# FILAMENTS: FAD OR FUNDAMENTAL?

#### Alyssa A. Goodman Harvard-Smithsonan Center for Astrophyscs Radcliffe Institute for Advanced Study

@aagie

<mark>≜ 5</mark>glue

Ophiuchus, Barnard 1919

#### Ophiuchus, Barnard 1919

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#### Atomic Gas

Declination



Galactic Longitude

**Figure 10.** Riegel–Crutcher cloud (Section 6) in H I absorption (left) and RHT backprojection (right). Overlaid pseudovectors represent polarization angle measurements from the Heiles (2000) compilation. In the left panel, the intensity scale is linear from -20 K (white) to -120 K (black).

(A color version of this figure is available in the online journal.)

#### Molecular Gas

#### Dame et al. 2001





#### Molecular Gas "Clouds"

## Rice et al. 2016



THE ASTROPHYSICAL JOURNAL, 822:52 (27pp), 2016 May 1 © 2016. The American Astronomical Society. All rights reserved.

doi:10.3847/0004-637X/822/1/52

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#### A UNIFORM CATALOG OF MOLECULAR CLOUDS IN THE MILKY WAY

THOMAS S. RICE<sup>1</sup>, ALYSSA A. GOODMAN<sup>2</sup>, EDWIN A. BERGIN<sup>1</sup>, CHRISTOPHER BEAUMONT<sup>3</sup>, AND T. M. DAME<sup>2</sup> <sup>1</sup> Department of Astronomy, University of Michigan, 311 West Hall, 1085 South University Avenue, Ann Arbor, MI 48109, USA; tsrice@umich.edu <sup>2</sup> Harvard-Smithsonian Center for Astrophysics, 60 Garden Street, Cambridge, MA 02138, USA <sup>3</sup> Counsyl, 180 Kimball Way, South San Francisco, CA 94080, USA *Received 2015 July 14; accepted 2016 February 4; published 2016 May 3* 

#### ABSTRACT

The all-Galaxy CO survey of Dame et al. is by far the most uniform, large-scale Galactic CO survey. Using a dendrogram-based decomposition of this survey, we present a catalog of 1064 massive molecular clouds throughout the Galactic plane. This catalog contains  $2.5 \times 10^8$  solar masses, or  $25^{+10.7}_{-5.8}$ % of the Milky Way's estimated H<sub>2</sub> mass. We track clouds in some spiral arms through multiple quadrants. The power index of Larson's first law, the size-linewidth relation, is consistent with 0.5 in all regions—possibly due to an observational bias— but clouds in the inner Galaxy systematically have significantly (~30%) higher linewidths at a given size, indicating that their linewidths are set in part by the Galactic environment. The mass functions of clouds in the inner Galaxy versus the outer Galaxy are both qualitatively and quantitatively distinct. The inner Galaxy mass spectrum is best described by a truncated power law with a power index of  $\gamma = -1.6 \pm 0.1$  and an upper truncation mass of  $M_0 = (1.0 \pm 0.2) \times 10^7 M_{\odot}$ , while the outer Galaxy mass spectrum is better described by a non-truncating power law with  $\gamma = -2.2 \pm 0.1$  and an upper mass of  $M_0 = (1.5 \pm 0.5) \times 10^6 M_{\odot}$ , indicating that the inner Galaxy is able to form and host substantially more massive GMCs than the outer Galaxy. Additionally, we have simulated how the Milky Way would appear in CO from extragalactic perspectives, for comparison with CO maps of other galaxies.

Key words: Galaxy: general - ISM: clouds - ISM: molecules

Supporting material: machine-readable table



Figure 2. Example dendrogram extraction of Orion B: a nearby, well-studied giant molecular cloud. Top left: (l, b) thumbnail of the cloud and its neighboring region as seen on the sky. Bottom left: (l, v) thumbnail of the same region. Right: dendrogram cutout, with Orion B's structures highlighted in blue. The pixels corresponding to the highlighted dendrogram structures are outlined in the blue contour (in projection); a representative ellipse is drawn in red, with semimajor axis length equal to the second moment along each relevant dimension (as calculated in Section 2.2). Data come from DHT Survey #27 (the Orion complex).

# IN A FEW MINUTES...





~0.01 to 10 pc

>100 pc





#### 2000 YEARS AGO ...



•





2000 YEARS AGO.







#### All Stone All in Rome

Colosseum, 90 AD





Ponte Sant'Angelo, 134 (Hadrian)

Pons Neronianus, c. 50 AD, under Ponte Sant'Angelo

#### Ponte Vittorio Emanuele II, 1886



# 

#### A SEQUENCE... BUT NOT OF TIME Replaced --- OR OF TYPE







#### Disappearing



Extant









#### Erased Disappearing Replaced\* Extant New

# and so is THE STAR-FORMING ISM



#### What are the destructive/constructive forces?

#### Any structure's longevity is affected by which influences govern it.

How (long) do structures live?

Data: POSSII, Caltech, NSF mage Processing & Copyright: Oliver Czerne

#### ONLY SIMULATIONS ALLOW US TO BUILD, DESTROY & TIME TRAVEL

#### C. 80 AD

#### 2016





#### +"observed" simulations are best

#### ARE SOME PLACES SPECIAL?



What are "special" places in ISM & how long do they last? How do "influences" change what is special?

# The mid-plane of a spiral galaxy is a special place.

#### "Is Nessie Parallel to the Galactic Plane?" -A. Burkert, 2012



# Celestia 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 <sup>25</sup> pc "above" the IAU Milky Way Plane
Galactic Center is <sup>7</sup> pc 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!



Goodman et al. 2014



# ...eerily precisely...

Goodman et al. 2014

## 2014 Simulation



Smith et al. 2014, using AREPO



Smith et al. 2014, using AREPO (hydro+chemistry, imposed potential, no B-fields, no local (self-)gravity, no feedback)



global spiral potential of the Galaxy.



#### And it may have friends!



**Milky Way Bones**: Ultra-dense, high aspect ratio Nessie analogs that may form the "Skeleton" of the Milky Way. Analogs must satisfy quantitative Bone criteria (Zucker+2015)





#### 2.3. Establishing "Bone" Criteria

After narrowing down our list to 10 filaments with kinematic structure consistent with existing spiral arm models, we develop a set of criteria for an object to be called a "bone":

- 1. Largely continuous mid-infrared extinction feature
- 2. Parallel to the Galactic plane, to within  $30^{\circ}$
- 3. Within 20 pc of the physical Galactic mid-plane, assuming a flat galaxy
- 4. Within 10 km s<sup>-1</sup> of the global-log spiral fit to any Milky Way arm







Battersby, Goodman, Zucker et al. in prep.

### "FILAMENT 5" WITH THE 30-M



Battersby, Goodman, Zucker et al. in prep.

## "FILAMENT 5" WITH THE 30-M



elue 3-D volume rendering of <sup>13</sup>CO and C<sup>18</sup>O

Battersby, Goodman, Zucker et al. in prep.



#### But they have different properties and utility in tracing spiral structure

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Size Scale Comparison of Large-Scale Filament Catalogs: Herschel column density map with filament outlines overlaid



10

Systematic offsets in column density (top left), temperature (top right), scale height (bottom left) and position angle (bottom right) among different classes













"Bones" tend to be closest to mid-plane, closest to "horizontal," coldest, and densest.



Filament Class	References	λ of Initial Detection	Velocity Reference	Spectral Lines	Velocity Contiguity Criterion	Aspect Ratio or Linearity Criterion	Min. Length	Spiral Arm Association Criterion	Spiral Arm Reference	Galactic scale height criterion	Position angle criterion
GMF	Ragan et al. 2014, Abreu- Vicente et	Mid-IR, Near-IR	GRS, ThrUMMS	<sup>13</sup> CO	"Continuous" velocity gradient		1°	Intersects <i>p-v</i> fit within arm errors	Vallee 2008, Reid et al. 2014		
Herschel	Wang et al. 2015	Far-IR	GRS	<sup>13</sup> CO	"Continuous, not broken" emission in p-v diagram	>>10		Intersects <i>p-p</i> fit within arm/	Reid et al. 2014		
Bone	Goodman et al. 2014, Zucker et	Mid-IR	HOPS, MALT90, BGPS, GRS,	NH <sub>3</sub> , N <sub>2</sub> H+, HCO+, <sup>13</sup> CO	∆v < 3 km/s per 10 pc	>50:1		Within 10 km/s of <i>p-v</i> fit	Dame et al. 2011, Reid et al. 2016	<20 pc	<30° from midplane
ATLASGAL	Li et al. 2016	Submm	HOPS, MALT90, BGPS, COHRS,	NH <sub>3</sub> , N <sub>2</sub> H+, HCO+, <sup>13</sup> CO,	Std. Dev. of clumps < 10 km/s	>3:1		Within 10 km/s of <i>p-v</i> fit	Taylor & Cordes 1993		
MST	Wang et al. 2016	Radio	BGPS	N₂H+, HCO+	∆v < 2 km/s between connected clumps	σ <sub>major</sub> / σ <sub>minor</sub> > 1.5	10 pc	Within 5 km/s of <i>p-v</i> fit	Reid et al. 2016	<20 pc	< 30° from midplane

# milkyway3d.org

					Extende	1 Observations	Catalogs and	Pointed Surveys				
Galactic Plane Coverage Tool			Link to Survey	Wavelength	Continuum (2D)	Spectral Line (3D)	Source-Based Lists	Spectral Line				
			. THOR	21 cm, 300 mm, 174-								
			BESSEI	186 mm			<b>•</b>					
MilkyWay3D.org is a tool intended to organize and curate links to information about data the means to determine the available surveys, their overlapping footprint, and the type of	sets relevant to our 3D understanding of the Milky Way. For any given longitude range, we provide data each provides. Information about each dataset, including how to access the data, their hallmark		RAMPS*	1 cm		*	^					
publications, and their principal investigators, is available at the Milky Way 3D Dataverse. Glue, available for download at glueviz.org!	All the data can be loaded, "linked", and explored using the new 3D visualization software package		CORNISH*	60 mm	*		*					
			HOPS	12 mm		*		*				
	+10		GRS	3 mm		*						
			MALT90	3 mm				*				
			THRUMMS	3 mm		*						
			Dame CO	2.6 mm		*						
CITATION - COMPANY			BGPS	1 mm	*		*	*				
			CHIMPS	1 mm		*						
	Name of the state			870 µm	*	· · · · ·	+					
NAMES OF TAXABLE PARTY AND A DESCRIPTION OF TAXABLE PARTY.	A STREET, AND AND A STREET, AN		JCMT*	850 µm	*		*					
La Carlo Carlo Martin Carlo Carlo			HIGAL*	70-500 μm	*							
		<ul> <li>✓</li> </ul>	MIPSGAL	24, 70 μm	*							
			WISE	3.4, 4.6, 12, 22.0 μm	*							
			GLIMPSE	3.6, 4.5, 5.8, 8.0 <b>μ</b> m	*							
	-10		UKIDSS-GPS*	1.3, 1.6, 2.2 μm	*							
This is an interactive coverage tool of surveys of the galactic plane created with the AAS	WorldWide Telescope APL and WorldWide Telescope o view the coverage		GPIPS*	1.6 <i>µ</i> m			*					
Welcome  Workflow Data Avenue DataAvenue	<ul> <li>Storage</li> <li>Settings</li> <li>Security</li> <li>Statistics</li> </ul>	Information	n 💌 Data /	Avenue Help 💌	End User	PBS Monitorir	ng 💌	en w				
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und con					Two panel view	w Edit favori	tes History	to				
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	Author Name											
	Simon Binr (1)											
	Developed at the Institute for Quantitative Social Science   Dataverse Project on 🖬   Code available	le at 🛡		The	9							

#### But they have different properties and utility in tracing spiral structure



Size Scale Comparison of Large-Scale Filament Catalogs: Herschel column density map with filament outlines overlaid



**Systematic** offsets in column density (top left), temperature (top



# $\uparrow \neq \square \neq \square$

**Filament Venn** Diagram: Only 18% of large-scale filaments share any overlap with other largescale filament catalogs







 $\sigma = 2.6$ 

 $\sigma = 2.8$ 

#### "Bones" are most likely to trace structure in/of the Galaxy's plane.

#### But what creates the Bones we observe?

0

nello



brand new AREPO work...look for Zucker, Smith, Battersby, Goodman 2017

## AS PROMISED: B5, AND A LITTLE MORE "GLUE"








THE ASTROPHYSICAL JOURNAL, 504:223-246, 1998 September 1 © 1998. The American Astronomical Society. All rights reserved. Printed in U.S.A.

#### COHERENCE IN DENSE CORES. II. THE TRANSITION TO COHERENCE

ALYSSA A. GOODMAN<sup>1</sup>

Harvard University Department of Astronomy, Cambridge, MA 02138; agoodman@cfa.harvard.edu JOSEPH A. BARRANCO

Astronomy Department, University of California, Berkeley, Berkeley, CA 94720; barranco@ucbast.berkeley.edu

DAVID J. WILNER Harvard-Smithsonian Center for Astrophysics, 60 Garden Street, Cambridge, MA 02138; dwilner@cfa.harvard.edu

Five College Radio Astronomy Observatory, University of Massachusetts, Amherst, MA 01003; heyer@fcrao1.phast.umass.edu

After studying how line width depends on spatial scale in low-mass star-forming regions, we propose that "dense cores" (Myers & Benson 1983) represent an inner scale of a self-similar process that charac-



FIG. 10.—An illustration of the transition to coherence. Color and shading schematically represent velocity and density in this figure. On large scales, material (labeled chaff) is distributed in a self-similar fashion, and its filling factor is low. On scales smaller than some fiducial radius, the filling factor of gas increases substantially, and a coherent dense core, which is not self-similar, is formed. Due to limitations in the authors' drawing ability, the figure emphasizes a particular size scale in the chaff, which should actually exhibit self-similar structure on all scales ranging from the size of an entire molecular cloud complex down to a coherent core.



### WHAT IF FILAMENTS CONTINUE ACROSS "CORE" BOUNDARIES?!

blue =VLA ammonia (high-density gas); green=GBT ammonia (lower-res high-density gas); red=Herschel 250 micron continuum (dust)



Goodman, Chen, Offner & Pineda 2016 in prep.

Herschel data from Gould Belt Survey



## B5/GLUE (

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 $\mathbf{w}$ 

 $\checkmark$ 

x axis

y axis

z axis

Coordinate axes

**Reset View** 



### glueviz.org

Q

Chen, Offner, Pineda & Goodman 2016 in prep.

#### The University of Mancheste

## Simulators are <u>almost</u> observing enough lines... Filaments in Filaments



Observed C<sup>18</sup>O emission in blue.



Synthetic observation of C<sup>18</sup>O emission from our time-dependent chemical model post-processed with radmc-3d

slide courtesy of Rowan Smith, from CfA-ITC talk, March 31, 2016 cf. Moeckl & Burkert 2015, work of Hacar et al...

## SOME PLACES ARE SPECIAL



What are "special" places in ISM & how long do they last? —galactic plane, Bones —filaments' influence may last into cores—how long, and when, simulators?

How do "influences" change what is special? -magnetic fields, feedback, "collisions," but when, how & where, simulators?

## Sneak Preview of ALMA+AREPO B-field insights...

Hull, Mocz, Burkhart, Goodman, Girart, Cortes, Hernquist, Lai, Li, Springel 2016, Nature, under review.

Hull, Mocz, Burkhart, Goodman, Girart, Cortes, Hernquist, Lai, Li, Springel 2016, Nature, under review.









### 37350 AU [= 0.2 pc]

#### 3000 AU











### 37350 AU [= 0.2 pc]

#### 3000 AU







### 37350 AU [= 0.2 pc]

### 3000 AU











3500 AU



Please do not distribute





### 37350 AU [= 0.2 pc]

#### 3000 AU





# FILAMENTS: FAD OR FUNDAMENTAL?

### Alyssa A. Goodman Harvard-Smithsonan Center for Astrophyscs Radcliffe Institute for Advanced Study @aagie

Ophiuchus, Barnard 1919

3D dust: http://argonaut.skymaps.info

# Gaia 3D dust & glue



glue: http://glueviz.org





Astron. Nachr. / AN 333, No. 5/6, 505-514 (2012) / DOI 10.1002/asna.201211705

#### Principles of high-dimensional data visualization in astronomy

A.A. Goodman\*

Harvard-Smithsonian Center for Astrophysics, Cambridge, MA, USA

Received 2012 May 3, accepted 2012 May 4 Published online 2012 Jun 15

**Key words** cosmology: large-scale structure – ISM: clouds – methods: data analysis – techniques: image processing – techniques: radial velocities

Astronomical researchers often think of analysis and visualization as separate tasks. In the case of high-dimensional data sets, though, interactive *exploratory data visualization* can give far more insight than an approach where data processing and statistical analysis are followed, rather than accompanied, by visualization. This paper attempts to charts a course toward "linked view" systems, where multiple views of high-dimensional data sets update live as a researcher selects, highlights, or otherwise manipulates, one of several open views. For example, imagine a researcher looking at a 3D volume visualization of simulated or observed data, and simultaneously viewing statistical displays of the data set's properties (such as an x-y plot of temperature vs. velocity, or a histogram of vorticities). Then, imagine that when the researcher selects an interesting group of points in any one of these displays, that the same points become a highlighted subset in all other open displays. Selections can be graphical or algorithmic, and they can be combined, and saved. For tabular (ASCII) data, this kind of analysis has long been possible, even though it has been under-used in astronomy. The bigger issue for astronomy and other "high-dimensional" fields, though, is that no extant system allows for full integration of images and data cubes within a linked-view environment. The paper concludes its history and analysis of the present situation with suggestions that look toward cooperatively-developed open-source modular software as a way to create an evolving, flexible, high-dimensional, linked-view visualization environment useful in astrophysical research.









## Alyssa A. Goodman

Harvard-Smithsonian Center for Astrophysics & Radcliffe Institute with Chris Beaumont, Michelle Borkin, Penny Qian & Tom Robitaille



@aagie @glueviz @astrofrog



glueviz.org github.com/glue-viz Tom Robitaille, lead developer



James Webb Space Telescope



## "Linked Views"



## Open Source Python, on GitHub





### LINKED VIEWS OF HIGH-DIMENSIONAL DATA



figure, by M. Borkin, reproduced from <u>Goodman 2012</u>, "Principles of High-Dimensional Data Visualization in Astronomy"

## "HIGH-DIMENSIONAL" DATA



ATMOSPHERIC AND OCEANIC TEMPERATURE CHANGE







## DATA-DIMENSIONS-DISPLAY

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"

# "Time Series" History of the $\Lambda G$ , 1860-2009



Year



Year

## History of the AG, 1860-2009



Year

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





video by Tom Robitaille, lead glue developer glue created by: C. Beaumont, M. Borkin, P. Qian, T. Robitaille, and A. Goodman, PI

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



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Declination y ‡		
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slice \$		

video by Chris Beaumont, glue developer glue created by: C. Beaumont, M. Borkin, P. Qian, T. Robitaille, and A. Goodman, PI

# "BUT WAIT, THERE'S MORE..."

dollars logo - Google Search

Building Custom Data Viewers — Glue 0.9.0 documentation

balzer82.o

😭 Glue

Search docs

- Installing Glue
- Getting started
- 🗉 User Interface Guide
- B 3D viewers in Glue
- Using the IPython terminal in Glue
- Uverking with Data objects
- <sup>13</sup> Starting Glue from Python
- $\blacksquare$  Configuring Glue via a startup file
- Customizing your Glue environment
- Programmatically configuring plots

#### □ Building Custom Data Viewers

The Goal: Basketball Shot Charts

Shot Chart Version 1: Heatmap and plot

Shot Chart Version 2: Court markings

Shot Chart Version 3: Widgets

Shot Chart Version 4: Selection

**Viewer Subclasses** 

Valid Function Arguments

**UI Elements** 

**Other Guidelines** 

Watching data for changes

Read the Docs

v: stable 🔻

**Docs** » Building Custom Data Viewers

#### **Building Custom Data Viewers**



Glue's standard data viewers (scatter plots, images, histograms) are useful in a wide variety of data exploration settings. However, they represent a *tiny* fraction of the ways to view a particular dataset. For this reason, Glue provides a simple mechanism for creating custom visualizations using matplotlib.

Creating a custom data viewer requires writing a little bit of Matplotlib code but involves little to no GUI programming. The next several sections illustrate how to build a custom data viewer by

5 glue

C Edit on GITHU

# "BUT WAIT, THERE'S MORE..."

dollars logo - Google Search

#### 🔺 Glue

Search docs

- Installing Glue
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#### Building Custom Data Viewers

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**Viewer Subclasses** 

Valid Function Arguments



Building Custom Data Viewers — Glue 0.9.0 documentatio

**Docs** » Building Custom Data Viewers

"cuts" along arbitrary paths flood-fill selection (2D, 3D) export to d3po, plotly custom viewers (e.g. GIS, WorldWide Telescope, Super Mario) plot manipulation/customization (via Matplotlib) flexible import/export saved sessions (.glu)

### Anaconda Navigator install/upgrade

Slue's standard data viewers (scatter plots, images, histograms) are useful in a wide variety of data xploration settings. However, they represent a *tiny* fraction of the ways to view a particular dataset.

## Yes, please do go start adding code now, at github.com/glue-viz.

Creating a custom data viewer requires writing a little bit of Matplotlib code but involves little to no

Read the Docs

: stable ¬

cumentation balz



## INTEGRATION



astropy A Community Python Library for Astronomy

JavaScript

d3.js

.III. plotly

HTML

Python™

S SciPy

# THE CHALLENGE OF 3D SELECTION







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91

#### 오 42 Comments 🛛 🛓 Export 🔺 Unfollow

#### 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 demonsration 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 commuicate 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.



Astrometry.net

d3po/Authorea: Peek, Price-Whelan, Pepe, Beaumont, Borkin, Newton; PoF: Goodman, Peek; WWT: Wong, Fay et al.; Astrometry.net: Hogg, Lang, Roweis et al. 03

02

#### Konrad Hinsen 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 wil...

more

#### 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 Hinsen 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.

Christine L. Borgman 4 months ago · Private "publications"



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## Alyssa A. Goodman

Harvard-Smithsonian Center for Astrophysics & Radcliffe Institute with Chris Beaumont, Michelle Borkin, Penny Qian & Tom Robitaille



@aagie @glueviz @astrofrog



glueviz.org github.com/glue-viz Tom Robitaille, lead developer



James Webb Space Telescope

## extra slides
### Principles of high-dimensional data visualization in astronomy

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1	□ <u>2016A&amp;C1550N</u> Naiman, J. P.	1.000 AstroBlen	04/2016 d: An astrophysic	<u>AZE</u> cal visualization	<u>L</u> X on package	e for Ble	<u>R</u> <u>C</u> ender		<u>U</u>
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3	□ <u>2015ASPC495121R</u> Rosolowsky, E.; Kern, J.; Federl, P.; Jacobs, J.; Loveland, S.; Taylor, J.; Sivakoff, G.; Taylor, R.	1.000     09/2015     A Z E     L     T     R     U       The Cube Analysis and Rendering Tool for Astronomy							
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5	□ <u>2015A&amp;C1286P</u> Punzo, D.; van der Hulst, J. M.; Roerdink, J. B. T. M.; Oosterloo, T. A.; Ramatsoku, M.; Verheijen, M. A. W.	1.000 The role o	09/2015 f 3-D interactive	<u>A</u> <u>Z</u> <u>E</u> visualization	L <u>X</u> in blind su	rveys of	<u>R</u> C fHIin	galaxies	<u>U</u>
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7	<ul> <li><u>2013arXiv1307.0712B</u></li> <li>Burton, Michael; Crocker, Roland;</li> <li>Dickey, John; Filipovic, Miroslav;</li> <li>Purcell, Cormac; Rathborne, Jill;</li> <li>Rowell, Gavin; Tothill, Nick; Walsh, Andrew</li> </ul>	1.000     07/2013     A     Z     X     R     U       The Interstellar Medium White Paper							
8	© <u>2013PASP.125.731K</u> Kent, Brian R.	1.000 Visualizin	06/2013 g Astronomical I	AZEF Data with Bler	<u>L</u> X nder		<u>R</u> <u>C</u>	<u>S</u>	<u>U</u>
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## LINKED VIEWS OF HIGH-DIMENSIONAL DATA (IN PYTHON) GLUE





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

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





video by Penny Qian, wth Catherine Zucker, graduate students glue created by: C. Beaumont, M. Borkin, P. Qian, T. Robitaille, and A. Goodman, PI







Video courtesy of Chris Beaumont

LETTERS



Figure 2 Comparison of the 'dendrogram' and 'CLUMPFIND' featureidentification algorithms as applied to <sup>13</sup>CO emission from the L1448 region of Perseus. a, 3D visualization of the surfaces indicated by colours in the dendrogram shown in c. Purple illustrates the smallest scale selfgravitating structures in the region corresponding to the leaves of the dendrogram; pink shows the smallest surfaces that contain distinct selfgravitating leaves within them; and green corresponds to the surface in the data cube containing all the significant emission. Dendrogram branches corresponding to self-gravitating objects have been highlighted in yellow over the range of T<sub>mb</sub> (main-beam temperature) test-level values for which the virial parameter is less than 2. The x-y locations of the four 'selfgravitating' leaves labelled with billiard balls are the same as those shown in Fig. 1. The 3D visualizations show position-position-velocity (p-p-v) space. RA, right ascension; dec., declination. For comparison with the ability of dendrograms (c) to track hierarchical structure, d shows a pseudodendrogram of the CLUMPFIND segmentation (b), with the same four labels used in Fig. 1 and in a. As 'clumps' are not allowed to belong to larger structures, each pseudo-branch in **d** is simply a series of lines connecting the maximum emission value in each clump to the threshold value. A very large number of clumps appears in **b** because of the sensitivity of CLUMPFIND to noise and small-scale structure in the data. In the online PDF version, the 3D cubes (a and b) can be rotated to any orientation, and surfaces can be turned on and off (interaction requires Adobe Acrobat version 7.0.8 or higher). In the printed version, the front face of each 3D cube (the 'home' view in the interactive online version) corresponds exactly to the patch of sky shown in Fig. 1, and velocity with respect to the Local Standard of Rest increases from front  $(-0.5 \text{ km s}^{-1})$  to back  $(8 \text{ km s}^{-1})$ .

data, CLUMPFIND typically finds features on a limited range of scales, above but close to the physical resolution of the data, and its results can be overly dependent on input parameters. By tuning CLUMPFIND's two free parameters, the same molecular-line data set<sup>8</sup> can be used to show either that the frequency distribution of clump mass is the same as the initial mass function of stars or that it follows the much shallower mass function associated with large-scale molecular clouds (Supplementary Fig. 1).

Four years before the advent of CLUMPFIND, 'structure trees'9 were proposed as a way to characterize clouds' hierarchical structure Web. 457/1 Jam

-1v 2D work as inspira-

... thm that

using 2D maps of column density. With th tion, we have developed a structure-id abstracts the hierarchical structure of a an easily visualized representation calle well developed in other data-intensive application of tree methodologies so fa and almost exclusively within the ar 'merger trees' are being used with in Figure 3 and its legend explain the process of star formation schematically. The dendrogram qua ima of emission merge with each explained in Supplementary Meth determined almost entirely by the sensitivity to algorithm parameter possible on paper and 2D screen data (see Fig. 3 and its legend cross, which eliminates dimenpreserving all information Numbered 'billiard ball' lab features between a 2D map online) and a sorted dendre A dendrogram of a spectr of key physical properties

A role for self-gravity at multiple length scales in the 935a A. Goodman<sup>1,2</sup> Erik W. Rosolowsky<sup>2,3</sup>, Michelle A. Borkin<sup>1</sup>†, Jonathan B. Foster<sup>3</sup>, Michael Halle<sup>1,4</sup>, na Kaudtmann<sup>1,3</sup> & Jaime E. Bineda<sup>2</sup> surfaces, such as radius (R), (L). The volumes can have any shape, and in

the significance of the especially elongated features (Fig. 2a). The luminosity is an approximate proxy for mass, suc that  $M_{\text{lum}} = X_{13\text{CO}}L_{13\text{CO}}$ , where  $X_{13\text{CO}} = 8.0 \times 10^{20} \text{ cm}^2 \text{ K}^{-1} \text{ km}^{-1} \text{ s}$ (ref. 15; see Supplementary Methods and Supplementary Fig. 2). The derived values for size, mass and velocity dispersion can then be used to estimate the role of self-gravity at each point in the hierarchy, via calculation of an 'observed' virial parameter,  $\alpha_{obs} = 5\sigma_v^2 R/GM_{lum}$ . In principle, extended portions of the tree (Fig. 2, yellow highlighting) where  $\alpha_{obs} < 2$  (where gravitational energy is comparable to or larger than kinetic energy) correspond to regions of p-p-v space where selfgravity is significant. As  $\alpha_{obs}$  only represents the ratio of kinetic energy to gravitational energy at one point in time, and does not explicitly capture external over-pressure and/or magnetic fields16, its measured value should only be used as a guide to the longevity (boundedness) of any particular feature.



Figure 3 | Schematic illustration of the dendrogram process. Shown is the construction of a dendrogram from a hypothetical one-dimensional emission profile (black). The dendrogram (blue) can be constructed by 'dropping' a test constant emission level (purple) from above in tiny steps (exaggerated in size here, light lines) until all the local maxima and mergers are found, and connected as shown. The intersection of a test level with the emission is a set of points (for example the light purple dots) in one dimension, a planar curve in two dimensions, and an isosurface in three dimensions. The dendrogram of 3D data shown in Fig. 2c is the direct analogue of the tree shown here, only constructed from 'isosurface' rather than 'point' intersections. It has been sorted and flattened for representation on a flat page, as fully representing dendrograms for 3D data cubes would require four dimensions.



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



2009

**3D PDF** 

HIGH-

Vol 457 1 January 2009 doi:10.1038/nature07609

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## 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><sup>†</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 ~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 ~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 'dendrogram' (hierarchical tree-diagram) analysis that reveals that self-gravity plays a significant role over the full range of possible scales traced by <sup>13</sup>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 dendrogram'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



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# ASTRONOMICAL MEDICINE



Chang, et al. 2011, brain.oxfordjournals.org/content/134/12/3632

## ASTRONOMICAL MEDICINE



"z" is depth into head

"z" is line-of-sight velocity

mage size: 520 × 274 ′iew size: 1305 × 733 /L: 63 WW: 127

# ASTRONOMICAL MEDICINE

mm peak (Enoch et al. 2006)

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

<sup>13</sup>CO (Ridge et al. 2006)

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

Optical image (Barnard 1927)

n: 17249 oom: 227% Angle: 0









### NESSIE



Bottom panel: Red=column density from Herschel, green=70 micron data from Herschel, and blue= 8 micron data image courtesy of Cara Battersby

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### COHERENCE IN DENSE CORES. II. THE TRANSITION TO COHERENCE

ALYSSA A. GOODMAN<sup>1</sup>

Harvard University Department of Astronomy, Cambridge, MA 02138; agoodman@cfa.harvard.edu JOSEPH A. BARRANCO

Astronomy Department, University of California, Berkeley, Berkeley, CA 94720; barranco@ucbast.berkeley.edu

DAVID J. WILNER Harvard-Smithsonian Center for Astrophysics, 60 Garden Street, Cambridge, MA 02138; dwilner@cfa.harvard.edu

Five College Radio Astronomy Observatory, University of Massachusetts, Amherst, MA 01003; heyer@fcrao1.phast.umass.edu

After studying how line width depends on spatial scale in low-mass star-forming regions, we propose that "dense cores" (Myers & Benson 1983) represent an inner scale of a self-similar process that charac-



FIG. 10.—An illustration of the transition to coherence. Color and shading schematically represent velocity and density in this figure. On large scales, material (labeled chaff) is distributed in a self-similar fashion, and its filling factor is low. On scales smaller than some fiducial radius, the filling factor of gas increases substantially, and a coherent dense core, which is not self-similar, is formed. Due to limitations in the authors' drawing ability, the figure emphasizes a particular size scale in the chaff, which should actually exhibit self-similar structure on all scales ranging from the size of an entire molecular cloud complex down to a coherent core.

