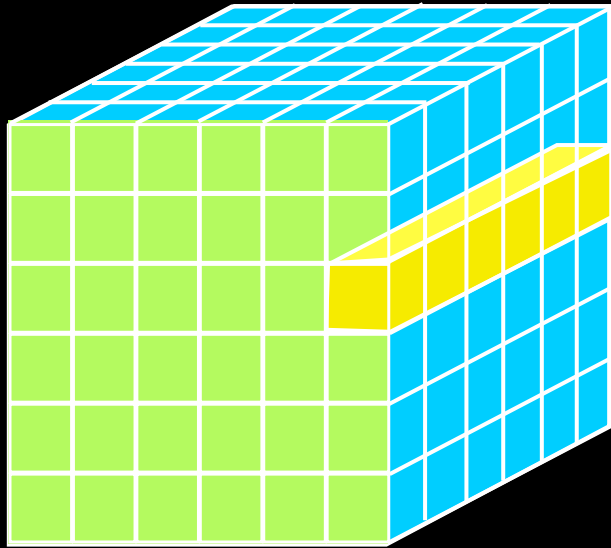
Mountain Range



No loss of  
information







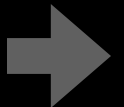
## THINKING ABOUT DIMENSIONS

**1D:** Columns = "Spectra", "SEDs" or "Time Series" (x-y Graphs)

**2D:** Faces or Slices = "Images"

**3D:** Volumes = "3D Renderings", "2D Movies"

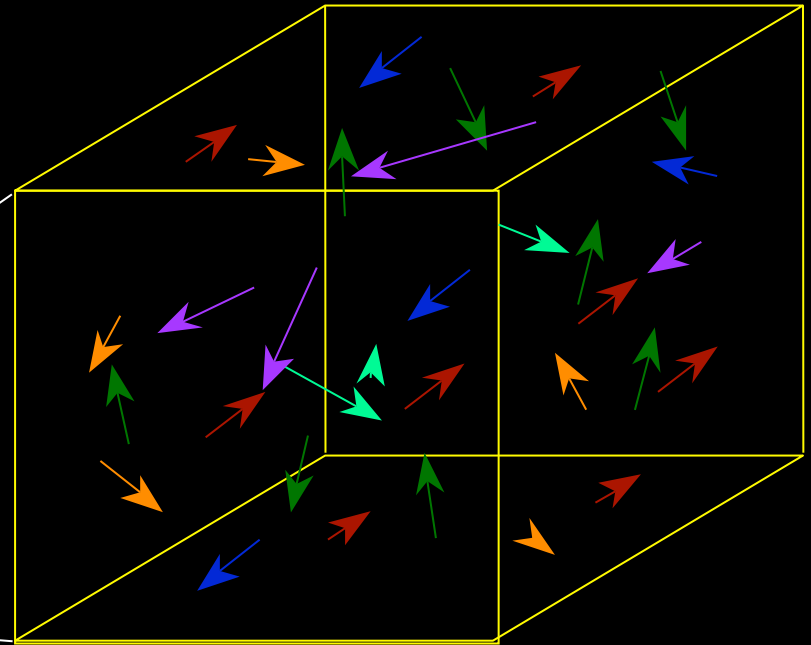
**4D:** Time Series of Volumes = "3D Movies"



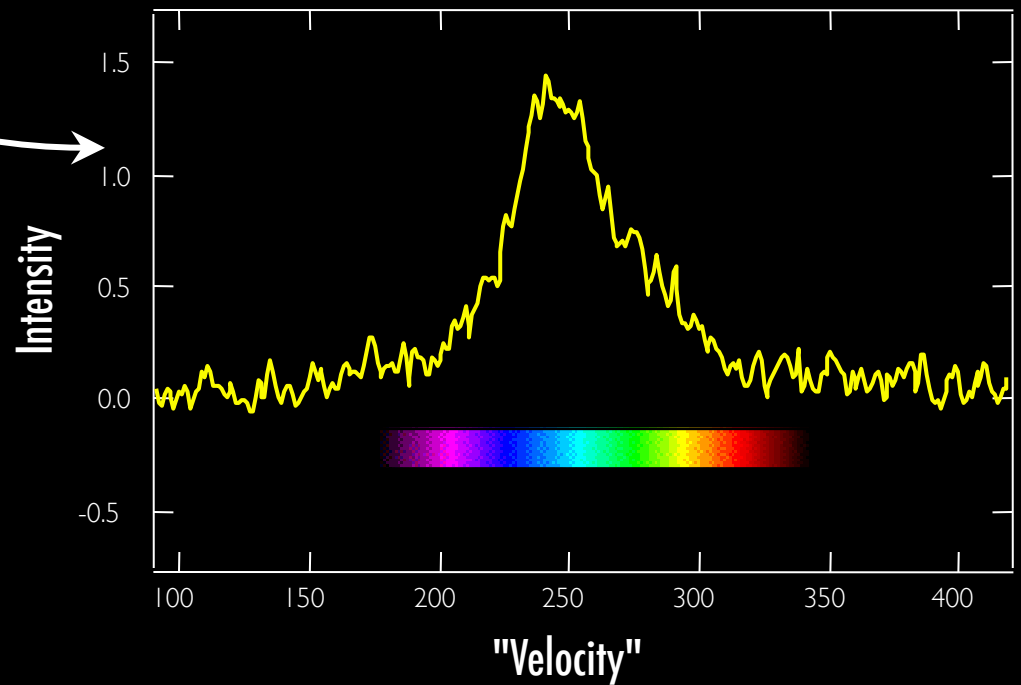
VELOCITY FROM  
SPECTROSCOPY



Telescope +  
Spectrometer



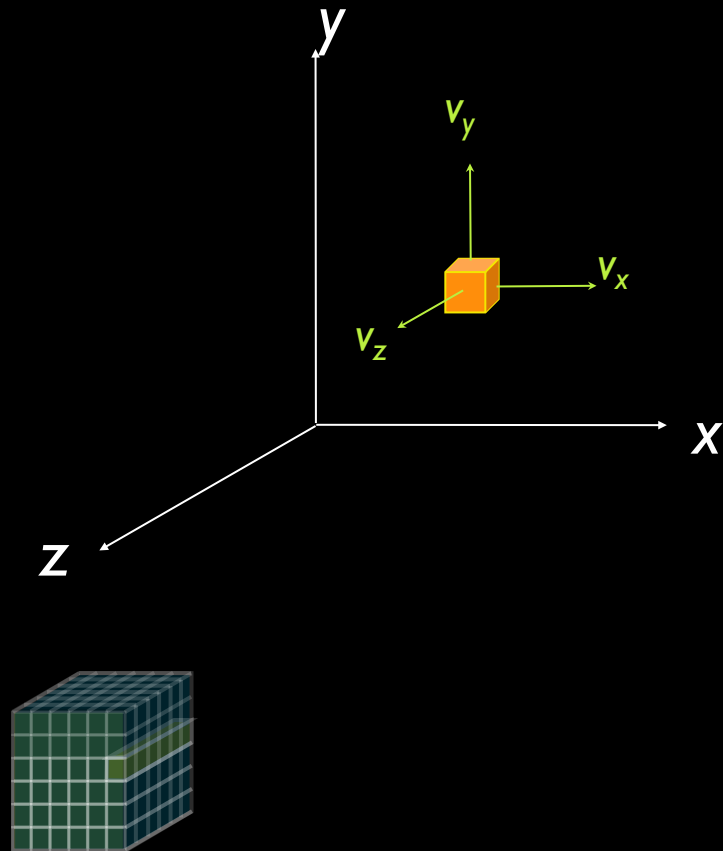
*Observed Spectrum*



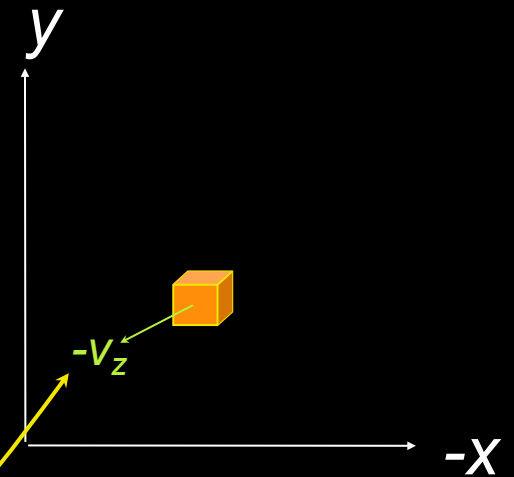
All thanks to Doppler

# SPECTRAL-LINE MAPPING GIVES A "THIRD" DIMENSION

We wish we could measure...



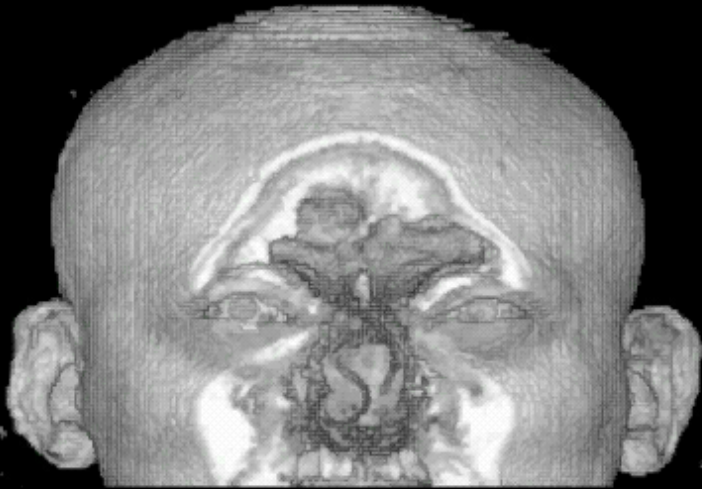
**But** we can measure...



$v_z$  **only**  
from  
"spectral-line maps"

This is called  
"p-p-v" or  
"position-position-  
velocity" space.

“KEITH”



“z” is depth into head

“PERSEUS”








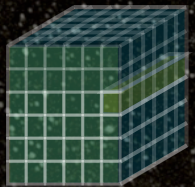
“z” is line-of-sight velocity

*(This kind of “series of 2D slices view” is known in the Viz as “the grand tour”)*



# WIDE DATA, "IN 3D"

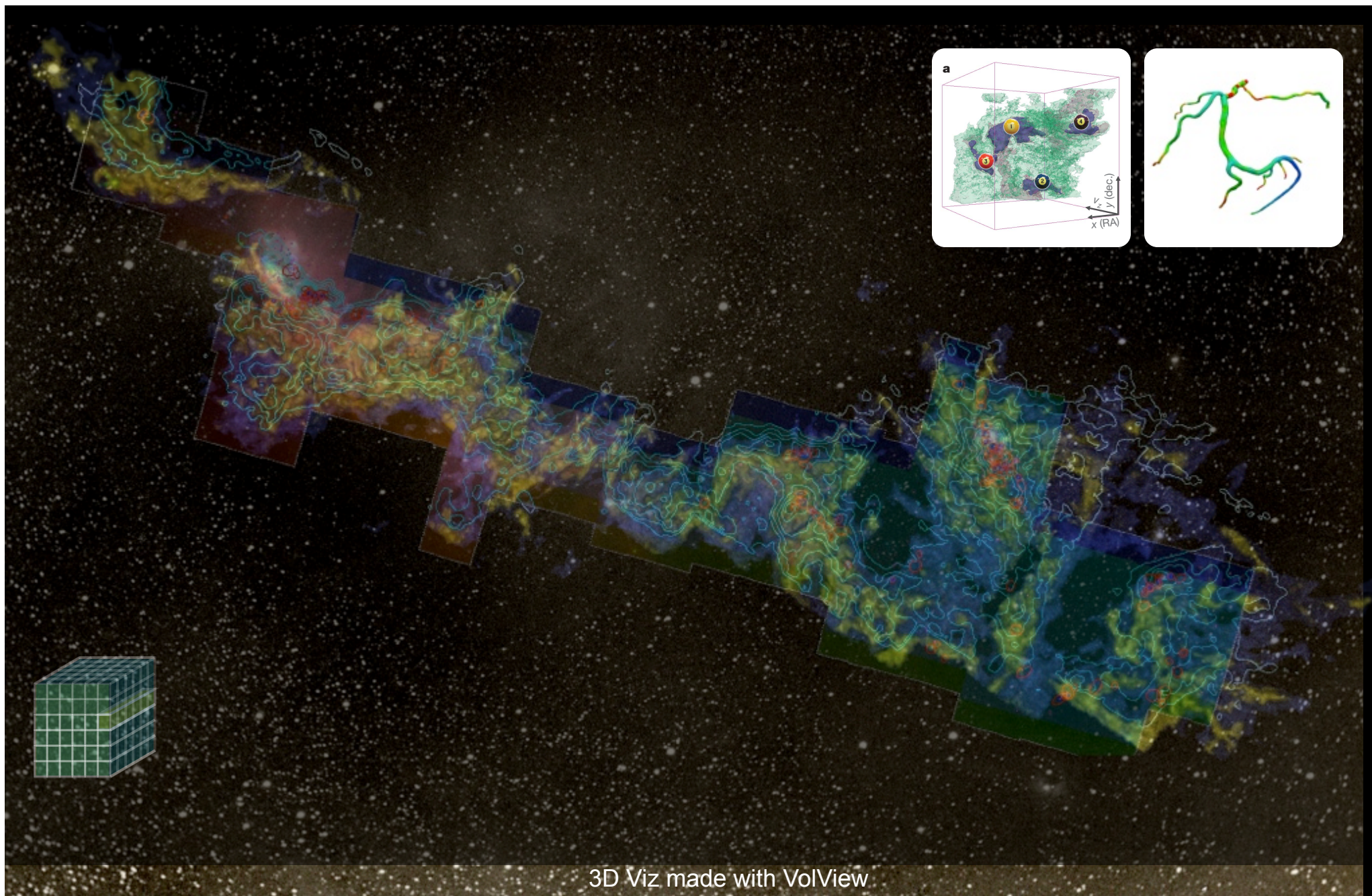
-  mm peak (Enoch et al. 2006)
-  sub-mm peak (Hatchell et al. 2005, Kirk et al. 2006)
-   $^{13}\text{CO}$  (Ridge et al. 2006)
-  mid-IR IRAC composite from c2d data (Foster, Laakso, Ridge, et al.)
-  Optical image (Barnard 1927)



m: 1/249  
zoom: 227% Angle: 0







AstronomicalMedicine@iic

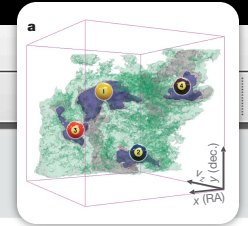
COMPLETE



Four years before the advent of CLUMPFIND, ‘structure trees’<sup>9</sup> were proposed as a way to characterize clouds’ hierarchical structure

Goodman et al. 2009, Nature,  
cf: Fluke et al. 2009





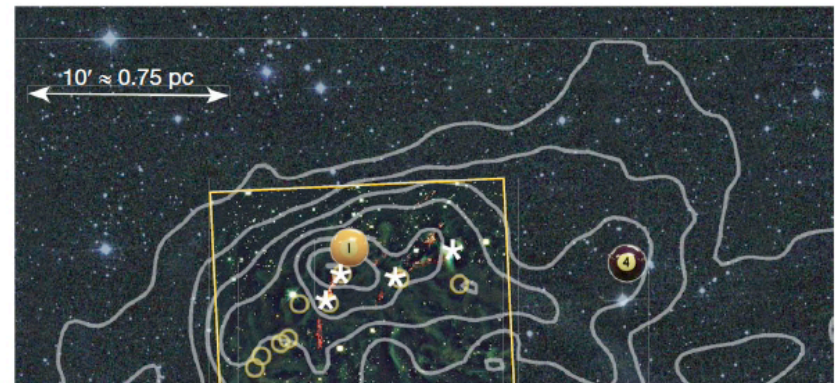
## LETTERS

# A role for self-gravity at multiple length scales in the process of star formation

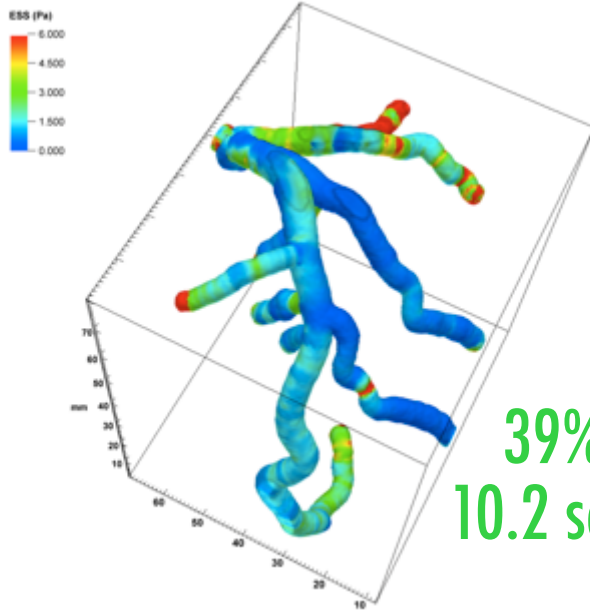
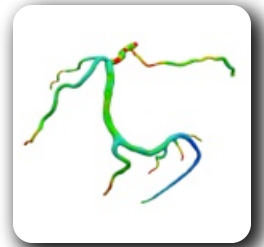
Alyssa A. Goodman<sup>1,2</sup>, Erik W. Rosolowsky<sup>2,3</sup>, Michelle A. Borkin<sup>1,†</sup>, Jonathan B. Foster<sup>2</sup>, Michael Halle<sup>1,4</sup>, Jens Kauffmann<sup>1,2</sup> & Jaime E. Pineda<sup>2</sup>

Self-gravity plays a decisive role in the final stages of star formation, where dense cores (size  $\sim 0.1$  parsecs) inside molecular clouds collapse to form star-plus-disk systems<sup>1</sup>. But self-gravity's role at earlier times (and on larger length scales, such as  $\sim 1$  parsec) is unclear; some molecular cloud simulations that do not include self-gravity suggest that 'turbulent fragmentation' alone is sufficient to create a mass distribution of dense cores that resembles, and sets, the stellar initial mass function<sup>2</sup>. Here we report a 'den-drogram' (hierarchical tree-diagram) analysis that reveals that self-gravity plays a significant role over the full range of possible scales traced by  $^{13}\text{CO}$  observations in the L1448 molecular cloud, but not everywhere in the observed region. In particular, more than 90 per cent of the compact 'pre-stellar cores' traced by peaks of dust emission<sup>3</sup> are projected on the sky within one of the den-drogram's self-gravitating 'leaves'. As these peaks mark the locations of already-forming stars, or of those probably about to form, a self-gravitating cocoon seems a critical condition for their exist-

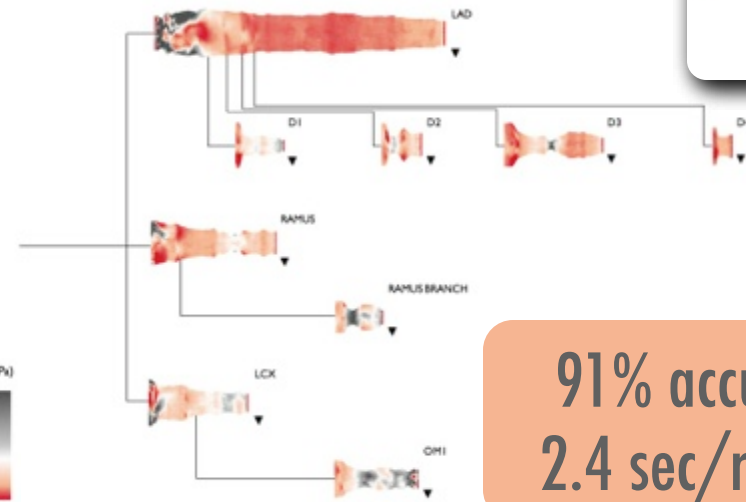
overlapping features as an option, significant emission found between prominent clumps is typically either appended to the nearest clump or turned into a small, usually 'pathological', feature needed to encompass all the emission being modelled. When applied to molecular-line



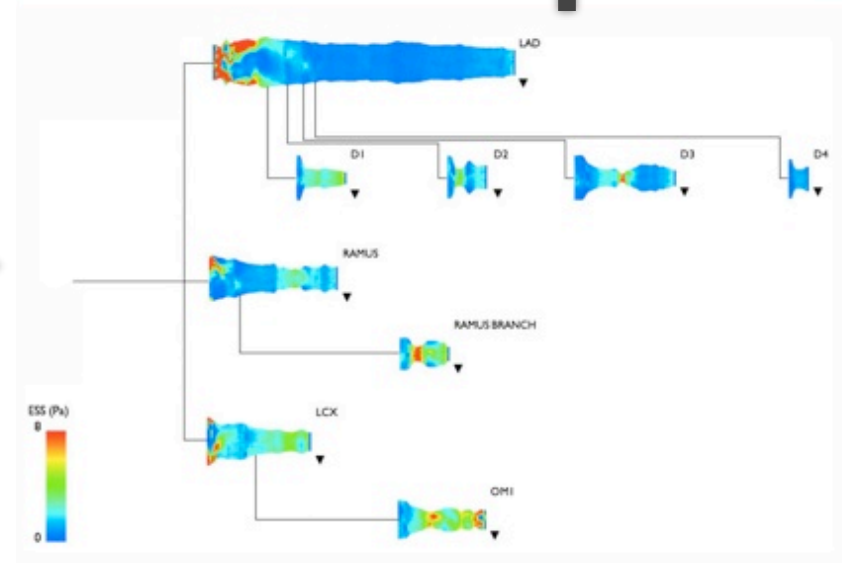
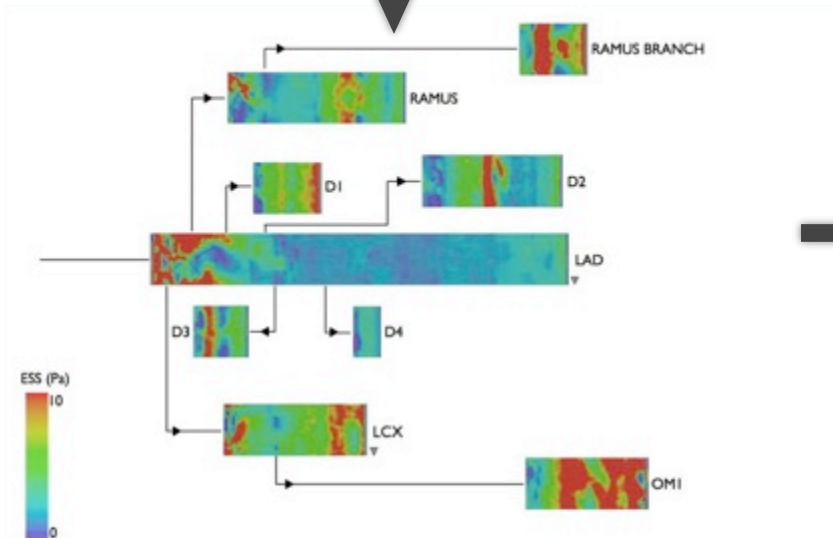
# "DENDROGRAMS" IN MEDICINE



39% accurate  
10.2 sec/region

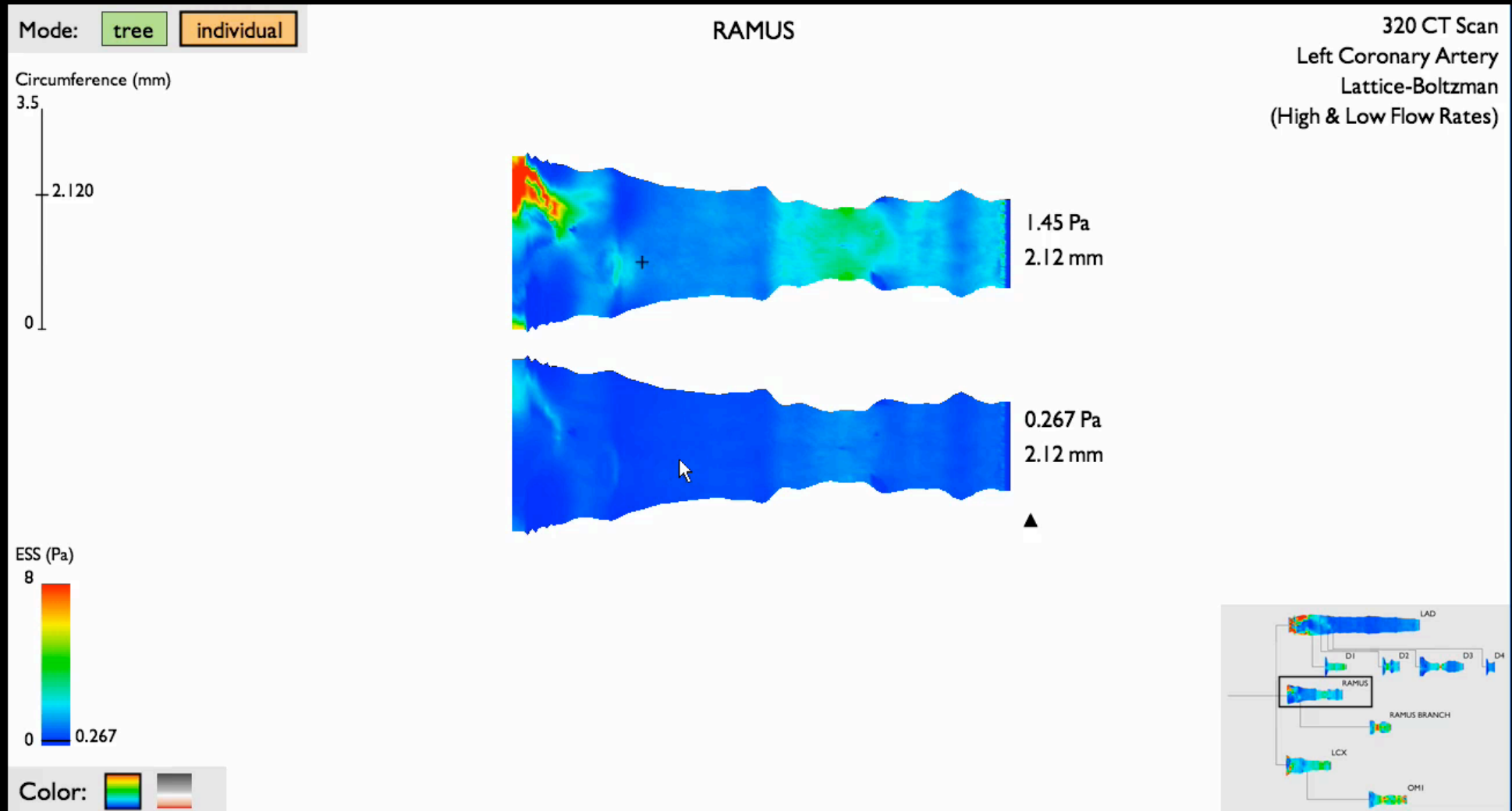


91% accurate  
2.4 sec/region



Borkin et al. 2011  
cf. [colorbrewer2.org](http://colorbrewer2.org)

# INTERACTIVE (LINKED) VIEW

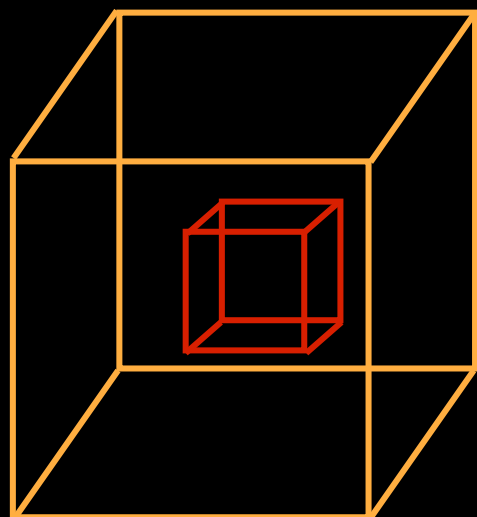




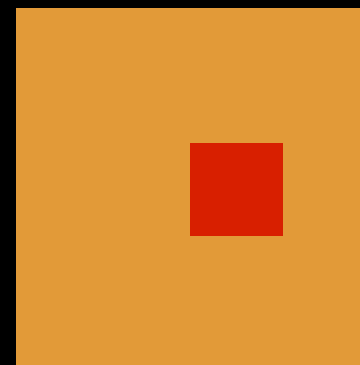
# LINKED VIEWS OF HIGH-DIMENSIONAL DATA



John Tukey

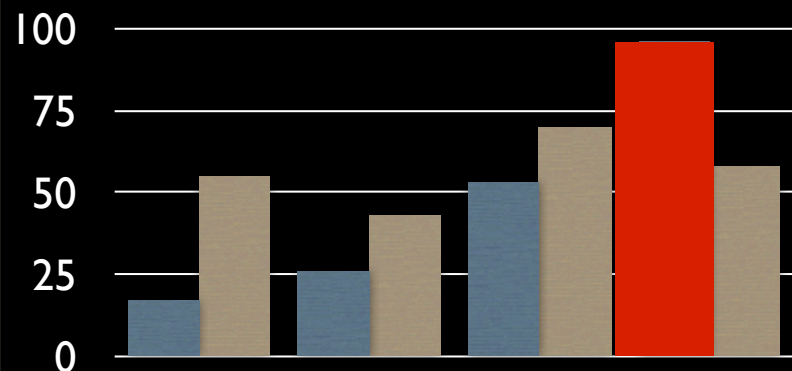


3D

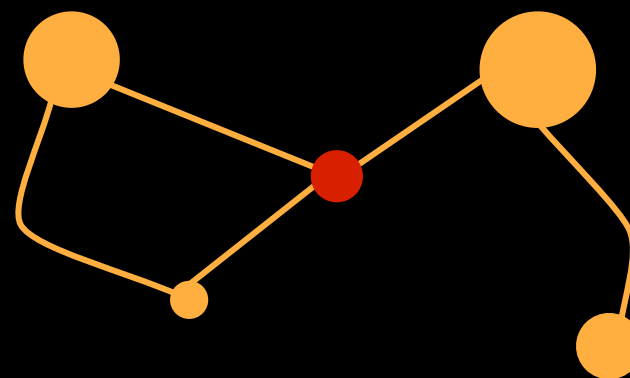


2D

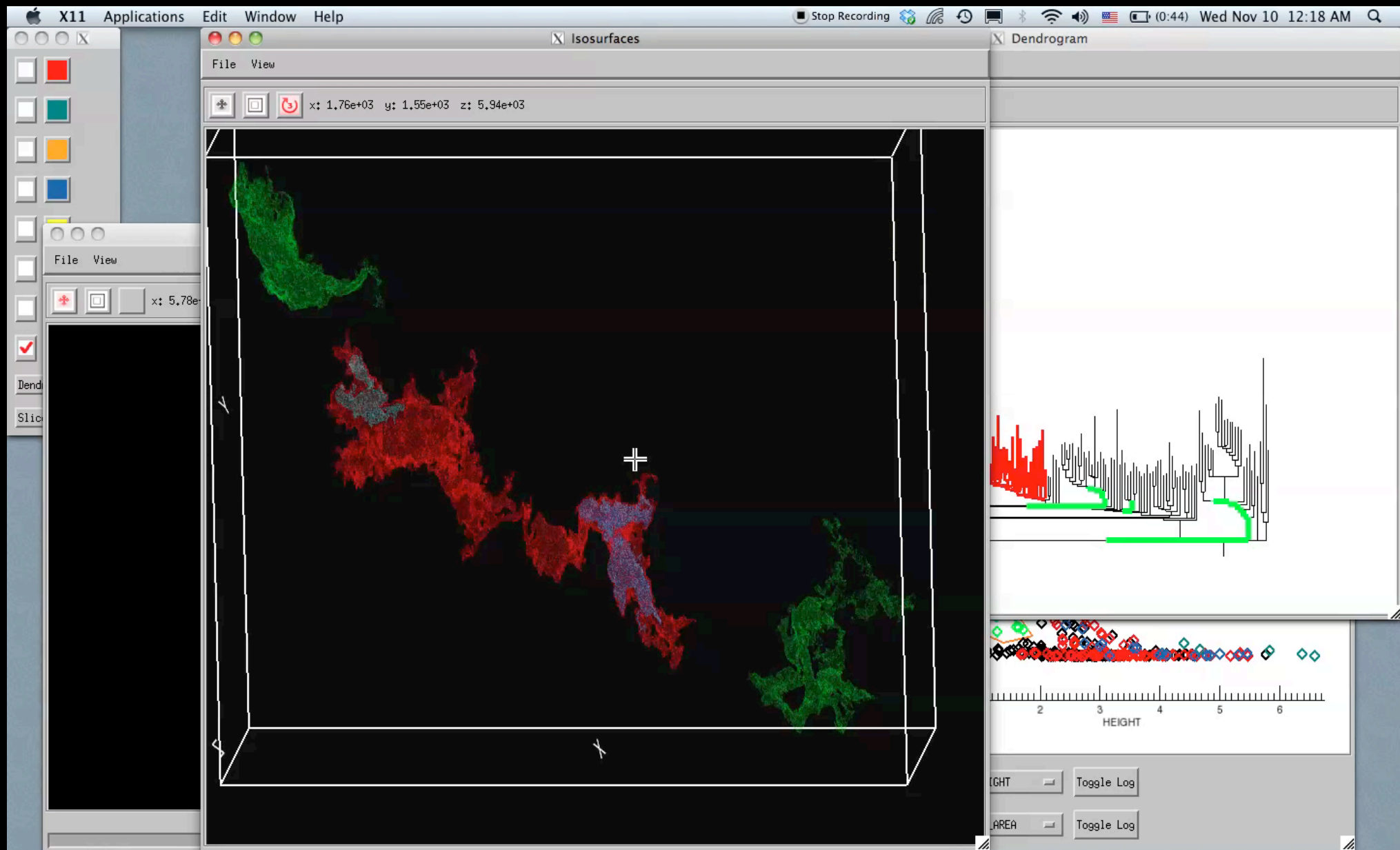
## Statistics



## Data Abstraction



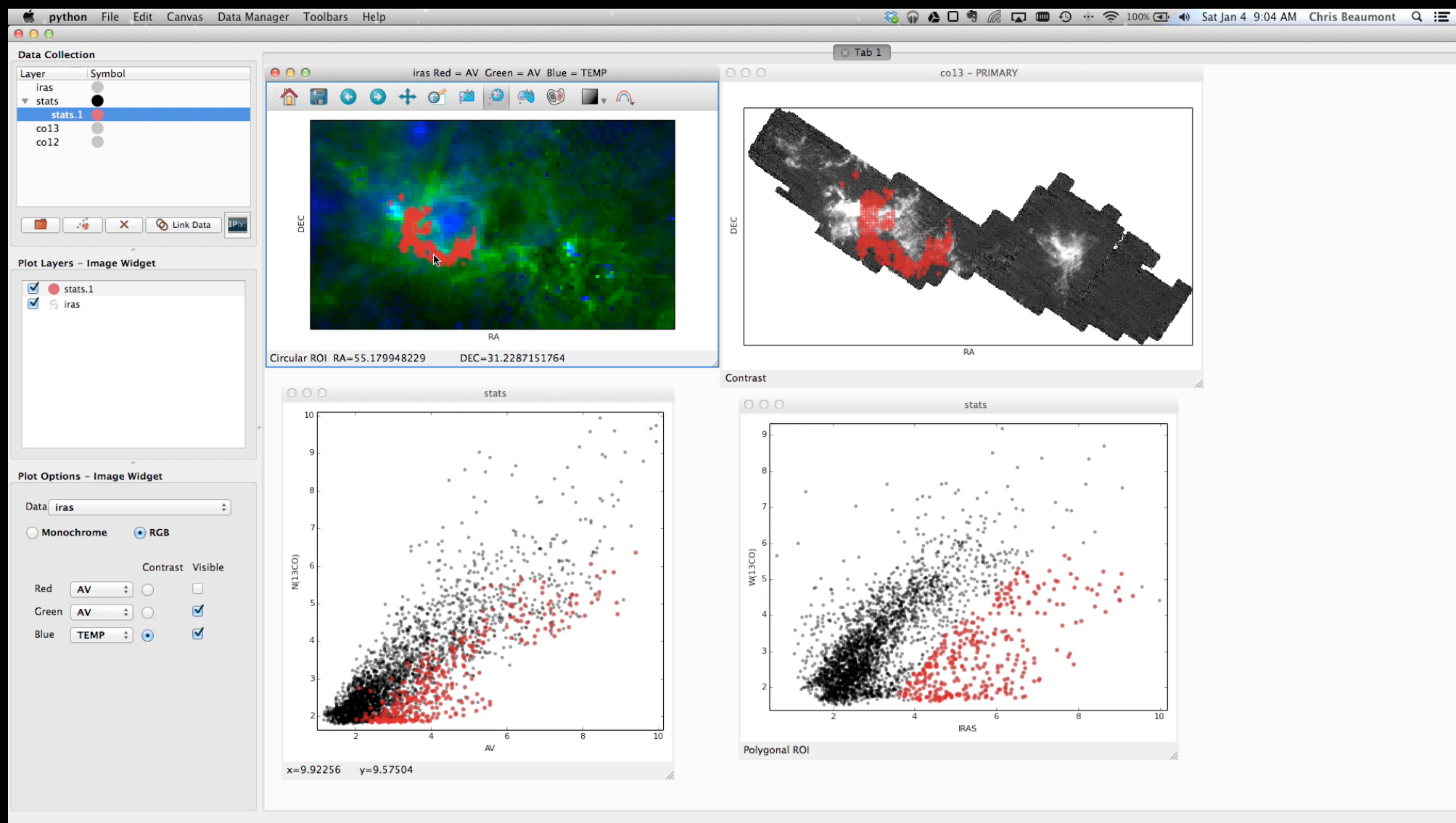
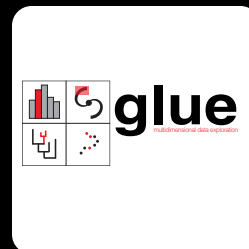
# LINKED VIEWS OF HIGH-DIMENSIONAL DATA



Video & implementation: Christopher Beaumont, Harvard→Counsyl;  
inspired by AstroMed work of Douglas Alan, Michelle Borkin, AG, Michael Halle, Erik Rosolowsky

# LINKED VIEWS OF HIGH-DIMENSIONAL DATA (IN PYTHON)

## GLUE

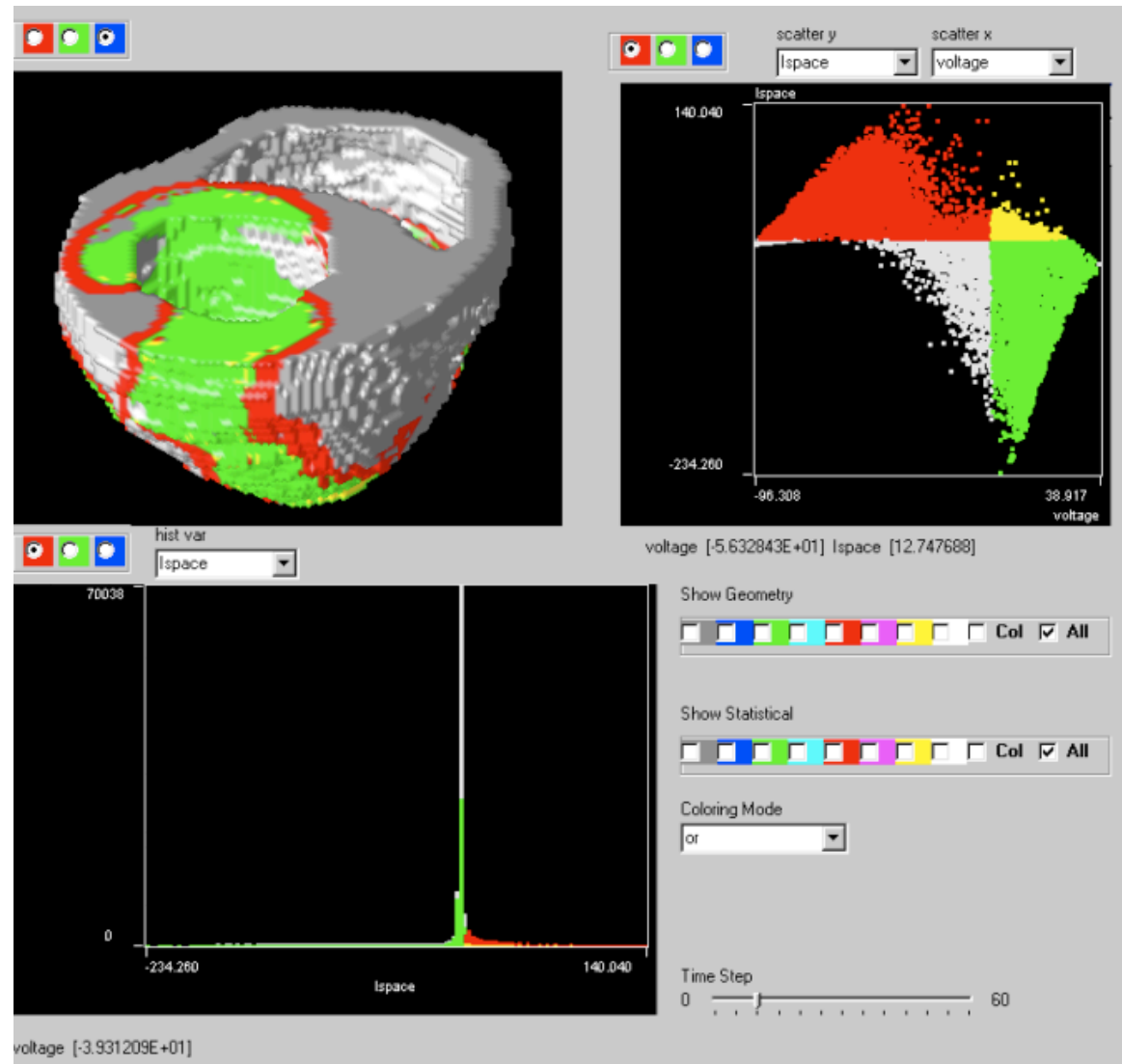


Christopher Beaumont, w/A. Goodman, T. Robitaille & M. Borkin

# WEAVE: A System for Visually Linking 3-D and Statistical Visualizations, Applied to Cardiac Simulation and Measurement Data

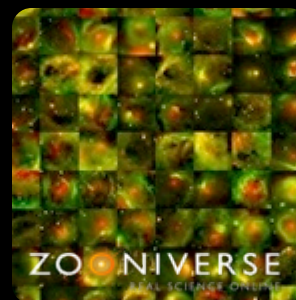
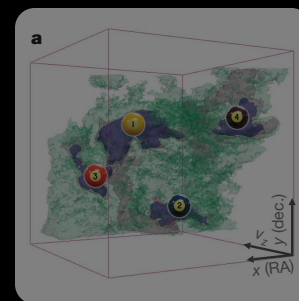
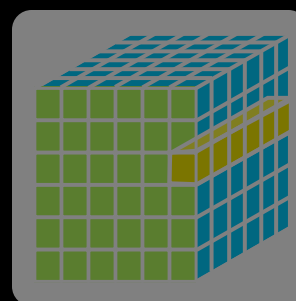
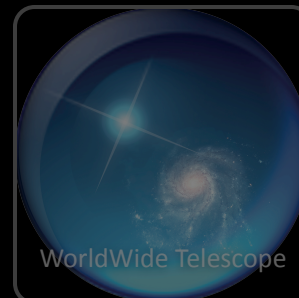
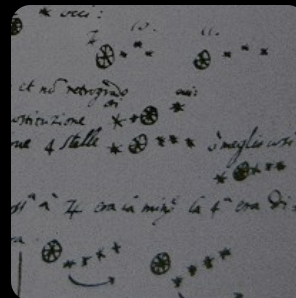
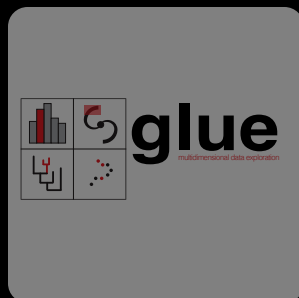
D.L. Gresh and B.E. Rogowitz\*  
IBM T.J. Watson Research Center

R.L. Winslow, D.F. Scollan, and C.K. Yung †  
Department of Biomedical Engineering, Johns Hopkins University School of Medicine

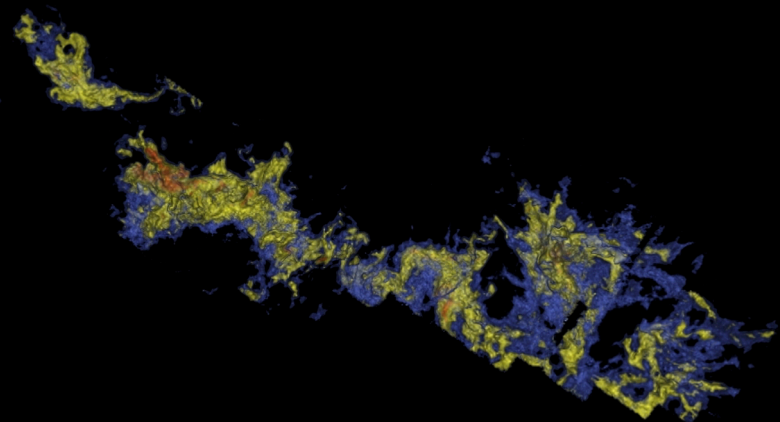
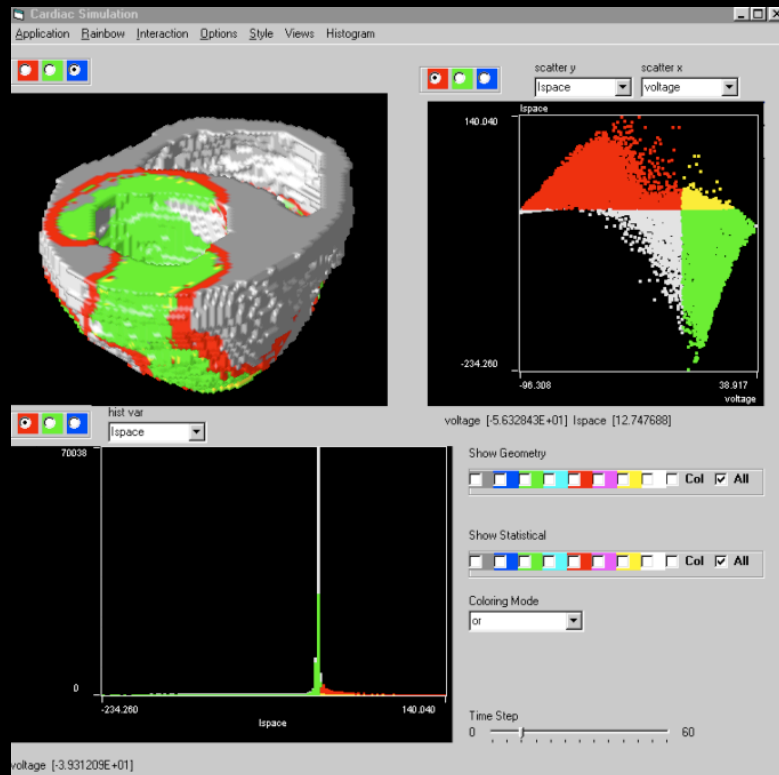


screenshot from Gresh et al. 2000; reproduced as shown in Goodman 2012





# SELECTION IN 3D IS AN UNSOLVED PROBLEM



# SELECTION IN 3D IS AN UNSOLVED PROBLEM



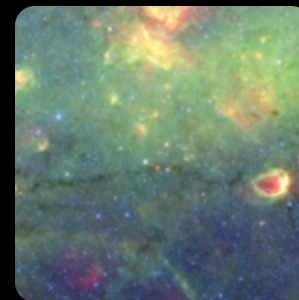
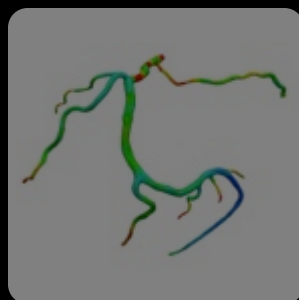
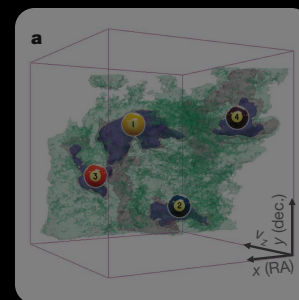
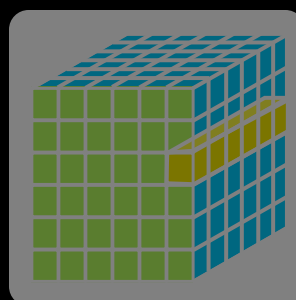
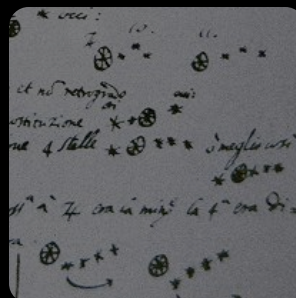
KINECT

John Tukey's warning:  
"details of control can  
make or break such a system"

Microsoft  
HoloLens











BIG DATA, WIDE DATA





ExploreGuided ToursSearchViewSettings

Use Layer Manager to Control User Settings

Name My Location

Lat 37:47:15Alt 0 m

Lng -123:35:23

View From This Location

2015/02/11 04:40:33

Real Time

Now

Galactic Plane Mode

WorldWide Telescope

ZO NIVERSE

REAL SCIENCE ONLINE

Look At

Imagery

Image Crossfade

Tracking

GLIMPSE/MIPSGAL

1 of 3

N

Scorpius

03:10:1

Pismis 24 and

NGC6334

NGC6357

NGC6374

NGC6383

NGC6396

NGC6404

Lesath

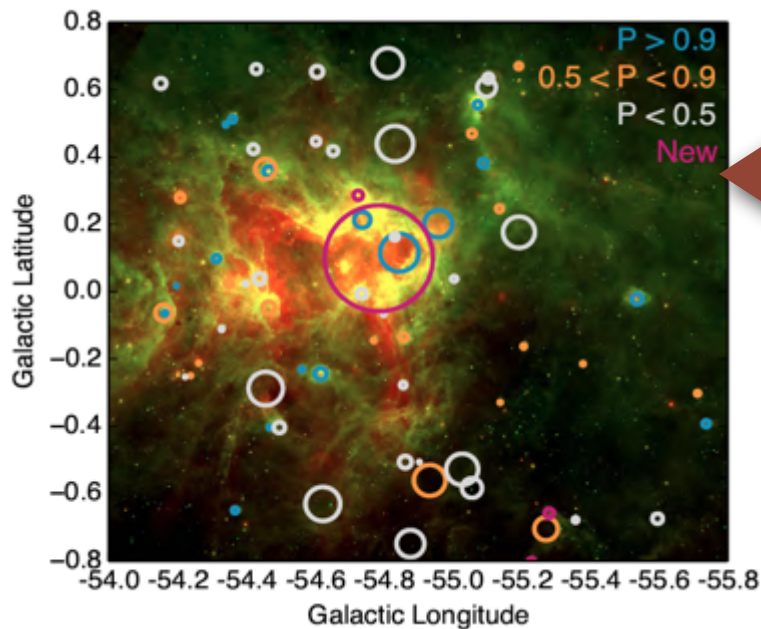
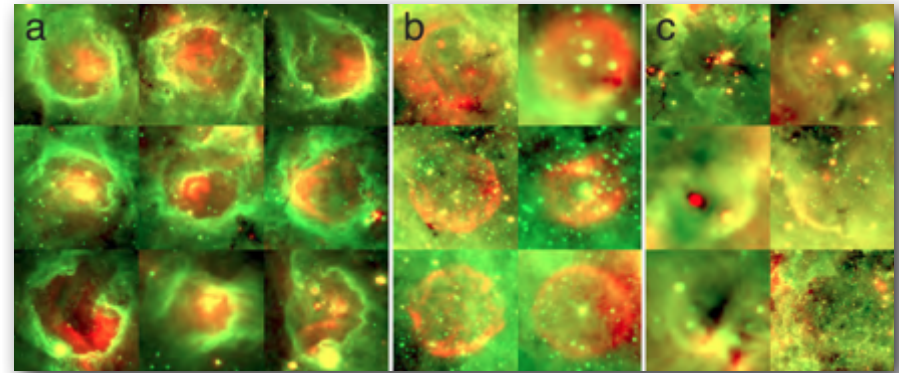
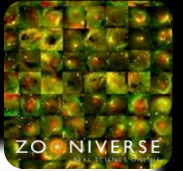
Shaula

HR6397

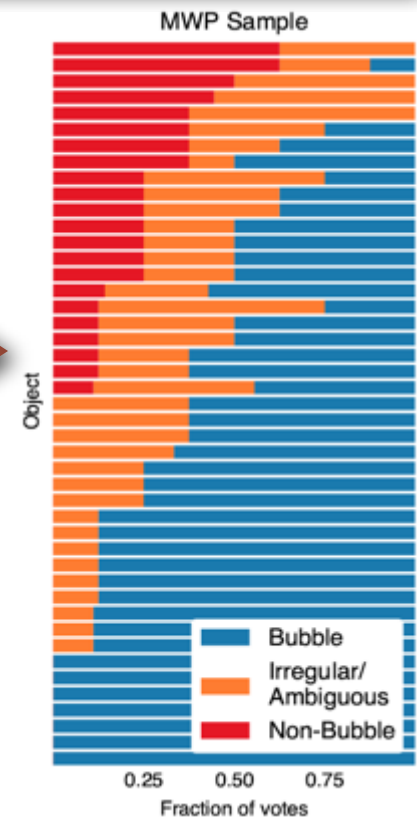
HR6405



# BIG DATA AND "HUMAN-AIDED COMPUTING"

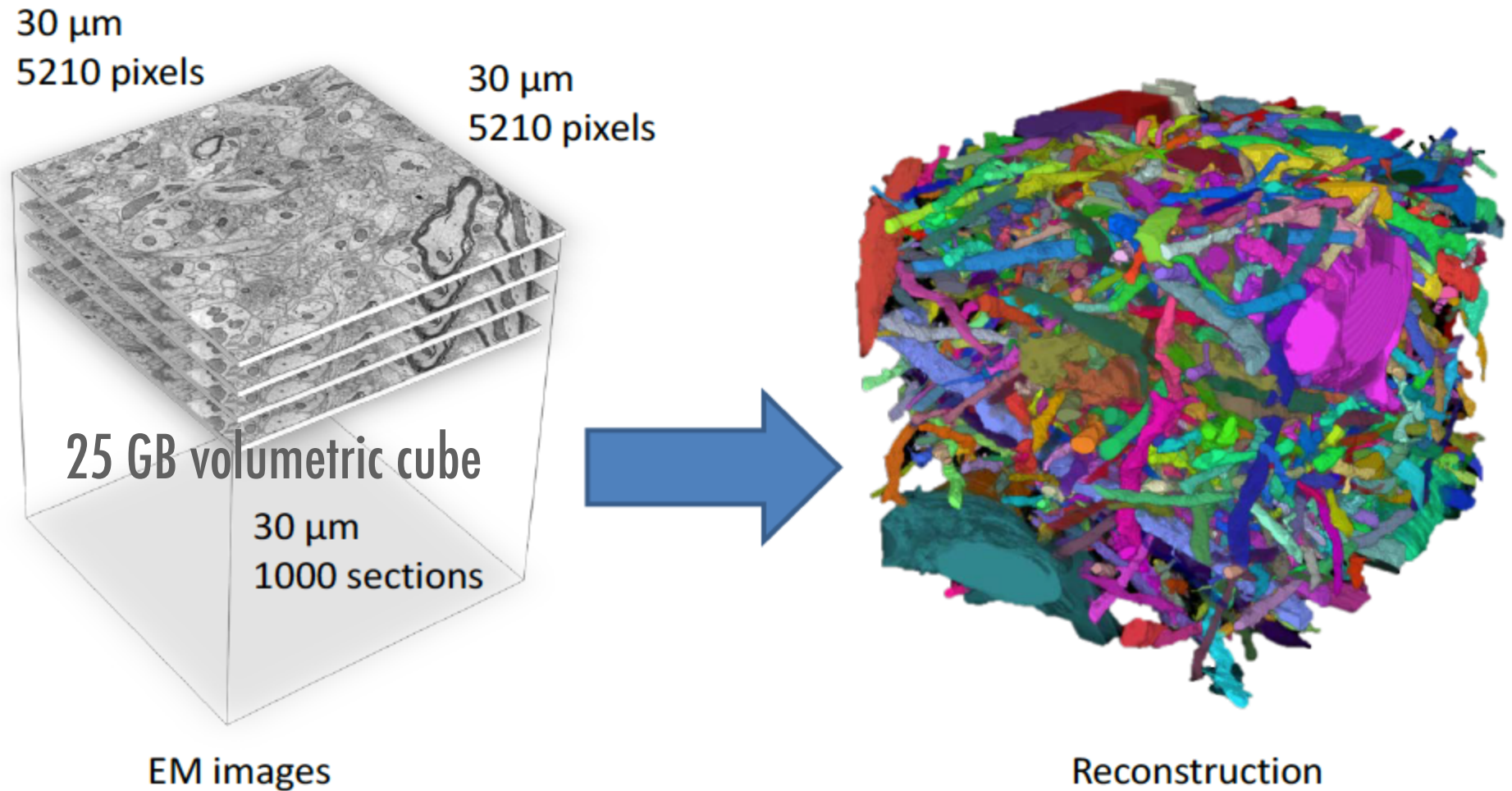


machine-learning  
algorithm  
(Brut)



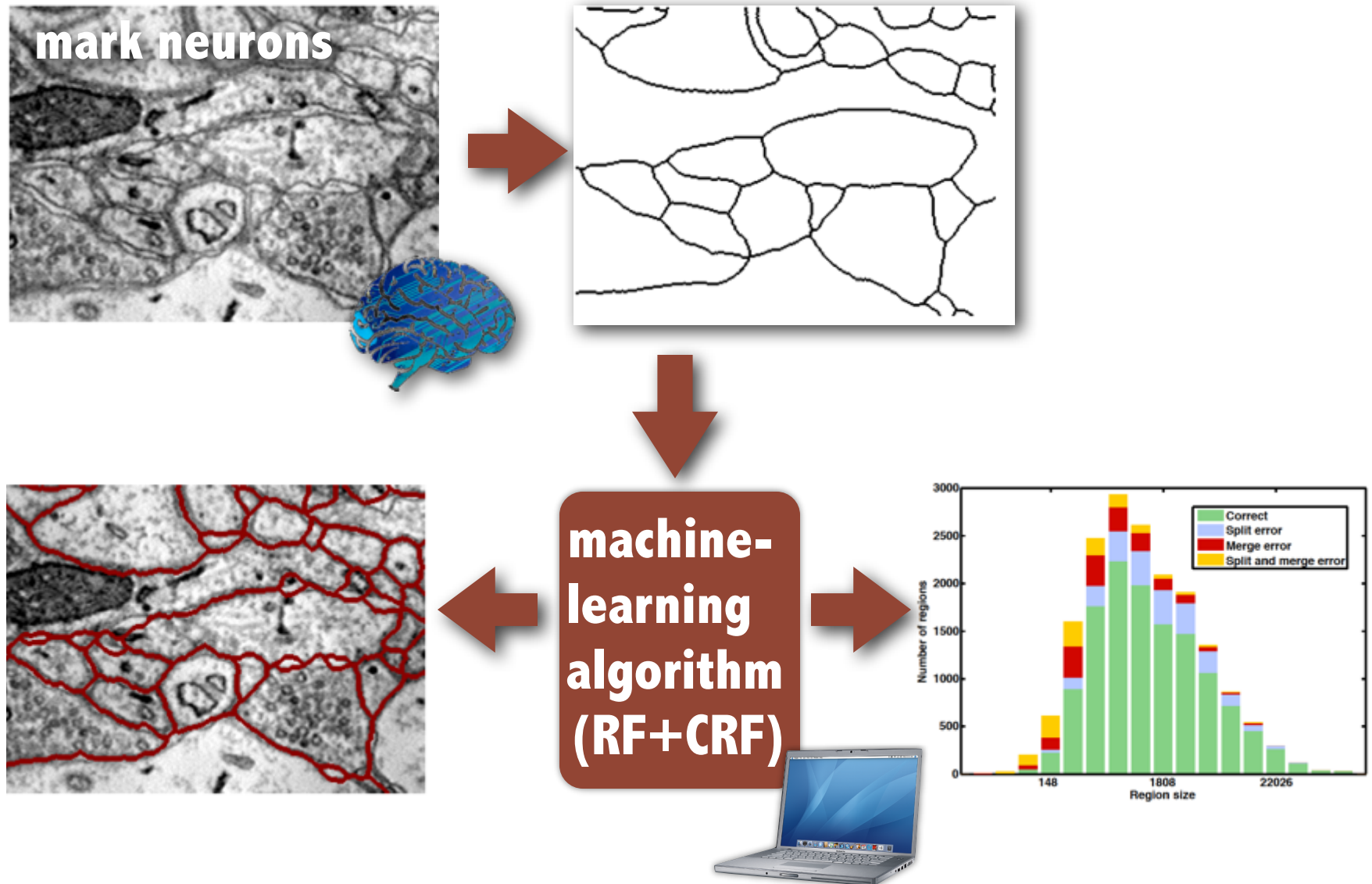
example here from: **Beaumont**, Goodman, Kendrew, Williams & Simpson 2014; based on **Milky Way Project** catalog (Simpson et al. 2013), which came from **Spitzer/GLIMPSE** (Churchwell et al. 2009, Benjamin et al. 2003), cf. Shenoy & Tan 2008 for discussion of HAC; **astroml.org** for machine learning advice/tools

# BIG DATA AND "HUMAN-AIDED COMPUTING"



example here from: Kaynig...Lichtman...Pfister et al. 2013, "Large-Scale Automatic Reconstruction of Neuronal Processes from Electron Microscopy Images"; cf. Shenoy & Tan 2008 for discussion of HAC; [astroml.org](http://astroml.org) for machine learning advice/tools

# BIG DATA AND "HUMAN-AIDED COMPUTING"



example here from: Kaynig...Lichtman...Pfister et al. 2013, "Large-Scale Automatic Reconstruction of Neuronal Processes from Electron Microscopy Images"; cf. Shenoy & Tan 2008 for discussion of HAC; [astroml.org](http://astroml.org) for machine learning advice/tools (Note: RF=Random Forest; CRF=Conditional Random Fields.)



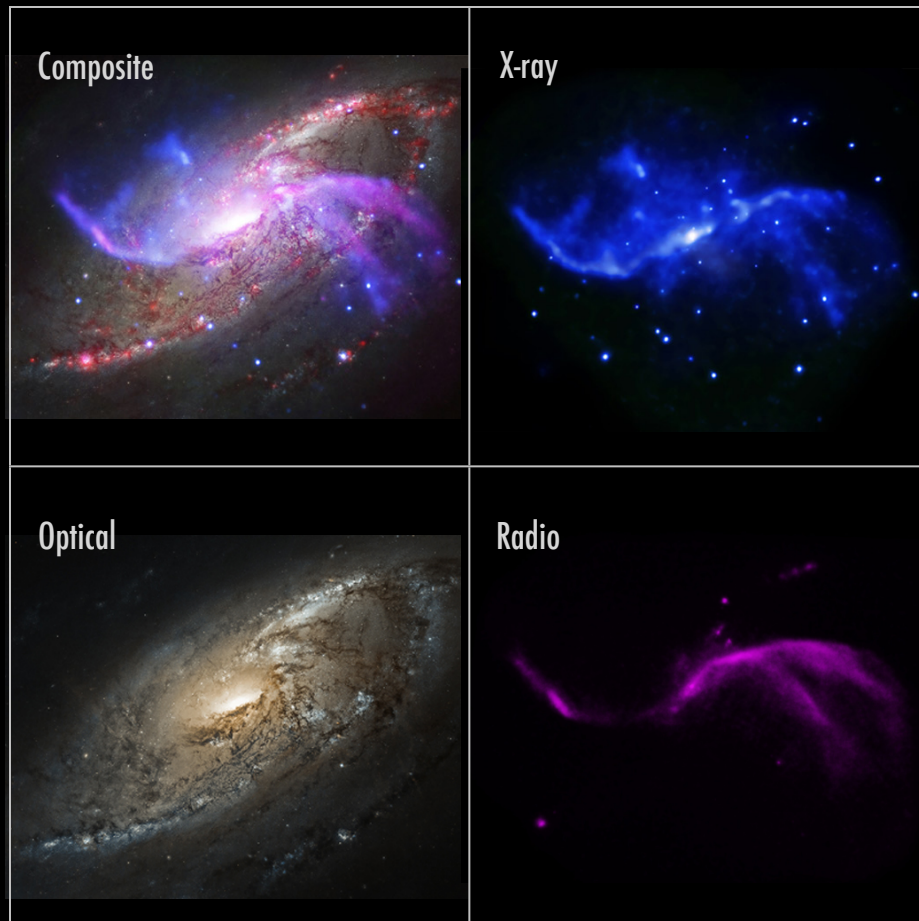


BIG DATA, WIDE DATA

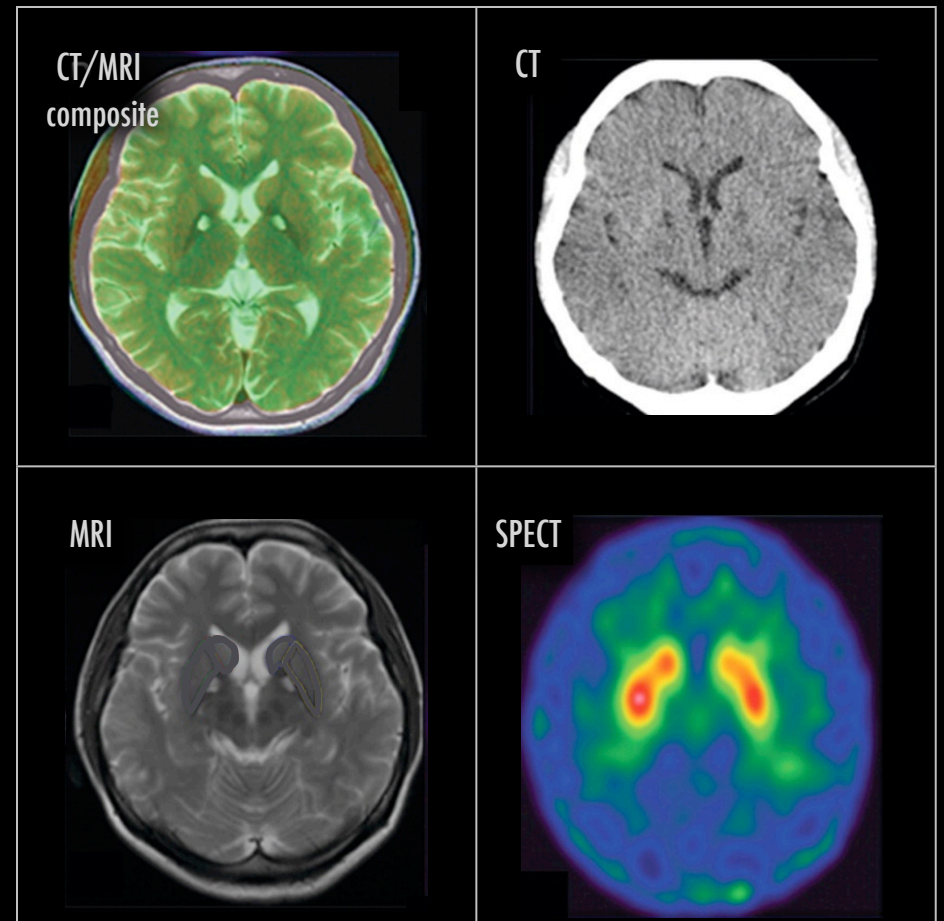




# WIDE DATA



[chandra.harvard.edu/photo/2014/m106/](http://chandra.harvard.edu/photo/2014/m106/)



Chang, et al. 2011, [brain.oxfordjournals.org/content/134/12/3632](http://brain.oxfordjournals.org/content/134/12/3632)

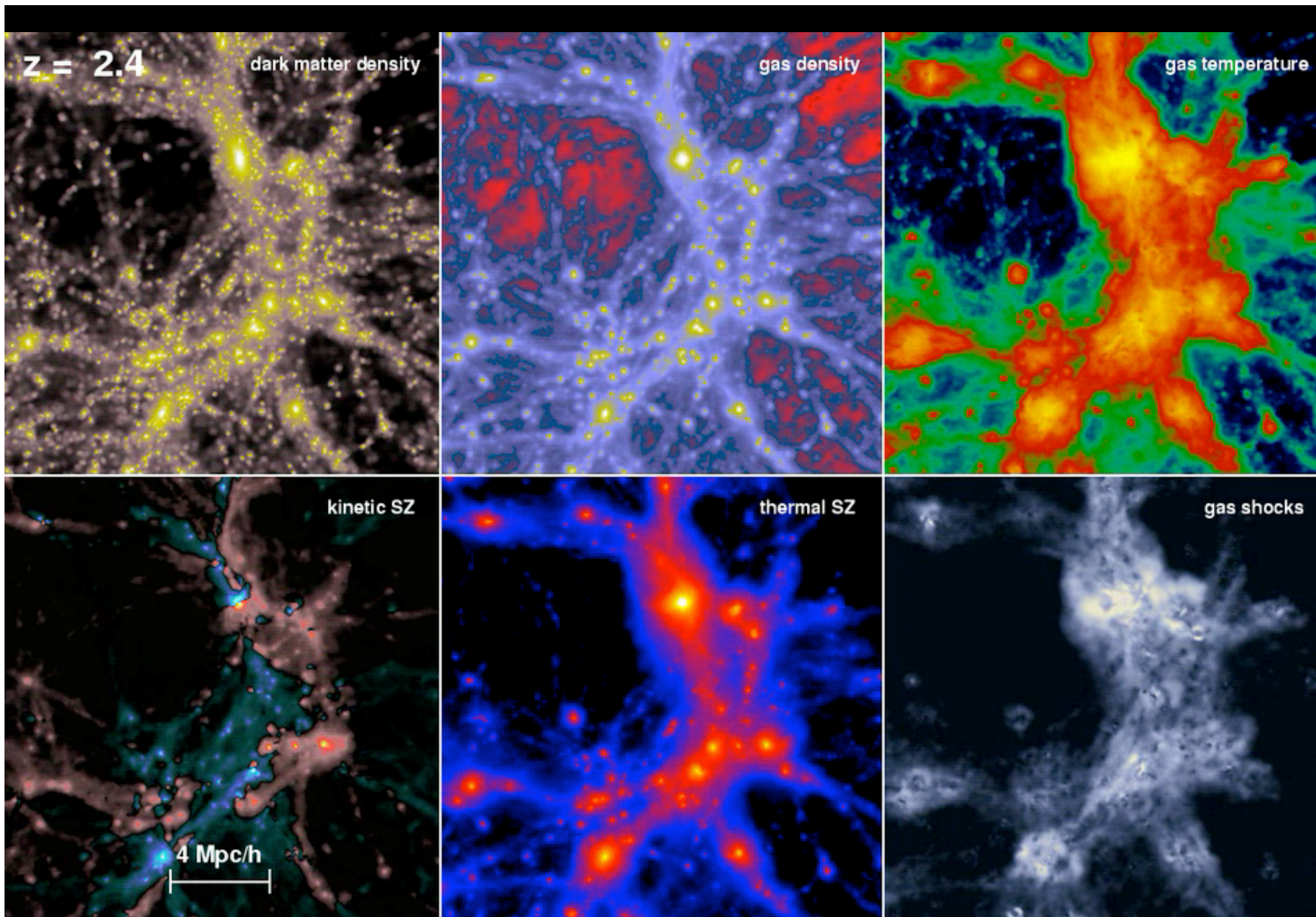




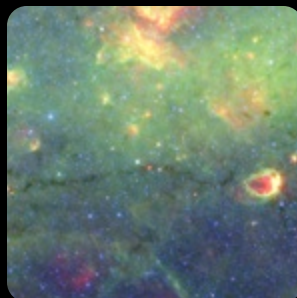
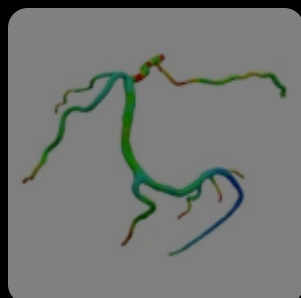
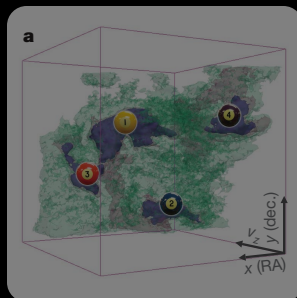
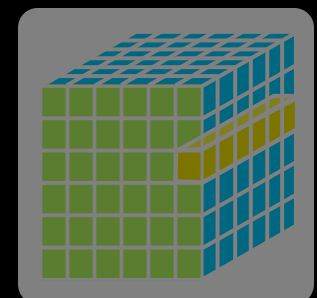
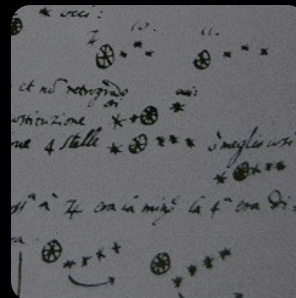
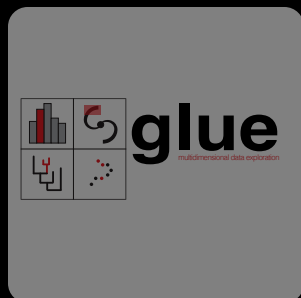
# BIG AND WIDE DATA





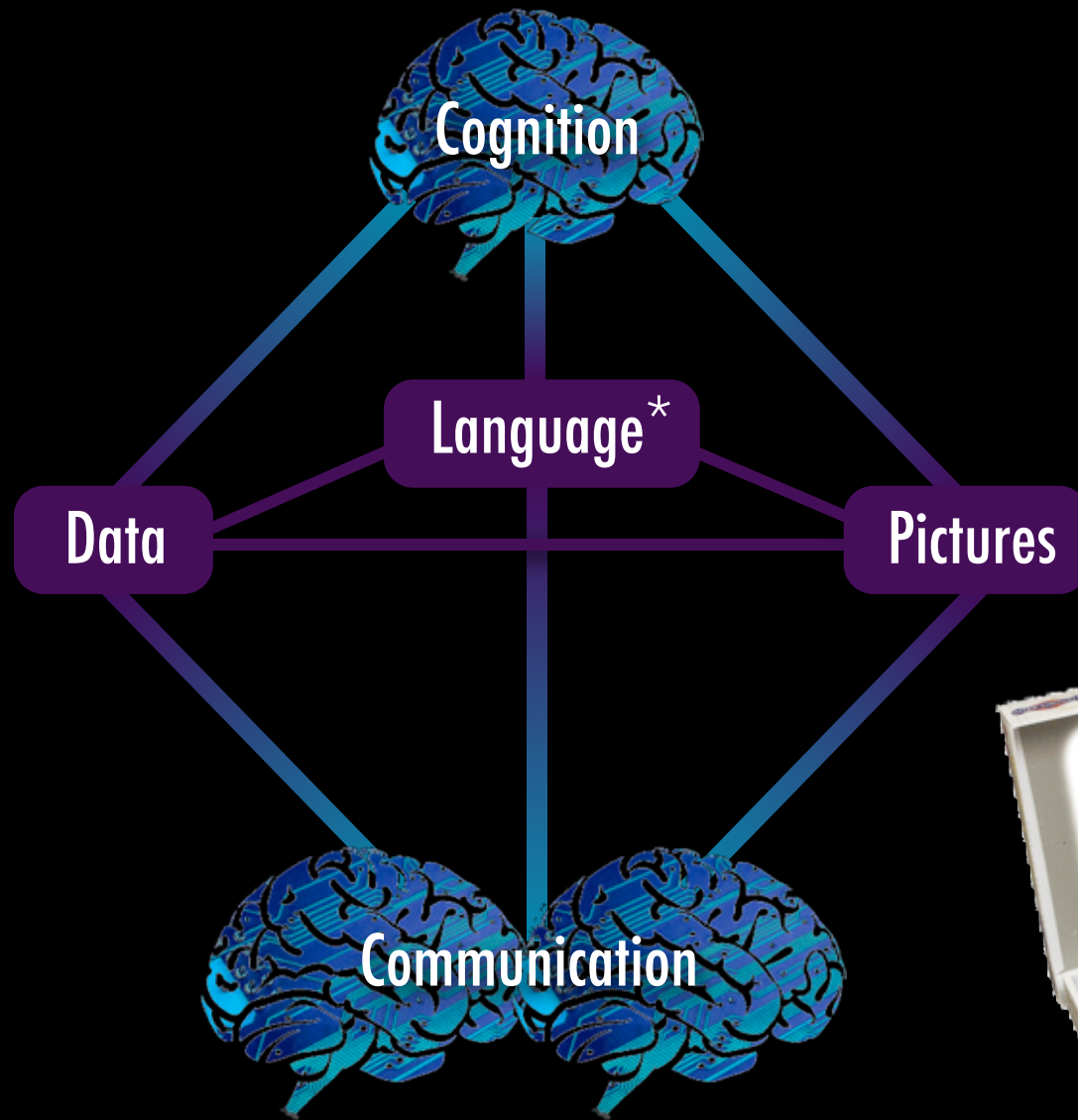


Movie: Volker Springel, formation of a cluster of galaxies. Millenium Simulation requires 25TB for output.





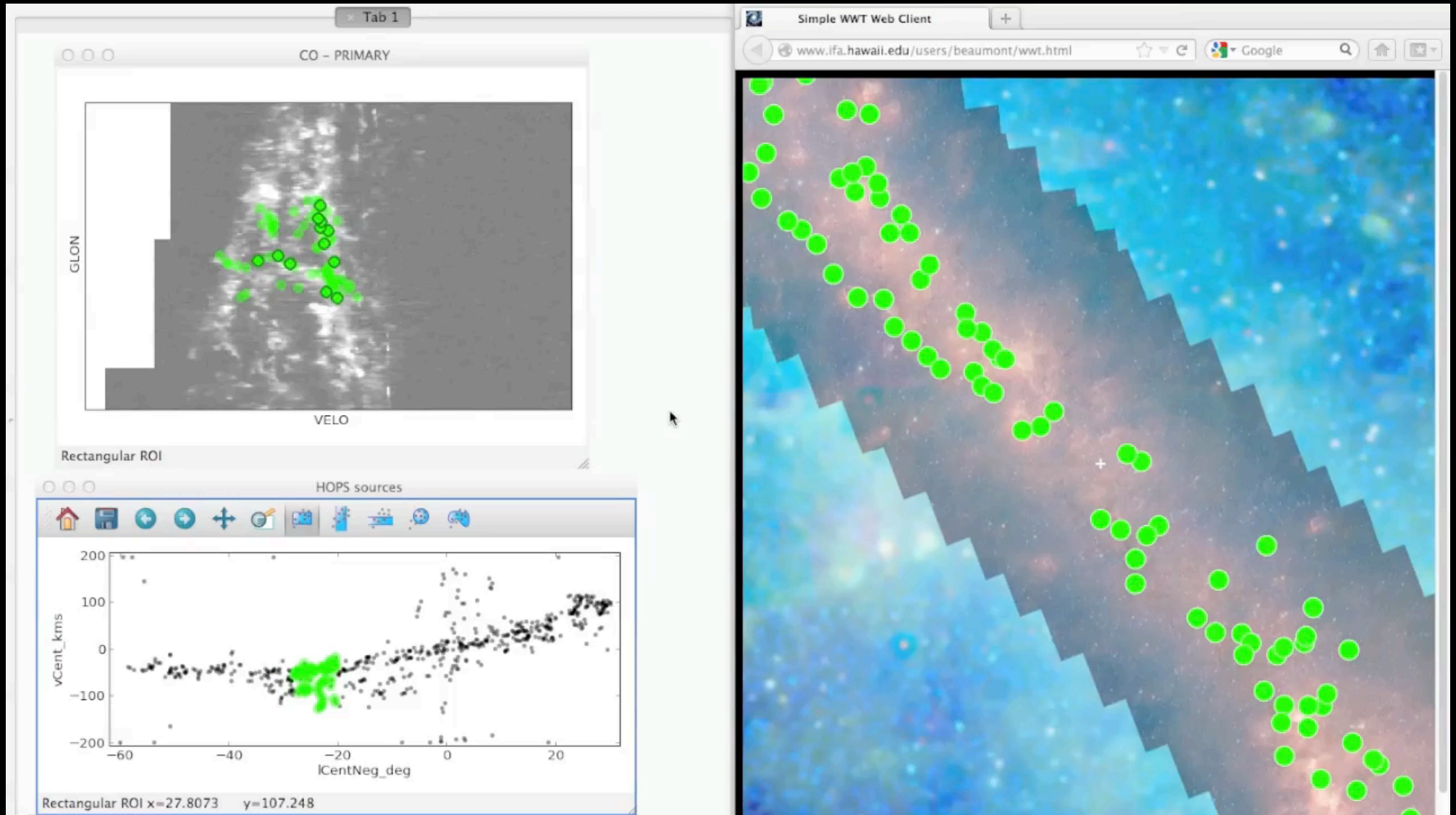
# THE FUTURE IS ABOUT **INTEGRATION**



IP[y]: IPython  
Interactive Computing







Video courtesy of Chris Beaumont, Lead Glue Architect



**Once upon a time (2012), in an  
enchanted castle (in Bavaria)**

**...at a conference about  
“The Early Phases of Star Formation”**







*Andi Burkert asked a question:*

**Is Nessie “parallel to the Galactic Plane”?**

No one knew.



# THE MILKY WAY

“Galactic Plane”



The Milky Way  
(Artist's Conception)





# "Is Nessie Parallel to the Galactic Plane?"

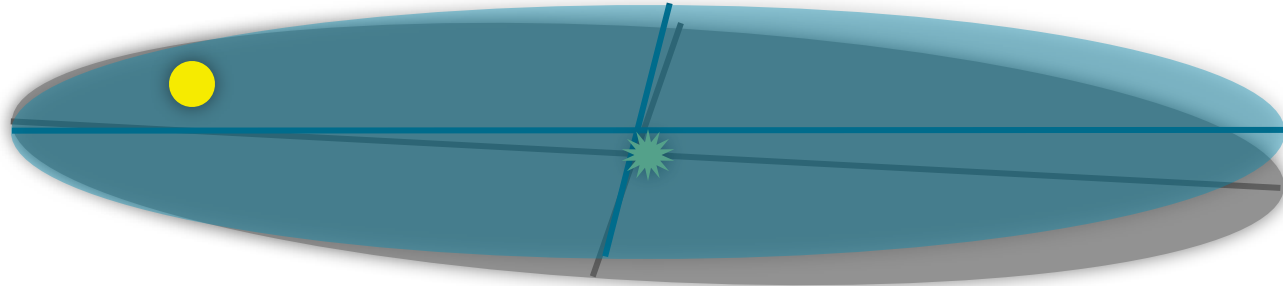


↑  
Celestial  
North

Yes but why not at Zero of Latitude ( $b=0$ )?

# Where are we, really?

“IAU Milky Way”, est. 1959



True Milky Way, modern

The equatorial plane of the new co-ordinate system must of necessity pass through the sun. It is a fortunate circumstance that, within the observational uncertainty, both the sun and Sagittarius A lie in the mean plane of the Galaxy as determined from the hydrogen observations. If the sun had not been so placed, points in the mean plane would not lie on the galactic equator. *[Blaauw et al. 1959]*

Sun is  
~75 light years  
“above” the  
IAU Milky Way  
Plane

+

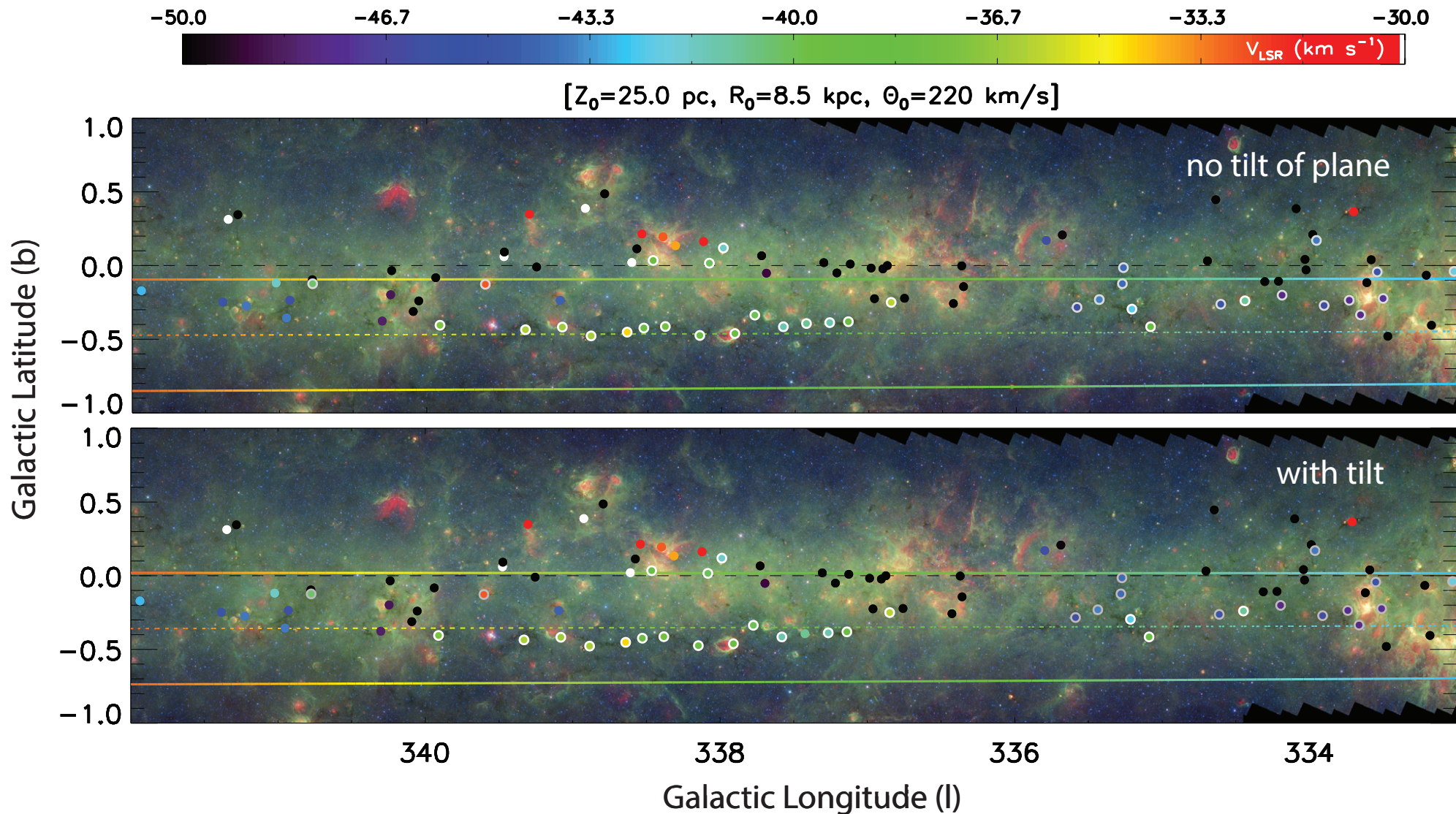
Galactic  
Center is  
~20 light years  
offset from the  
IAU Milky Way  
Center

=

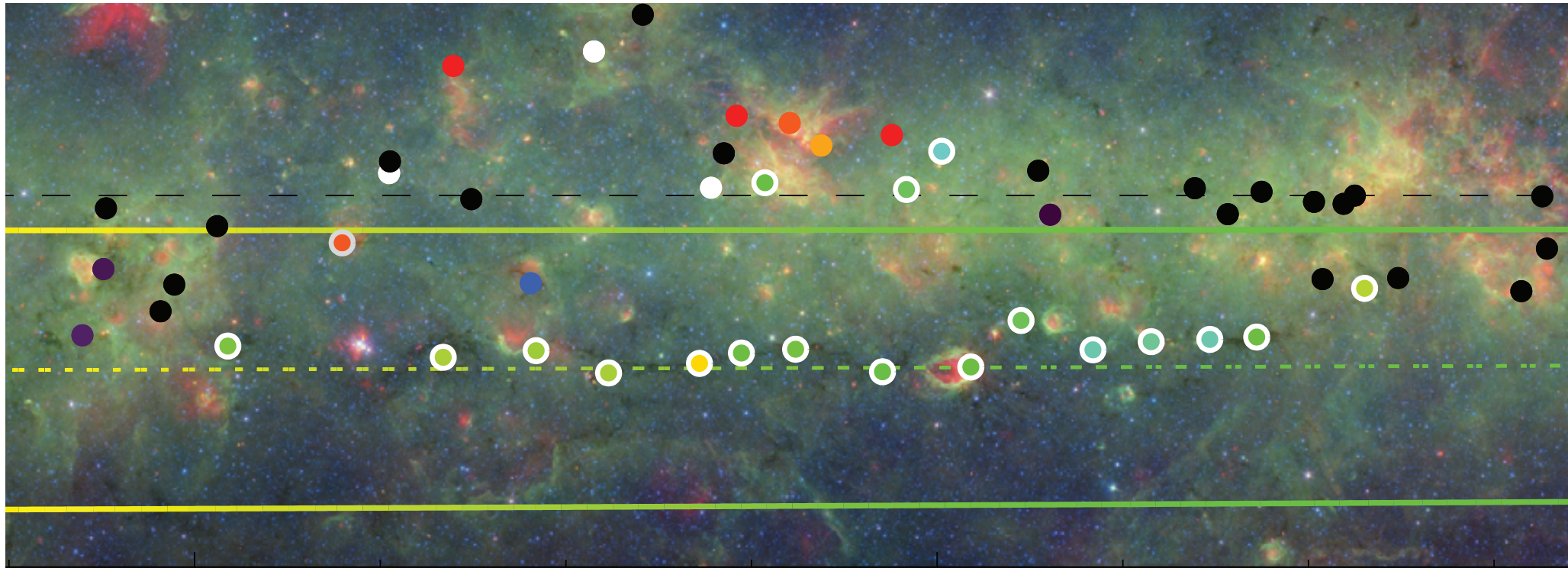
The **Galactic Plane** is not quite  
**where you’d think it is**  
when you look at the sky



# In the plane! And at distance of spiral arm!







...eerily precisely...

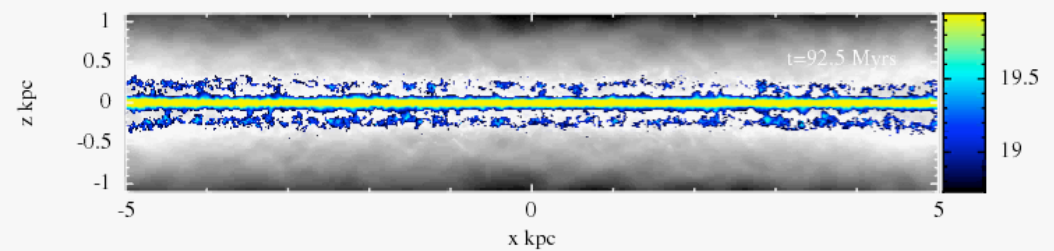
How do we know  
the velocities?



# A full 3D skeleton?

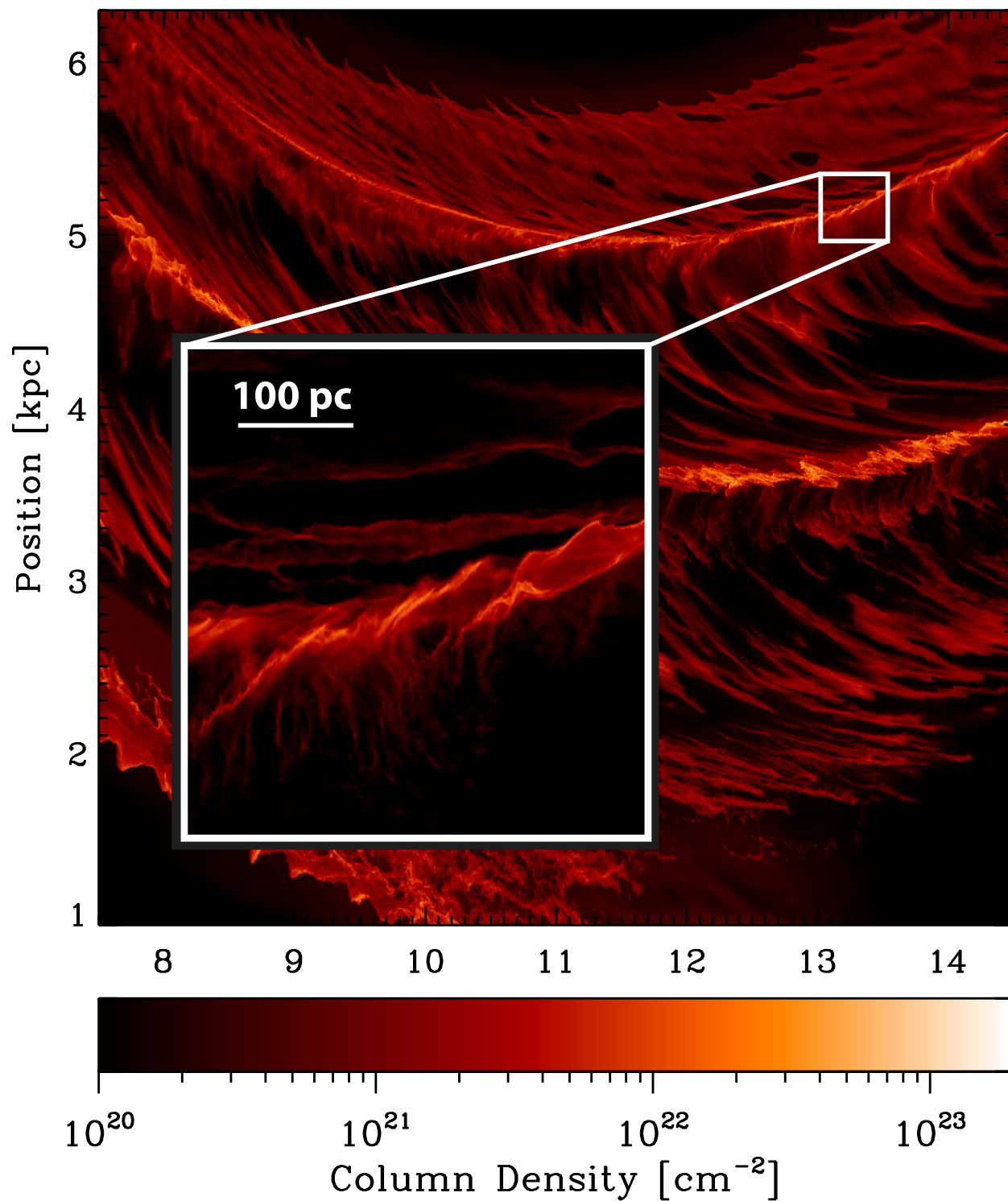


(flipped) image of IC342 from Jarrett et al. 2012; WISE Enhanced Resolution Galaxy Atlas



simulations courtesy Clare Dobbs

New!  
2014 Simulation

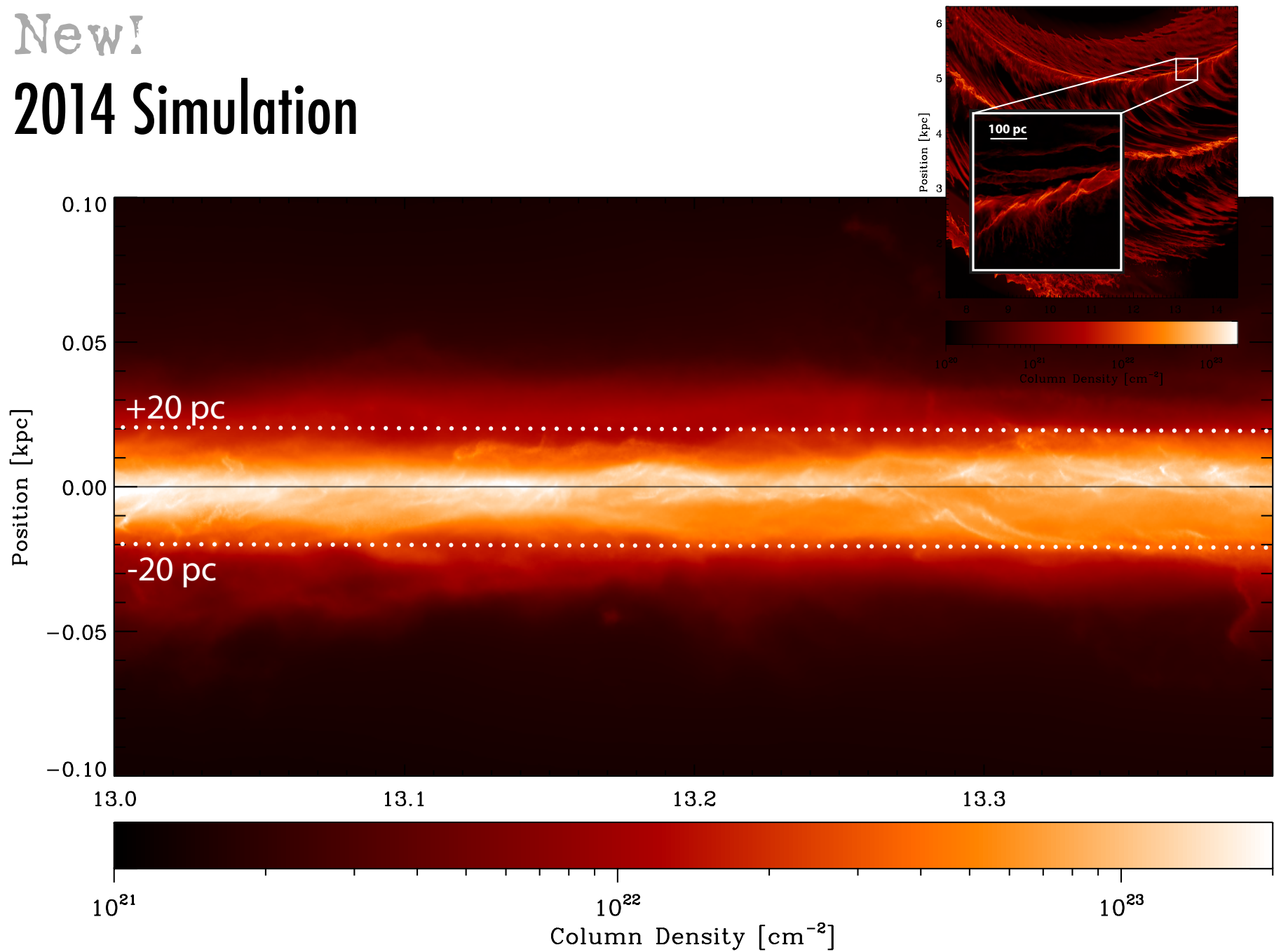


Smith et al. 2014, using AREPO



# New!

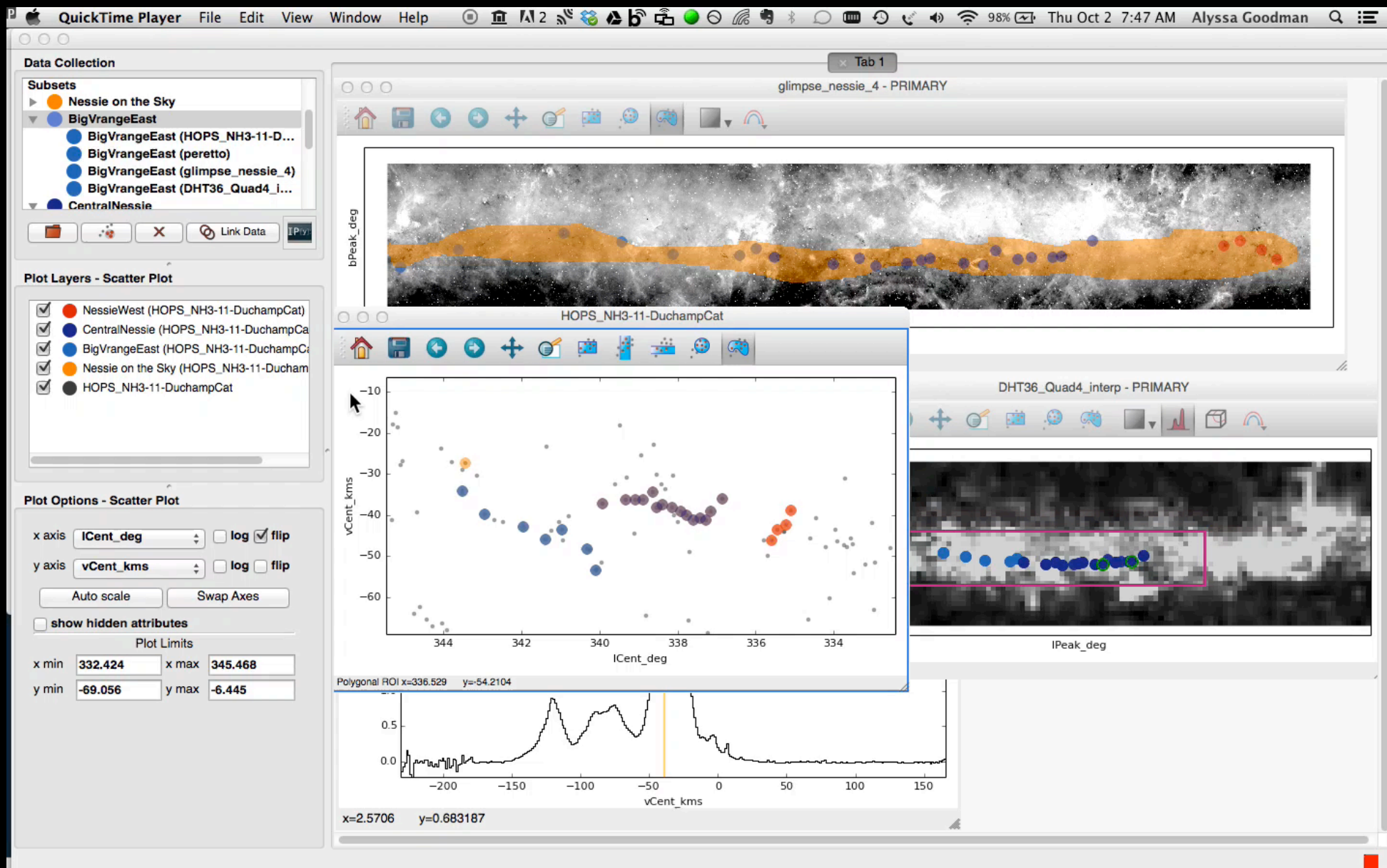
## 2014 Simulation



Smith et al. 2014, using AREPO



# NESSIE IN GLUE





# EDUCATION, 2015+

**Stephen**

**Yuan-Sen Ting**

**Interstellar Absorption and the Lyman Alpha Forest**

JavaScript

[https://www.cfa.harvard.edu/~yuan-sen.ting/lyman\\_alpha.html](https://www.cfa.harvard.edu/~yuan-sen.ting/lyman_alpha.html)

JavaScript

<http://portillo.ca/nebula/>

## online learning

**the 2013 experiment**

HARVARD UNIVERSITY  
ASTRONOMY 201B  
**DEMOFEST**

LOCATION  
Perkin Lobby and Wolbach Library, 60 Garden Street

TIME  
11-12 for drop-in demos  
12-12:45 lunch for students & their guests

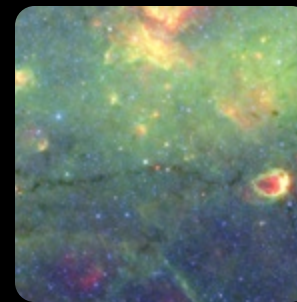
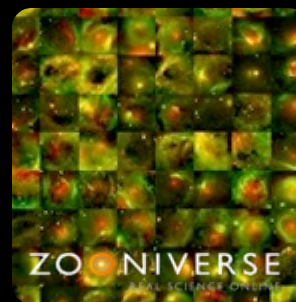
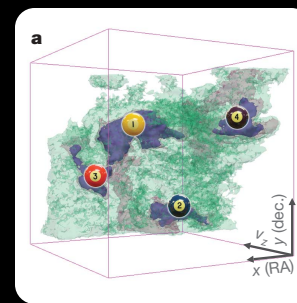
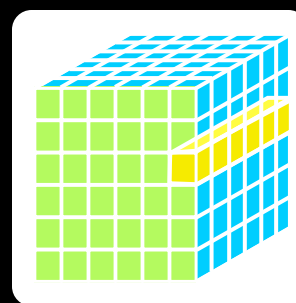
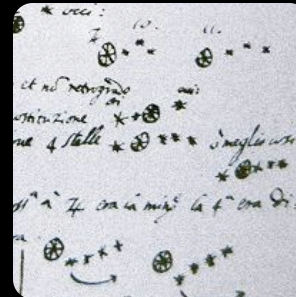
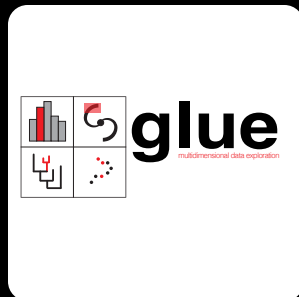
PREVIEW  
<http://ay201b.wordpress.com/topical-modules>

## WWT Ambassadors

Microsoft Research  
World Wide Telescope

Ambassadors Program

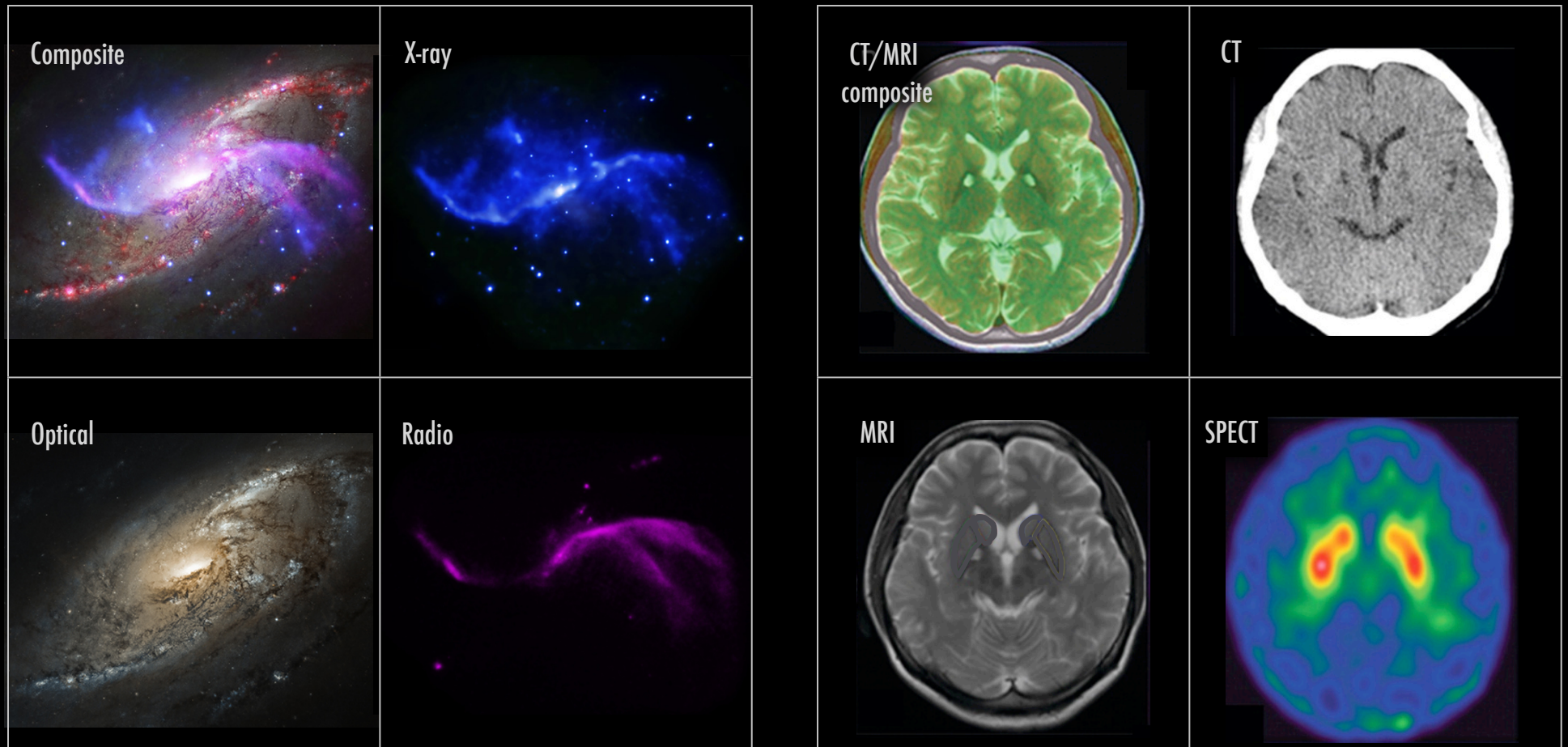
see: A New Approach to Developing Interactive Software Modules through Graduate Education, Sanders, Faesi & Goodman 2013





# ASTRONOMY, MEDICINE, AND THE FUTURE

ALYSSA A. GOODMAN, HARVARD-SMITHSONIAN CENTER FOR ASTROPHYSICS



[chandra.harvard.edu/photo/2014/m106/](http://chandra.harvard.edu/photo/2014/m106/)

Chang, et al. 2011, [brain.oxfordjournals.org/content/134/12/3632](http://brain.oxfordjournals.org/content/134/12/3632)

@aagie



MORE?



[projects.iq.harvard.edu/  
seamlessastronomy/  
presentations](https://projects.iq.harvard.edu/seamlessastronomy/presentations)