

Note: This is not a “presentation”, per se.

It is a Keynote file with “notes” use in the discussions of dendrogramming the Pipe at the Grenada meeting (May 2009) organized by J.Alves.

# Dendro Pipe

Alyssa Goodman

+Joao Alves, Jens Kauffmann\*, Jaime Pineda\*\* & Erik Rosolowsky

\*special thanks to Jens for his “mass-radius” & “AstroMed” work

\*\*special thanks to Jaime for help with slides & all the CLUMPFIND work!





# CLUMPFIND

Non-hierarchical

**CMF** easy

OK in “sparse” regions

BAD (unrealistic) in  
“crowded” regions



# CLUMPFIND

vs.

Non-hierarchical

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# CLUMPFIND

vs.

# DENDROGRAMS

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Hierarchical

**CMF** hard  
...to nonsensical(?)

OK in both sparse &  
crowded regions



# CLUMPFIND

vs.

# DENDROGRAMS

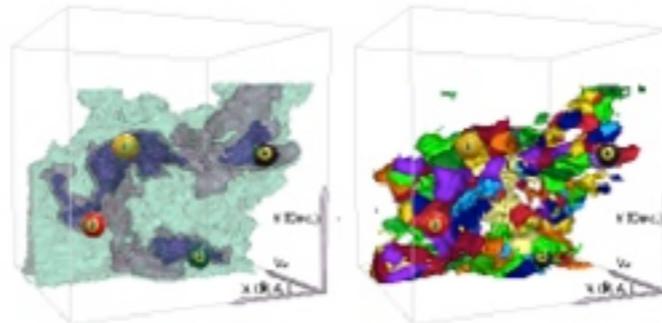
Non-hierarchical

CMF easy

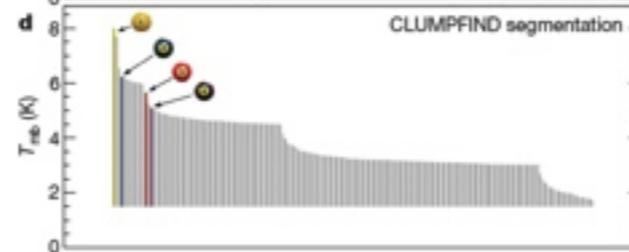
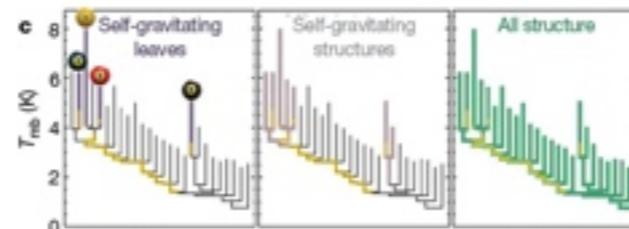
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LETTERS



Click to rotate



Hierarchical

CMF hard

...to nonsensical(?)

OK in both sparse &  
crowded regions

# How good/bad is CLUMPFIND?

## On the fidelity of the core mass functions derived from dust column density data

J. Kainulainen<sup>1,2</sup>, C. J. Lada<sup>3</sup>, J. M. Rathborne<sup>3</sup>, and J. F. Alves<sup>4</sup>

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Received 16; accepted 16

### ABSTRACT

*Aims.* We examine the recoverability and completeness limits of the dense core mass functions (CMFs) derived for a molecular cloud using extinction data and a core identification scheme based on two-dimensional thresholding. We study how the selection of core extraction parameters affects the accuracy and completeness limit of the derived CMF and the core masses, and also how accurately the CMF can be derived in varying core crowding conditions.

*Methods.* We performed simulations where a population of artificial cores was embedded into the variable background extinction field of the Pipe nebula. We extracted the cores from the simulated extinction maps, constructed the CMFs, and compared them to the input CMFs. The simulations were repeated using a variety of extraction parameters and several core populations with differing input mass functions and differing degrees of crowding.

*Results.* The fidelity of the observed CMF depends on the parameters selected for the core extraction algorithm for our background. **More importantly, it depends on how crowded the core population is.** We find that the observed CMF recovers the true CMF reliably when the mean separation of cores is larger than the mean diameter of the cores ( $f > 1$ ). If this condition holds, the derived CMF for the Pipe nebula background is accurate and complete above  $M \gtrsim 0.8 \dots 1.5 M_{\odot}$ , depending on the parameters used for the core extraction. In the simulations, the best fidelity was achieved with the detection threshold of 1 or 2 times the rms-noise of the extinction data, and with the contour level spacings of 3 times the rms-noise. Choosing larger threshold and wider level spacings increases the limiting mass. The simulations also show that when  $f \gtrsim 1.5$ , the masses of individual cores are recovered with a typical uncertainty of 25 ... 30 %. When  $f \approx 1$  the uncertainty is  $\sim 60$  %. In very crowded cases where  $f < 1$  the core identification algorithm is unable to recover the masses of the cores adequately, and the derived CMF is unlikely to represent the underlying CMF. For the cores of the Pipe nebula  $f \approx 2.0$  and therefore the use of the method in that region is justified.

**Key words.** dust, extinction – ISM: clouds – ISM: structure – stars: formation – stars: luminosity function, mass function

# How good/bad is CLUMPFIND?

## THE PERILS OF CLUMPFIND: THE MASS SPECTRUM OF SUB-STRUCTURES IN MOLECULAR CLOUDS

JAIME E. PINEDA<sup>1</sup>, ERIK W. ROSOLOWSKY<sup>2</sup>, AND ALYSSA A. GOODMAN<sup>1</sup>

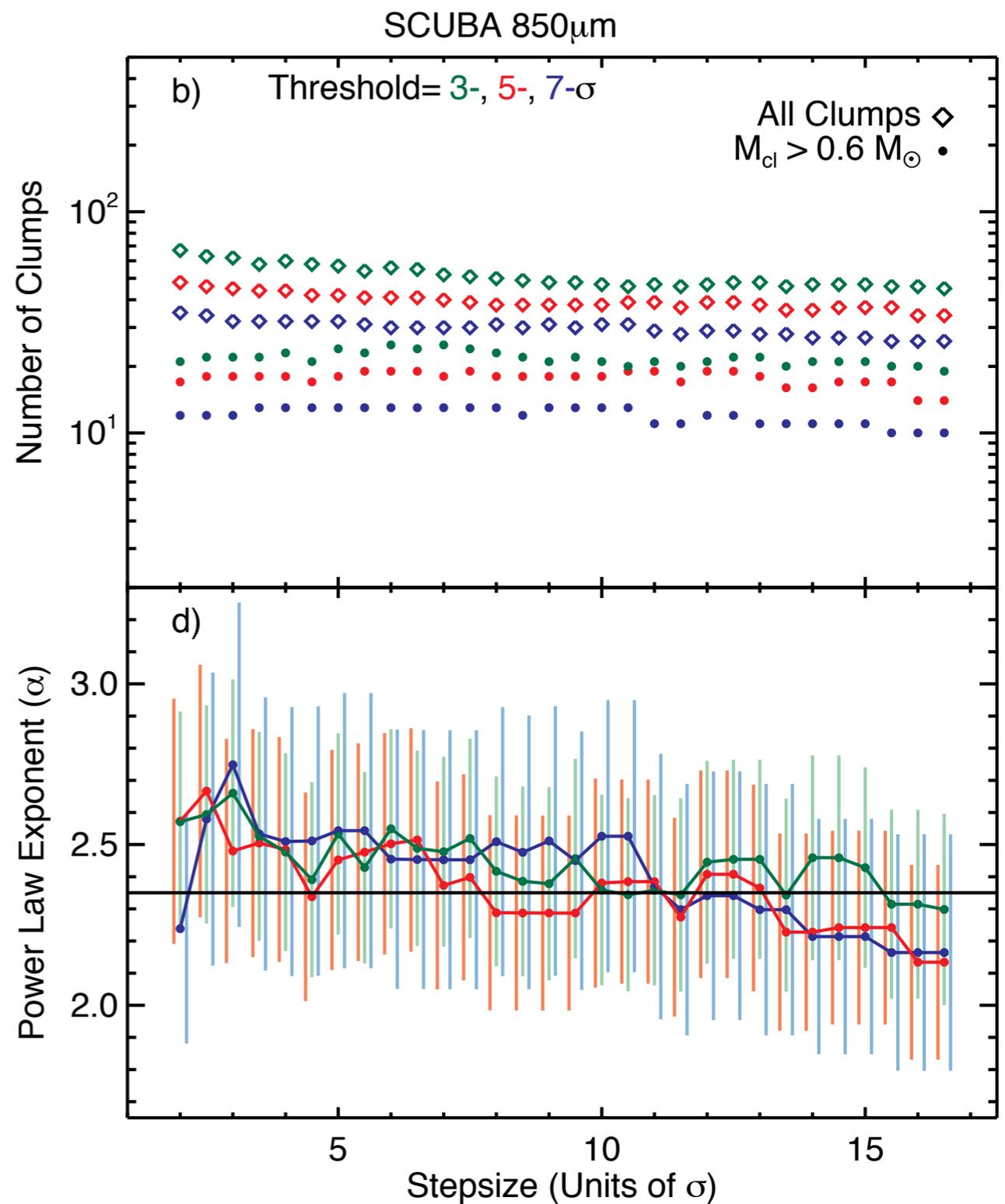
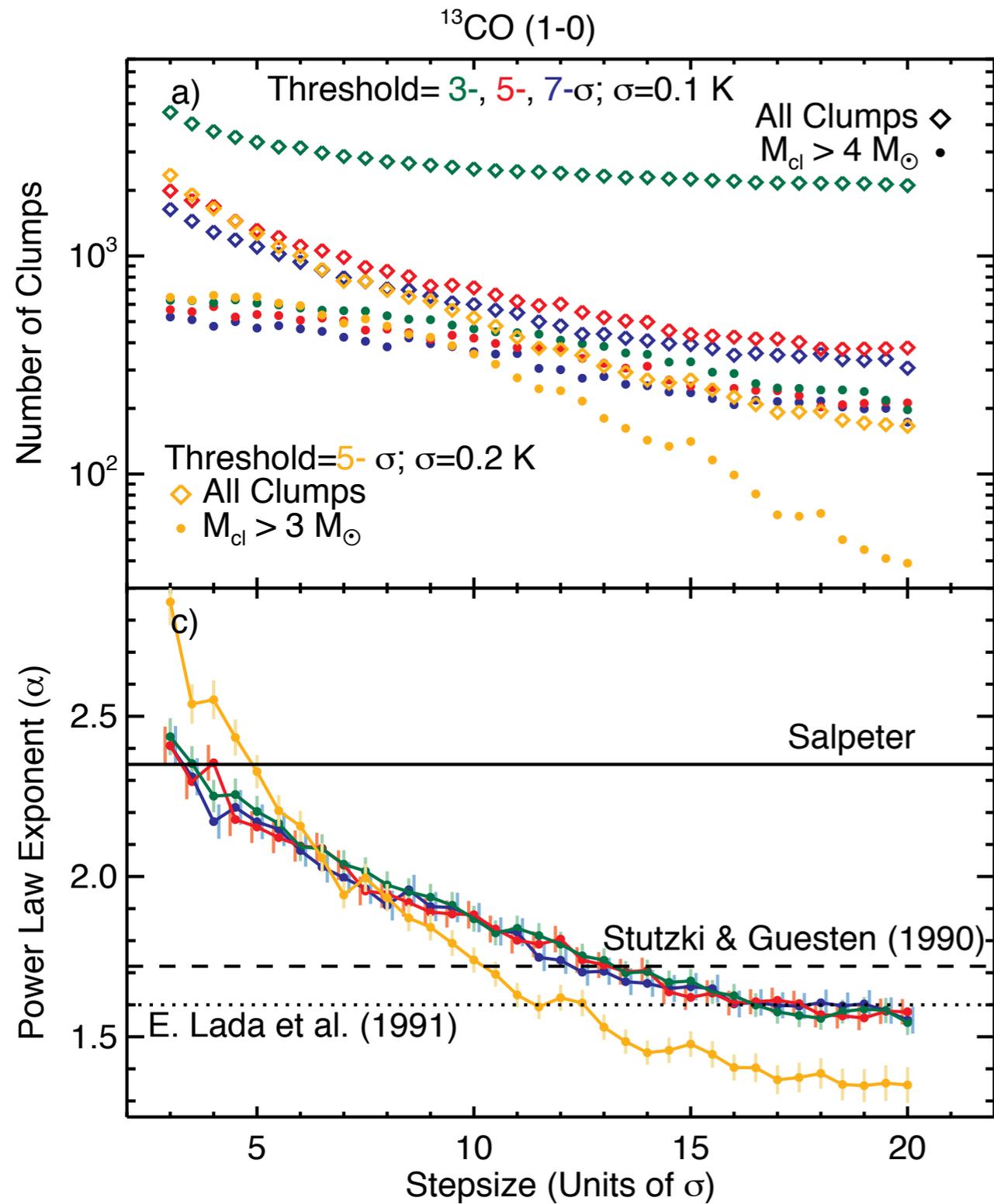
*Draft version 6.0, Apr/29/2009, JEP*

### ABSTRACT

We study the robustness of the mass spectrum derived using the CLUMPFIND algorithm. Both 2D and 3D versions of the CLUMPFIND algorithm are tested, on 850  $\mu\text{m}$  dust emission and  $^{13}\text{CO}$  (1–0) spectral-line observations of the Perseus Molecular Cloud Complex from the COMPLETE survey. To quantify the algorithm's performance, the two parameters in the algorithm are varied: threshold and stepsize. The effects of varying stepsize are very different in the "2D" and "3D" cases. In the 2D case, where emission in the 850  $\mu\text{m}$  maps used is relatively isolated (associated with only the densest peaks in the cloud), the variability in the mass spectrum is negligible compared to the uncertainties in the mass function fit. In the 3D case, however, where the  $^{13}\text{CO}$  emission traces the bulk of the molecular cloud, the number of clumps and the derived mass spectrum are *highly correlated with the stepsize used*. In both the 2D and 3D case, the effect of using a different threshold is less important, as it mainly changes the number of objects identified below the completeness limit. The distinction between "2D" and "3D" here is **more importantly also a distinction between "sparse" and "crowded"** emission. In any "crowded" case, CLUMPFIND should not be used blindly to derive mass functions. CLUMPFIND's output in the "crowded" case can still offer a statistical description of emission useful in inter-comparisons, but the clump-list should not be treated as a robust region decomposition region suitable for use in the construction of a physically-meaningful mass function.

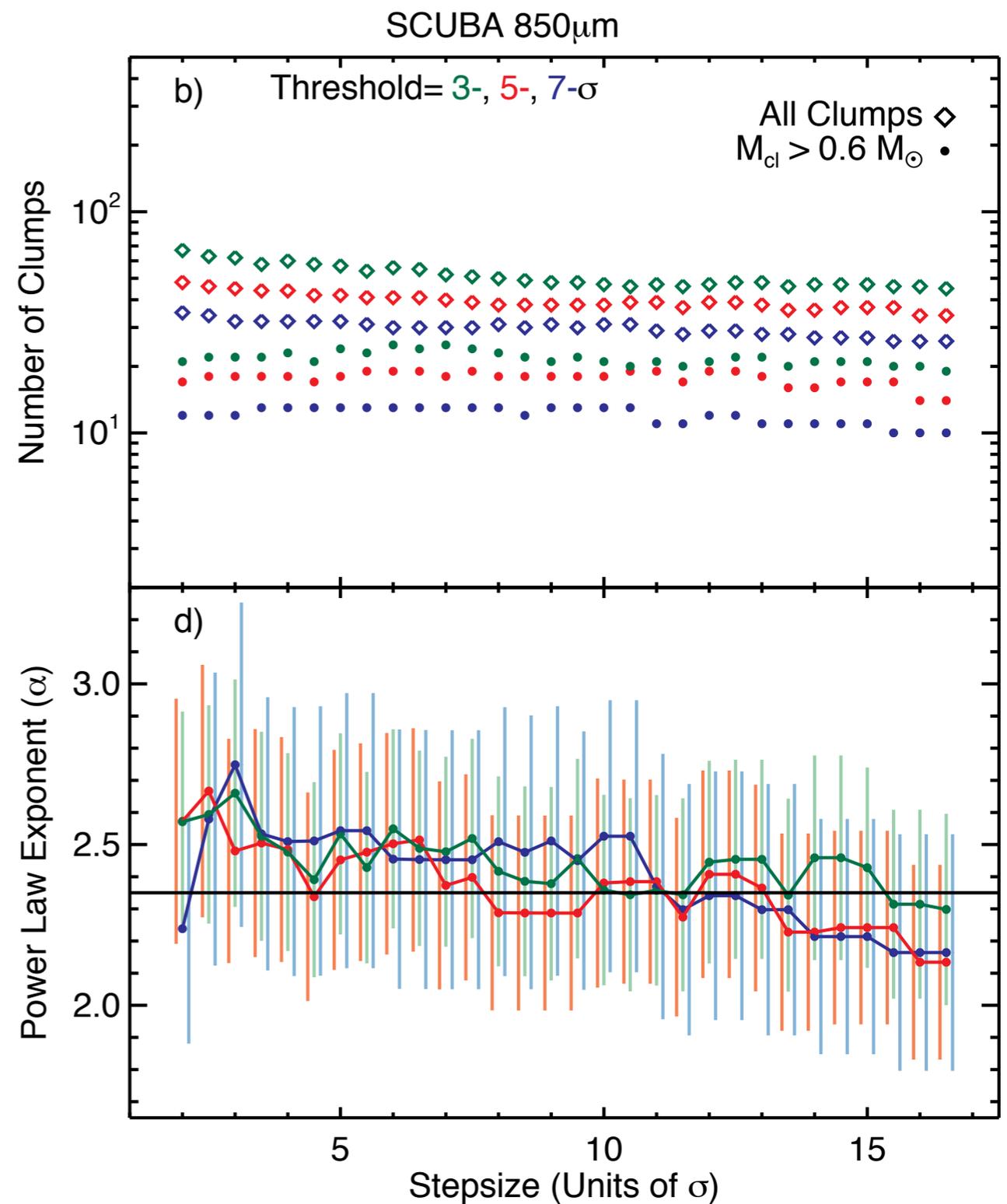
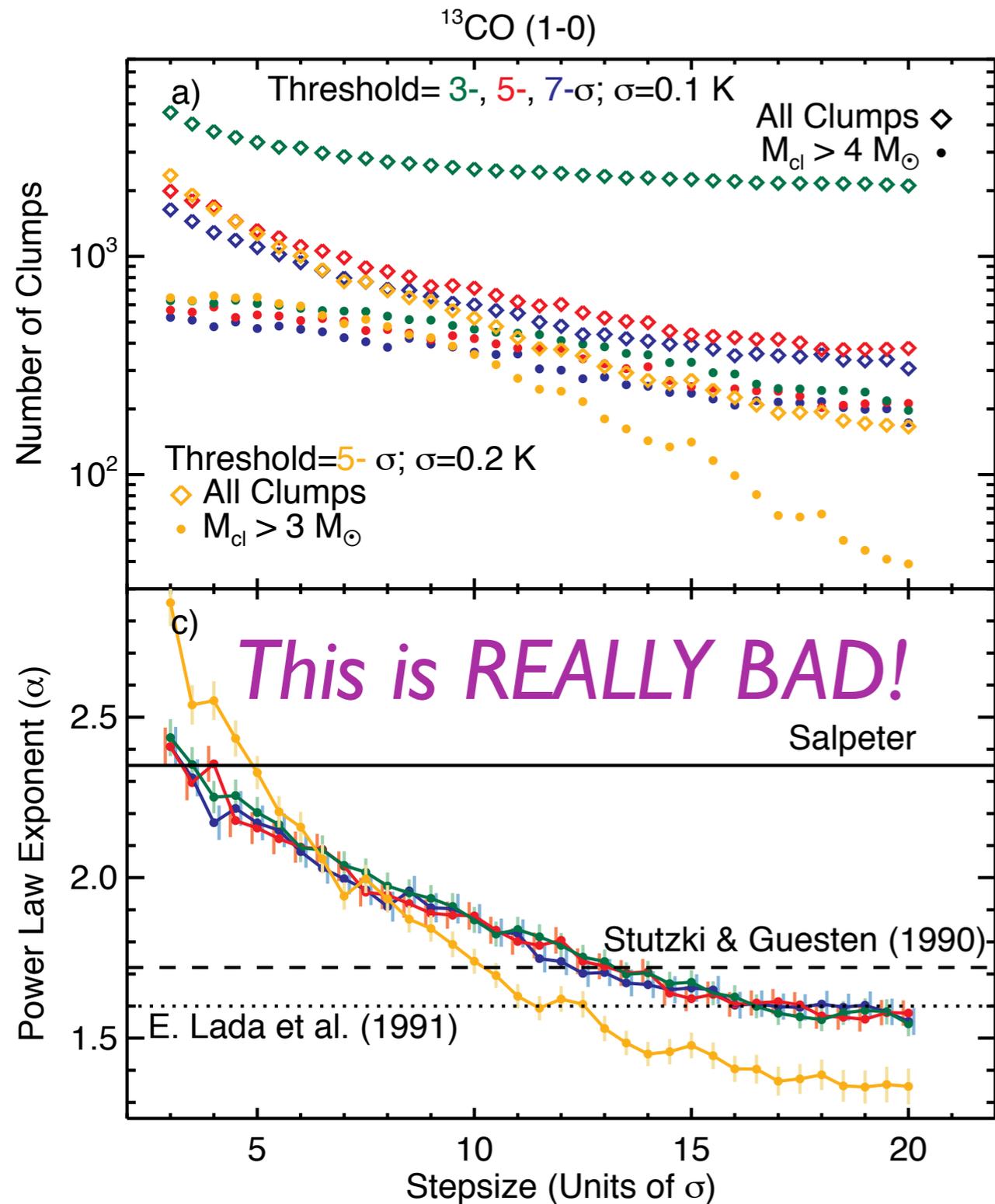
*Subject headings:* ISM: clouds — stars: formation — ISM: molecules — ISM: individual (Perseus molecular complex)

# How good/bad is CLUMPFIND?



*Pineda, Rosolowsky & Goodman 2009*

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*Pineda, Rosolowsky & Goodman 2009*

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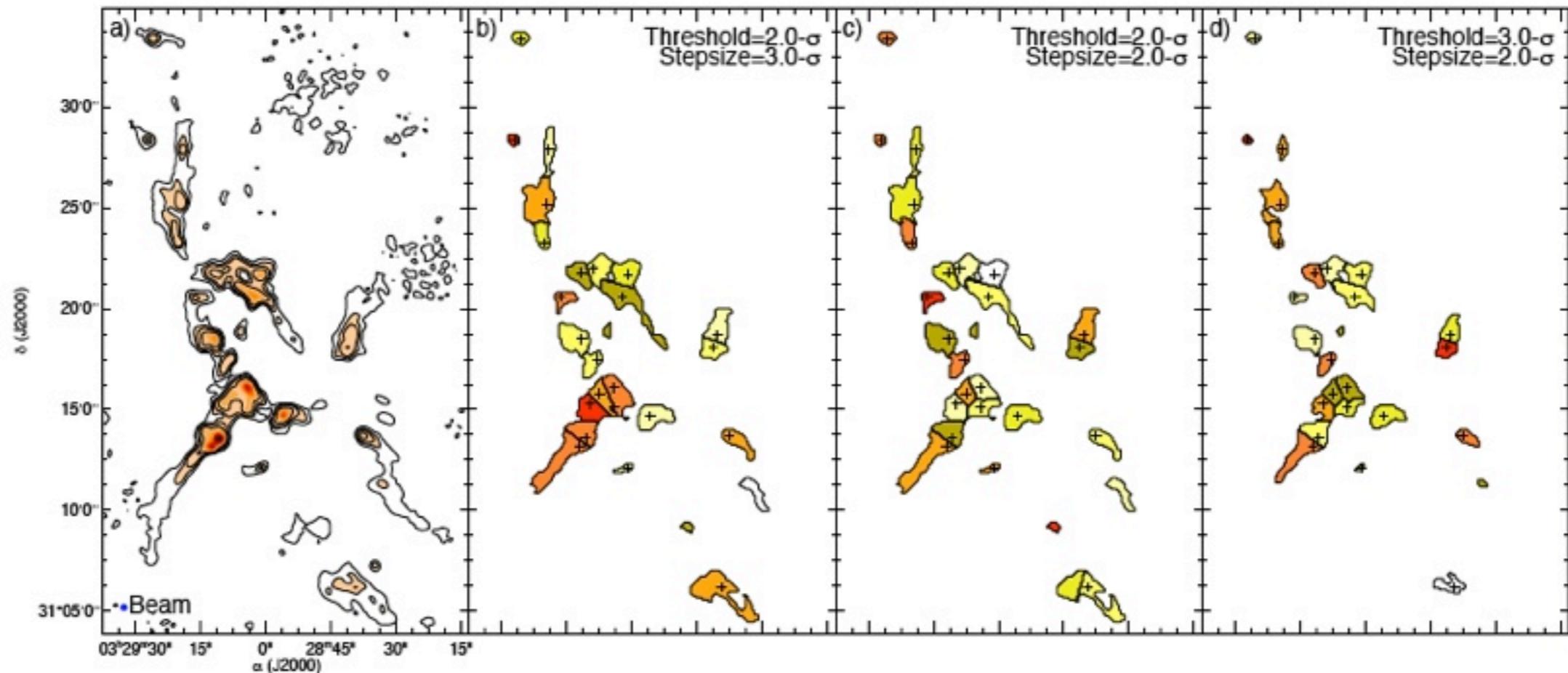


FIG. 3.— Comparison of different CLUMPFIND runs on the NGC1333 region. Panels b, c and d show clumps found in three different CLUMPFIND runs, and crosses mark the position of cores found by Kirk et al. (2006). Panel a shows the dust emission map in the NGC1333 region, with the overlaid contours at 1-, 3-, 5-, and 10- $\sigma$  level; in addition the beam size (19.9'') is shown in bottom left corner. Small changes in the parameters used generate small (but important) changes the catalogue obtained.

# Dendro Pipe: What do we want to know?

1. Is pre-wavelet CLUMPFIND useful?
  1. No. The structures identified do not correspond well to those seen by-eye, or to dense core positions.
2. Is post-wavelet CLUMPFIND useful? (Yes, João says so!)
  - 2.1. Are the clumps cores? (e.g. is  $\text{NH}_3$  detected?)...answer from this A.M.!?)
  - 2.2. Are the clumps physically possible? (Mostly, see Charlie's discussion...)
3. What can dendrograms tell us that CLUMPFIND cannot?
  - 3.1. Nested-ness (hierarchy) of structure
  - 3.2. Realistic "boundedness" of structures using spectral-line maps
4. How do CLUMPFIND "clumps" correspond to structures one can find with dendrograms?
  - 4.1. Relationship to "real" dense cores...  
(What does "real" really mean?... Is  $\text{NH}_3$  enough? ... sub-mm peaks?)

# Pre-Wavelet CLUMPFIND

*Thanks to Jaime Pineda for this figure...*

# Pre-Wavelet CLUMPFIND

## Definition of hugly

**hugly** ★

adjective

1. extremely ugly. An contraction of "hella ugly."

That girl is hugly!

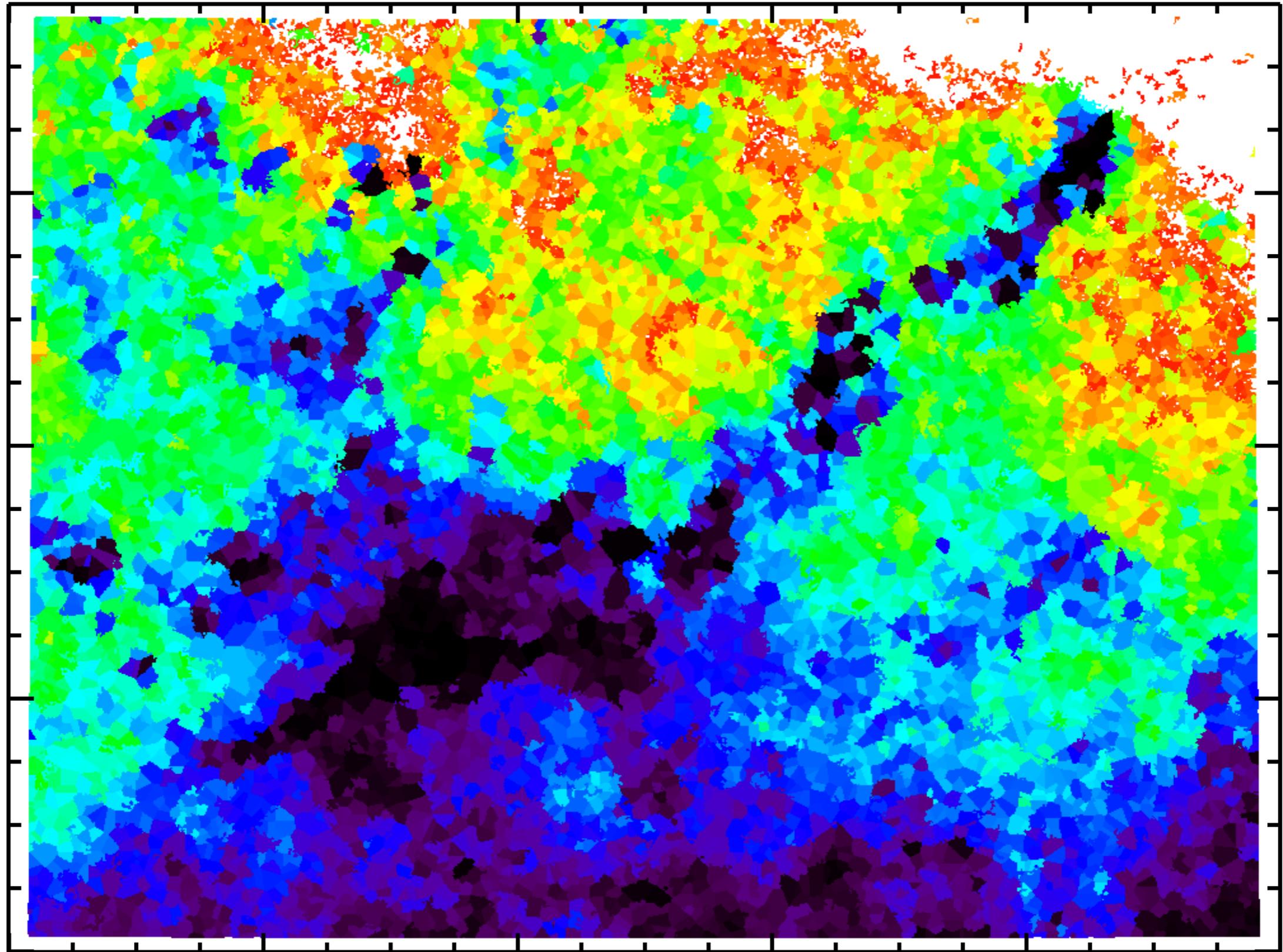
*Submitted by Rob E. W., DE, USA, Dec 31 2002.*

**Discover** slang words with the same meaning:

- unattractive, ugly

*Thanks to Jaime Pineda for this figure...*

# Pre-Wavelet CLUMPFIND

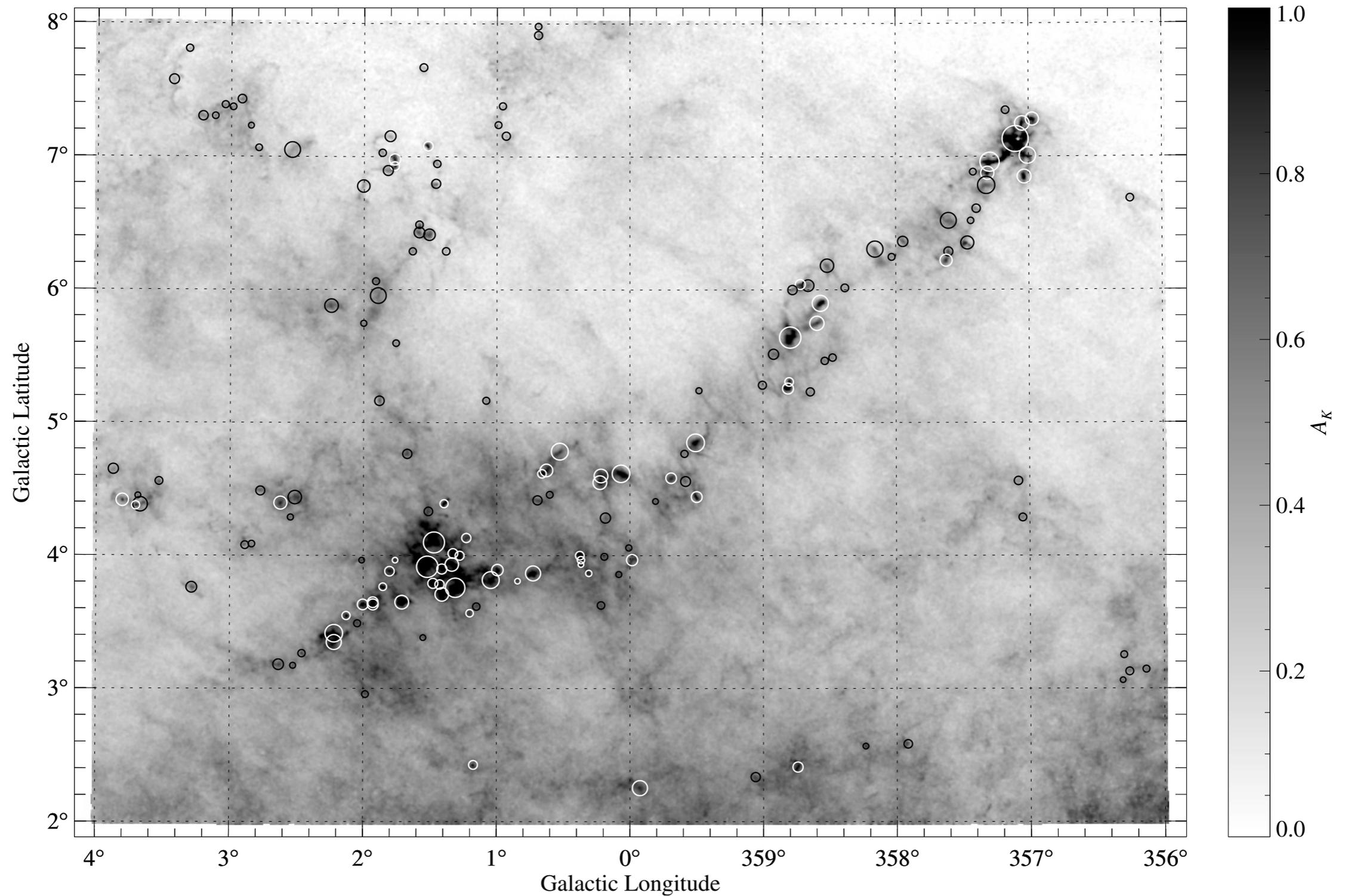


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# Post-wavelet CLUMPFIND+unseeded dendro

L18

J. Alves et al.: The mass function of dense molecular cores and the origin of the IMF

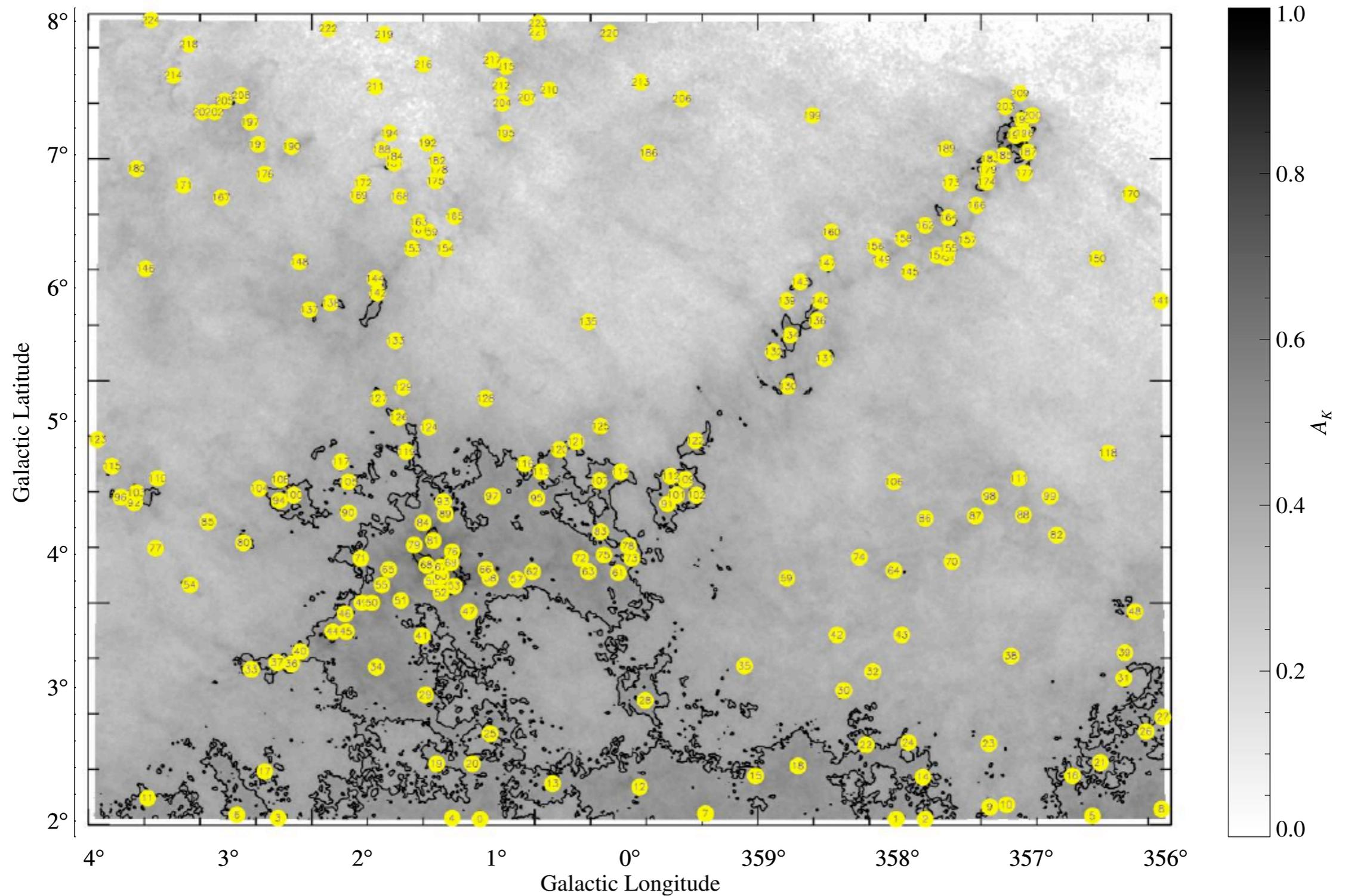


**Fig. 1.** Dust extinction map of the Pipe nebula molecular complex from Lombardi et al. (2006). This map was constructed from near-infrared observations of about 4 million stars in the background of the complex. Approximately 160 individual cores are identified within the cloud and are marked by an open circle proportional to the core radius. Most of these cores appear as distinct, well separated entities.

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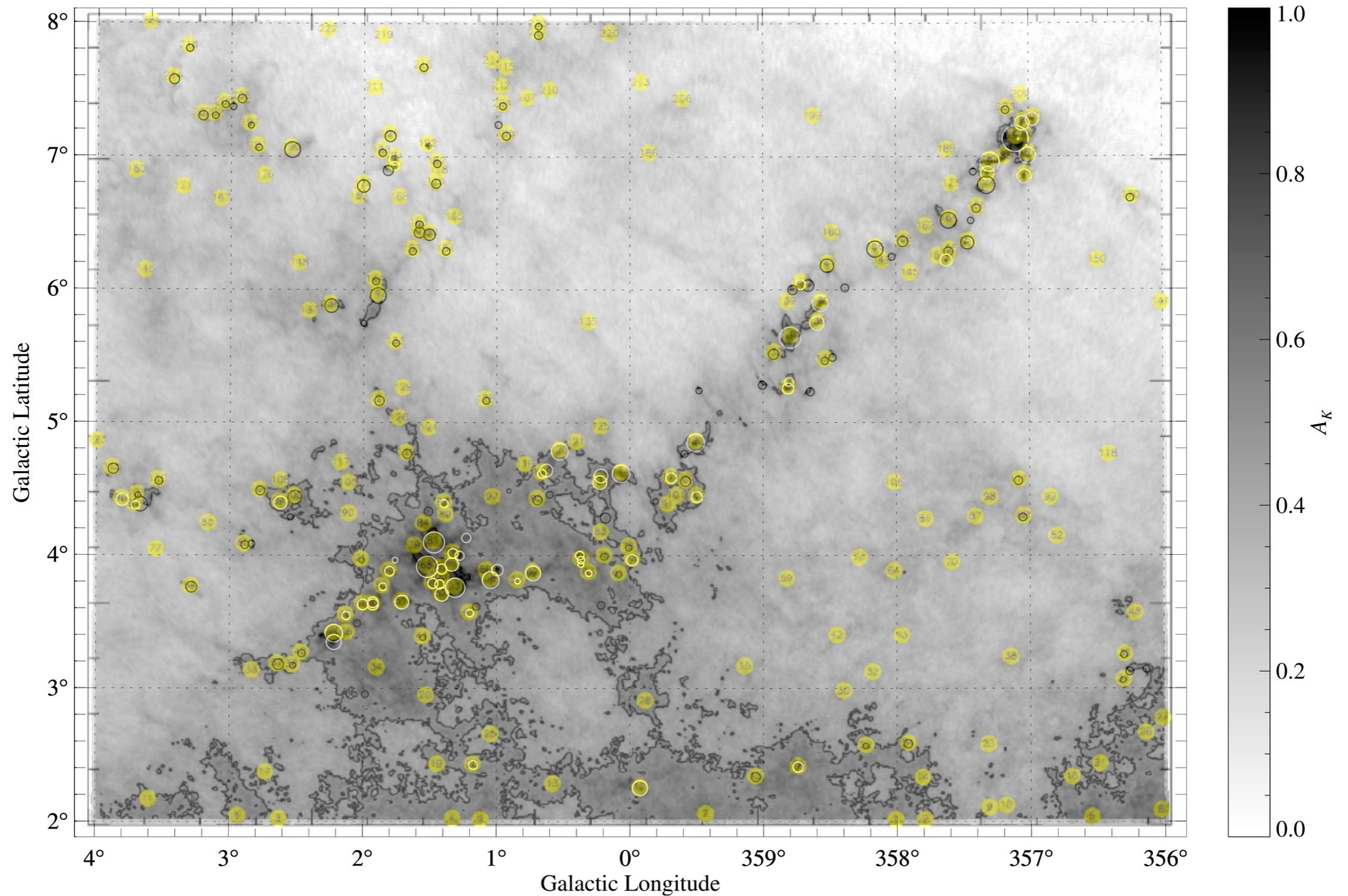


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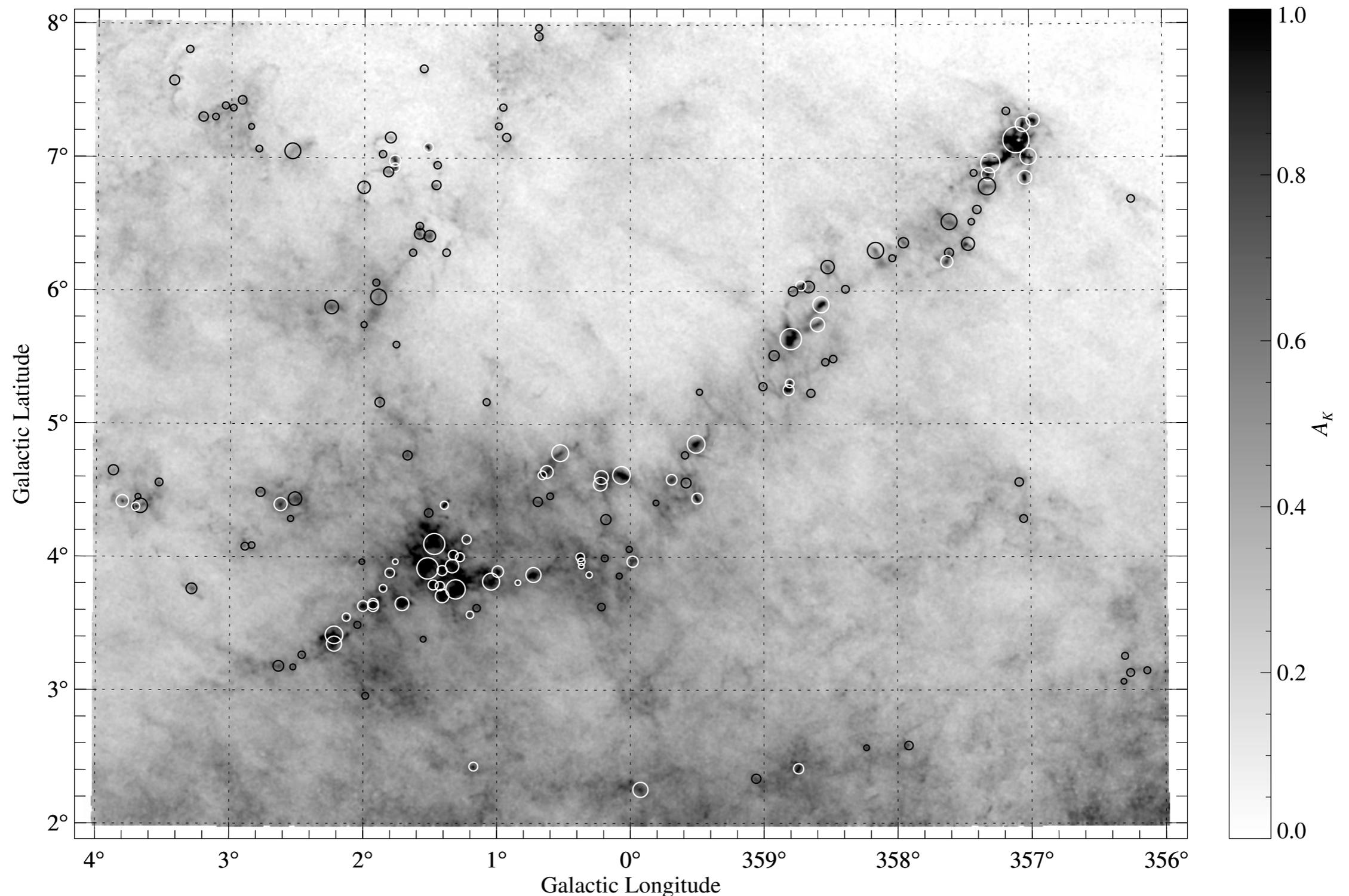


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L18

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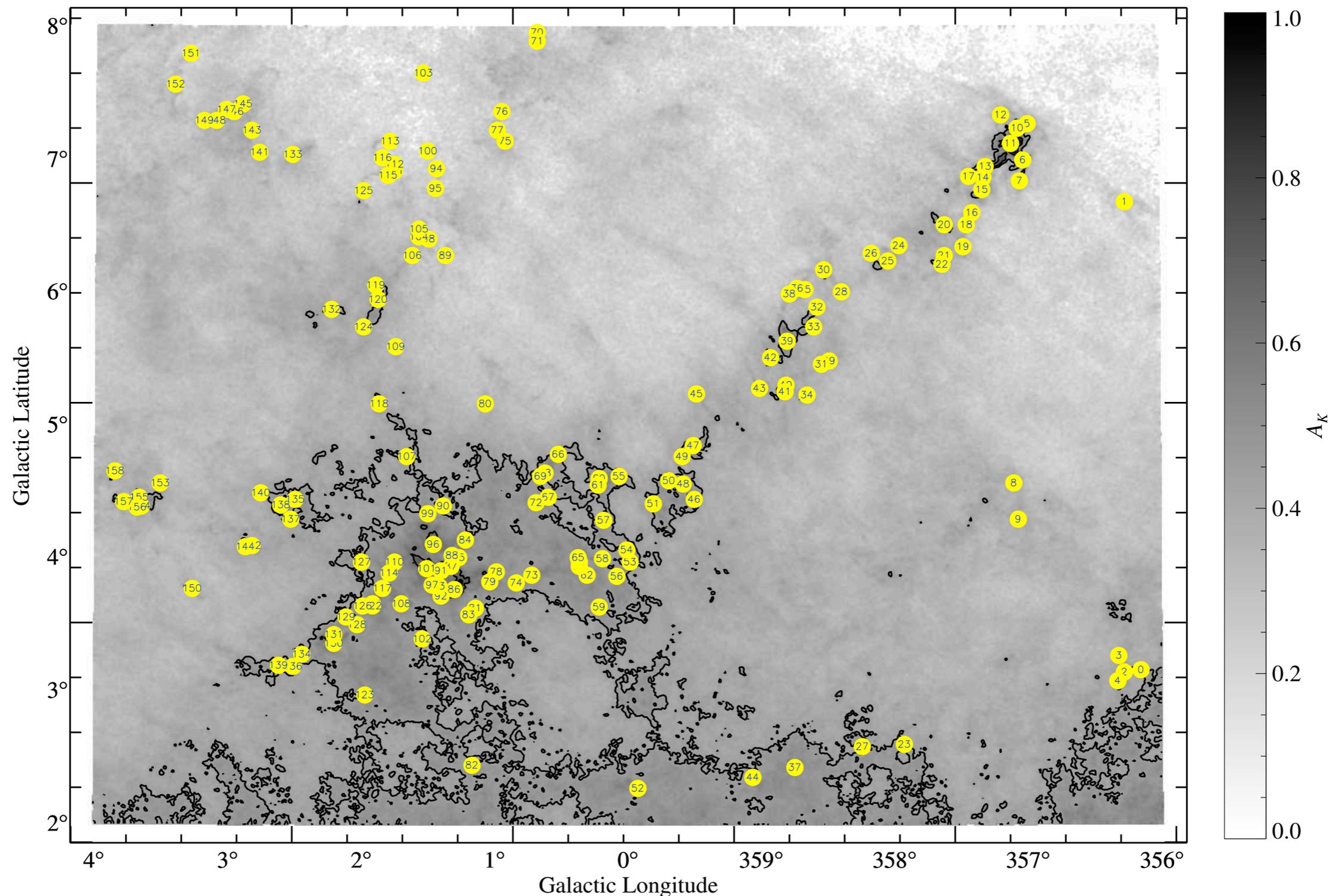


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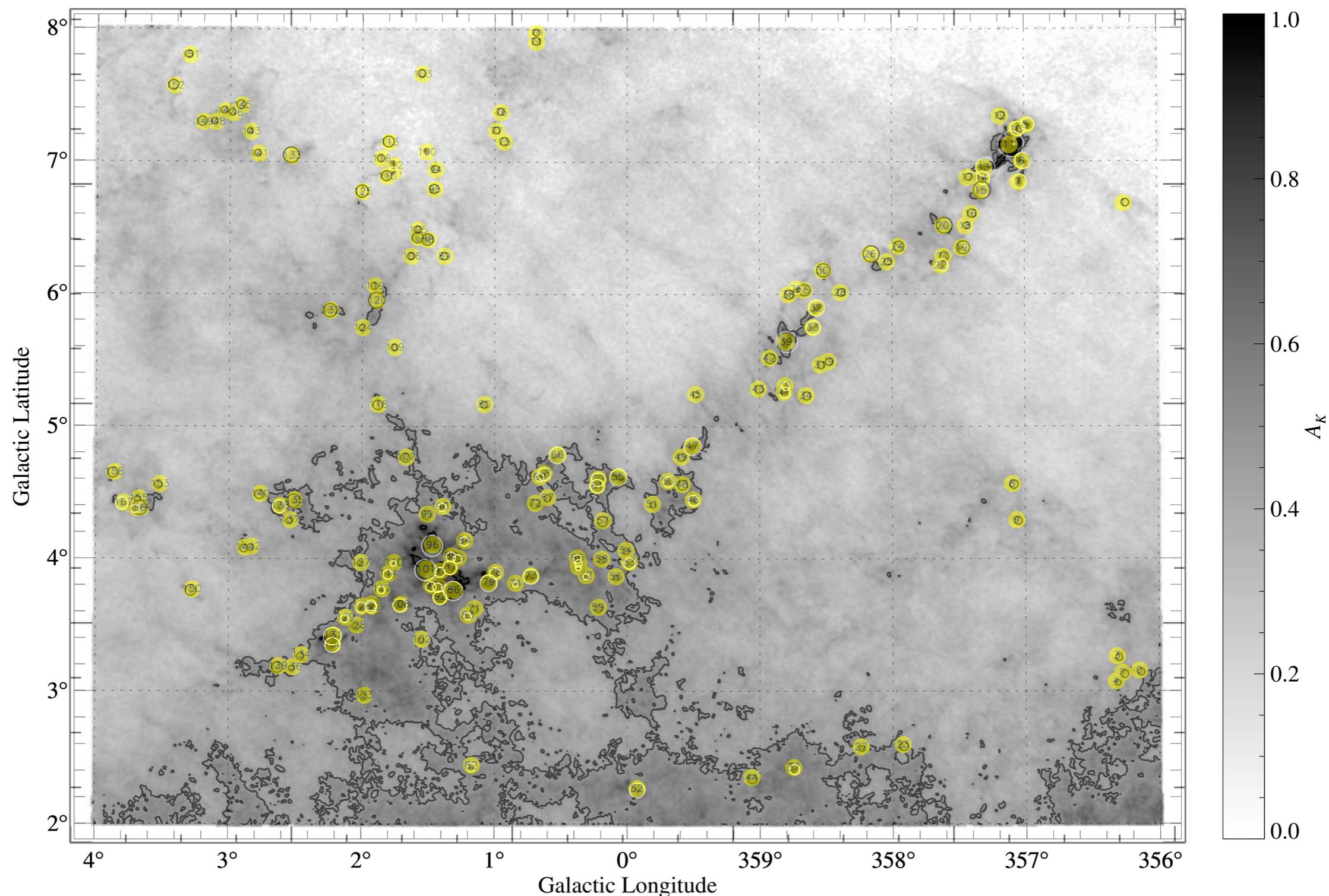


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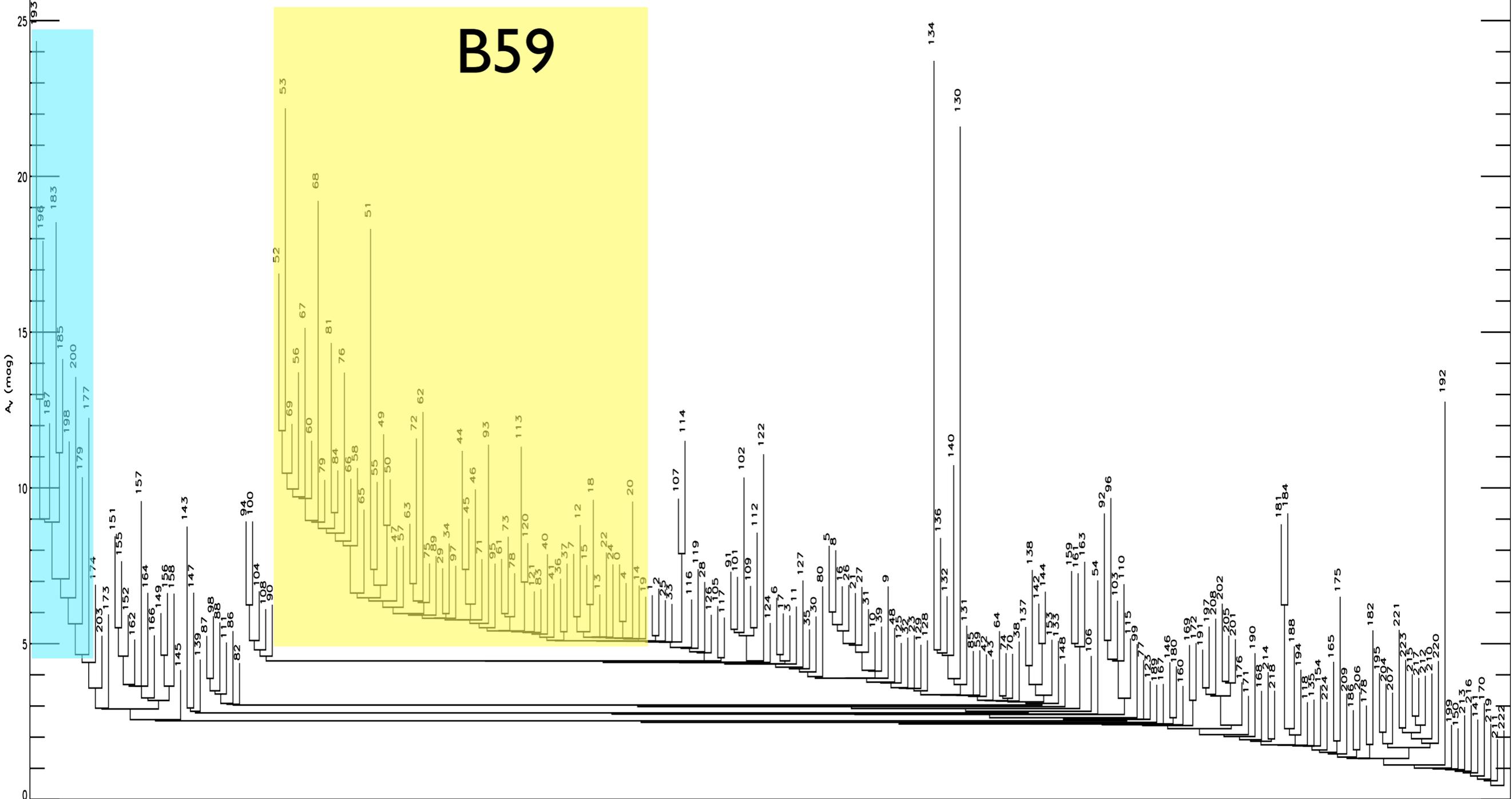
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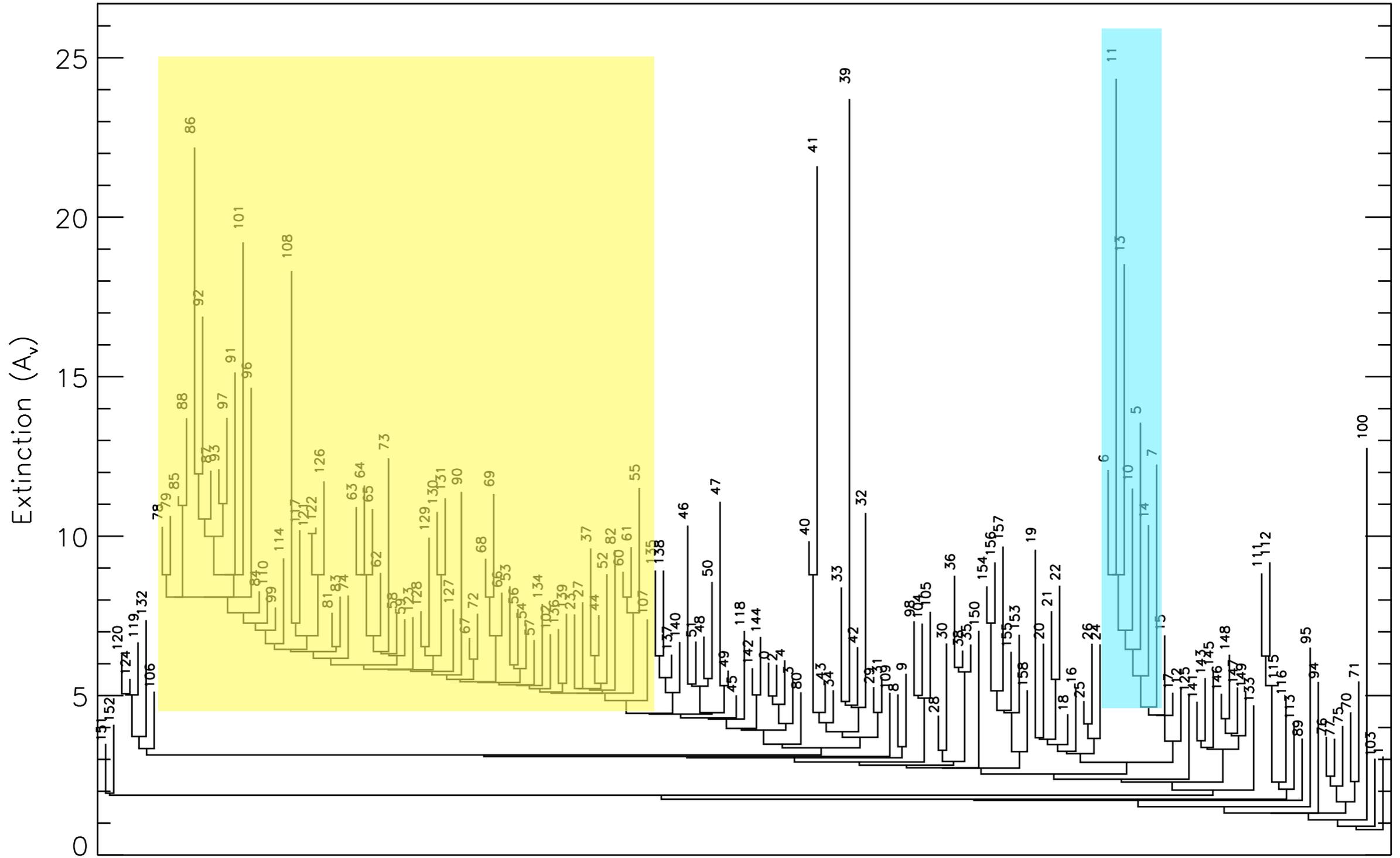
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# Full Original Pipe Dendrogram (Erik)

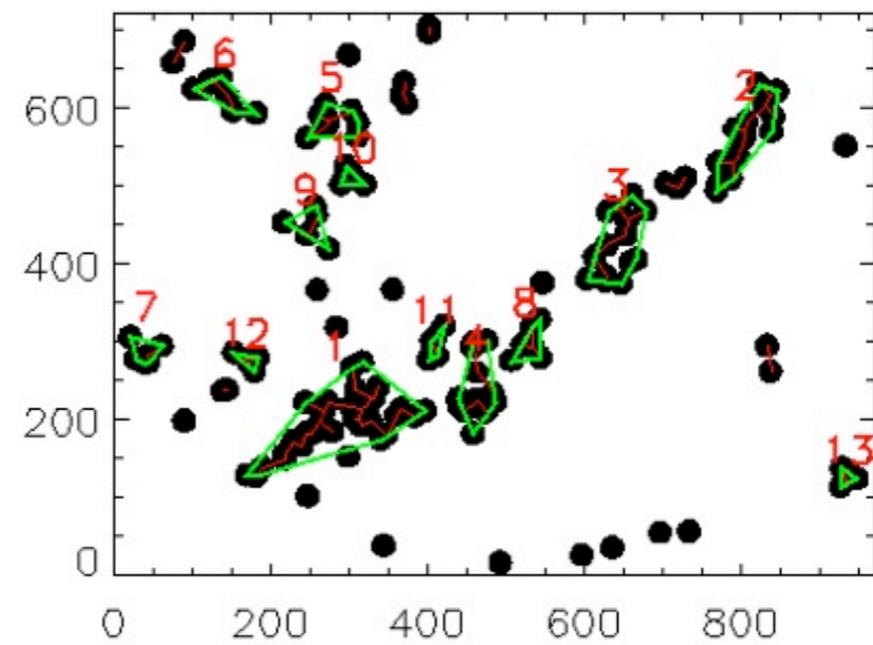
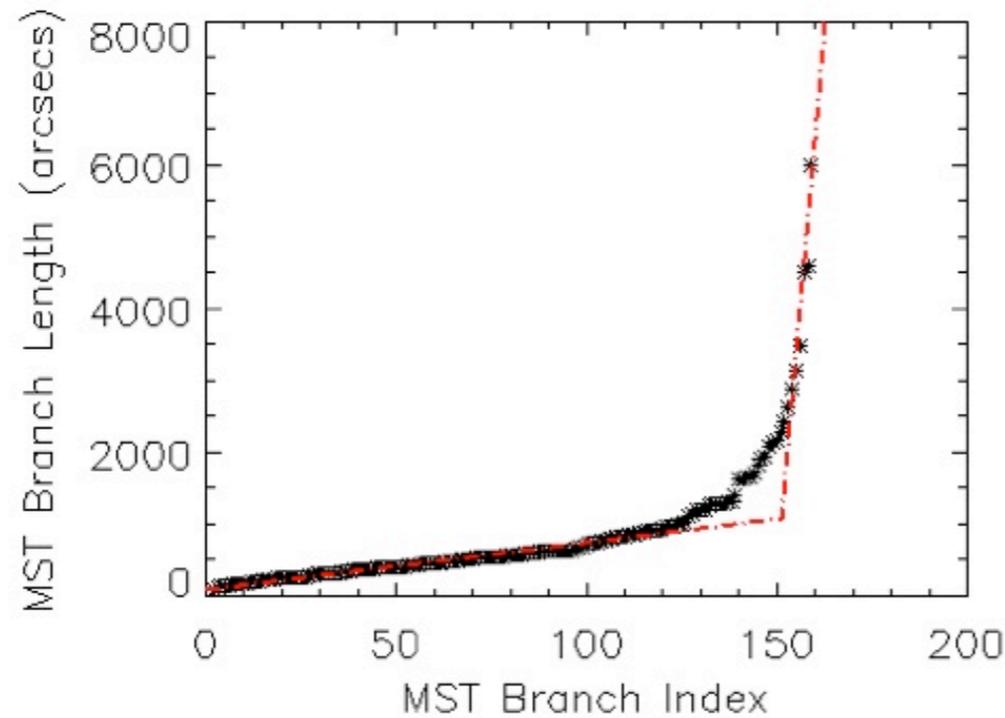
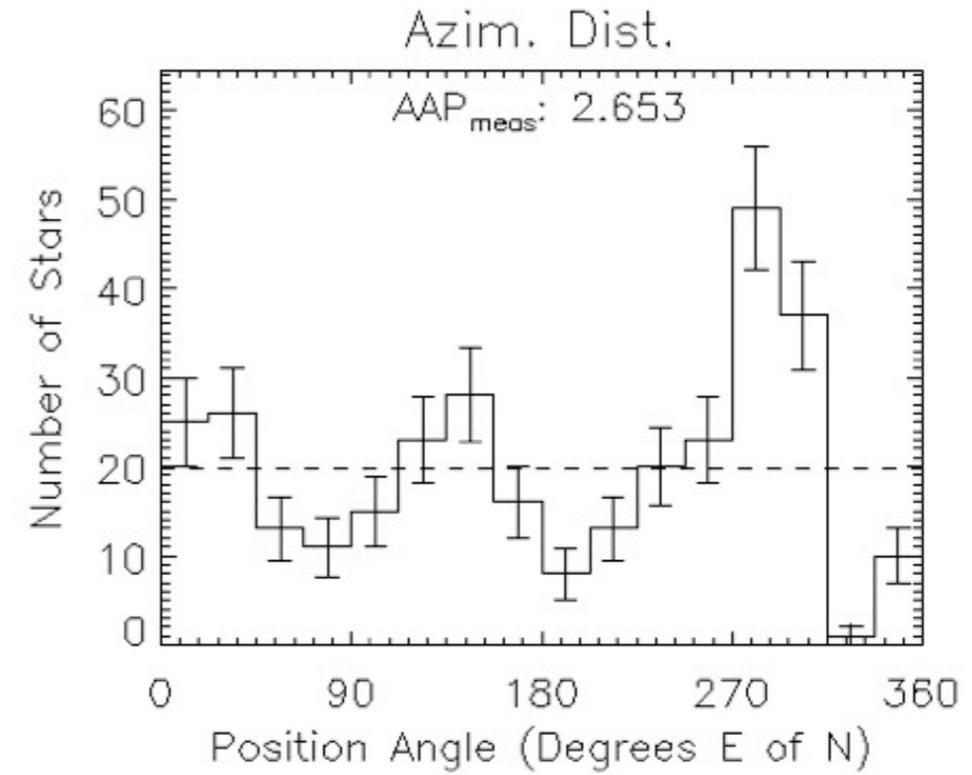
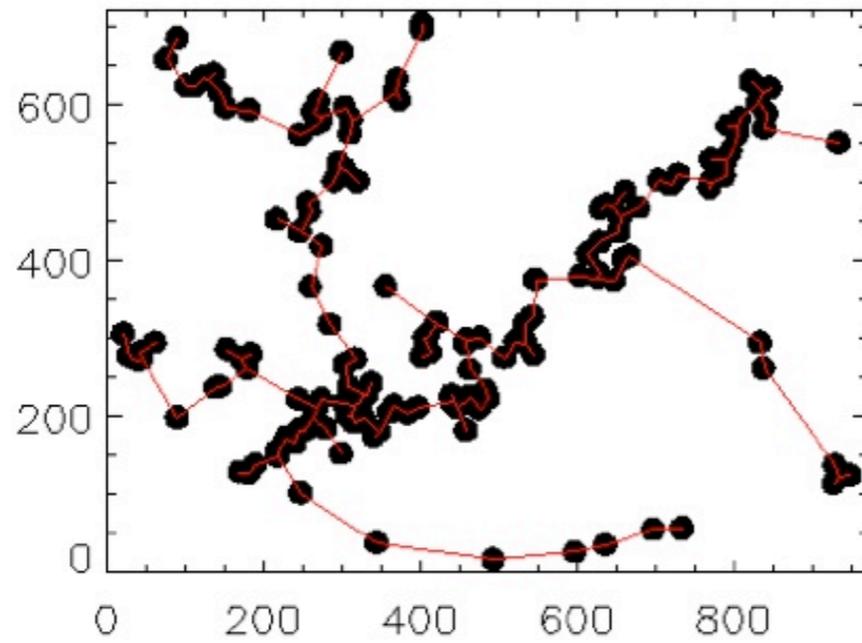
B68

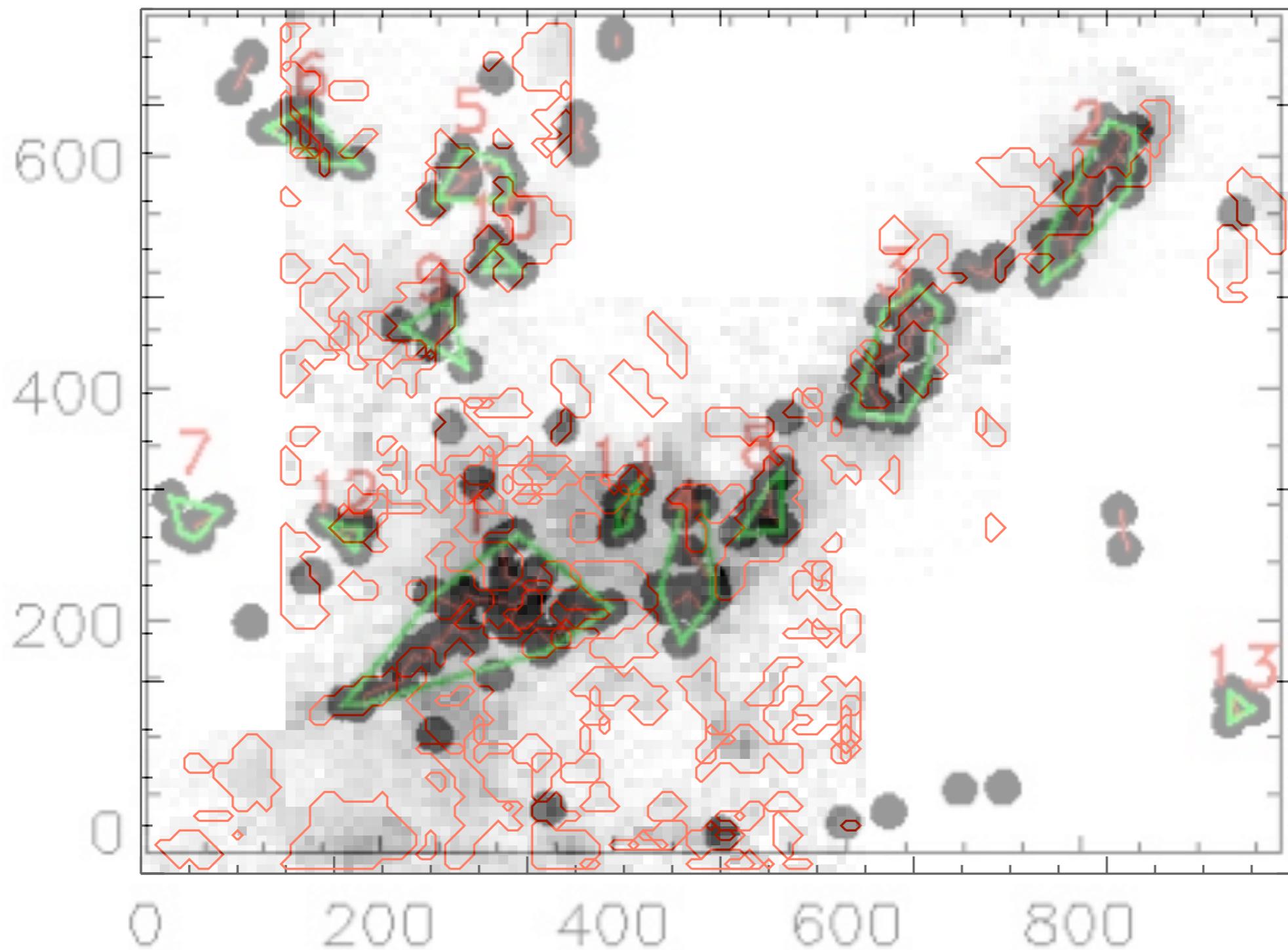


# Seeded Dendrogram on Pre-Wavelet Data (Erik)



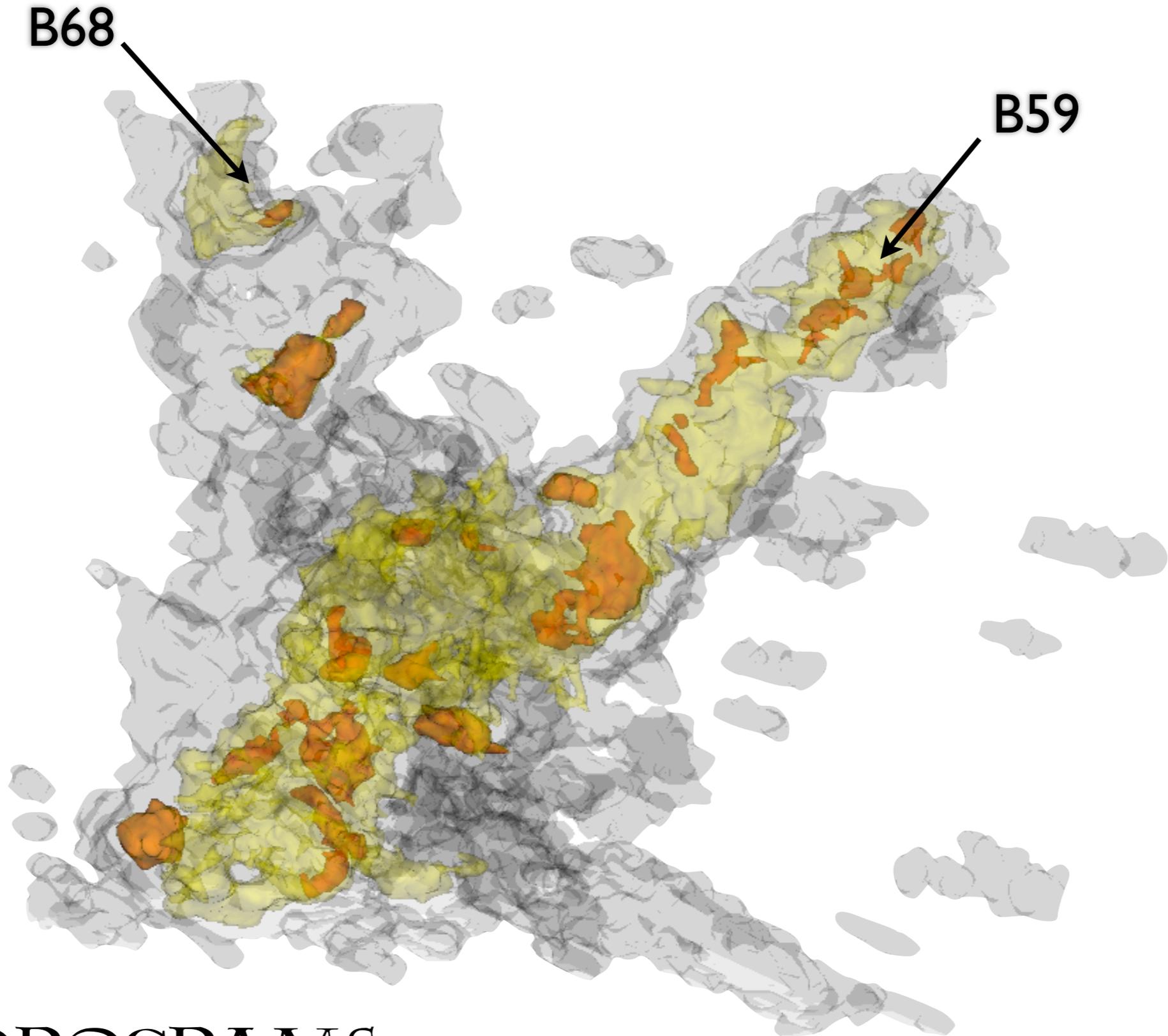
# Gutermuth et al. "Minimum Spanning Tree"





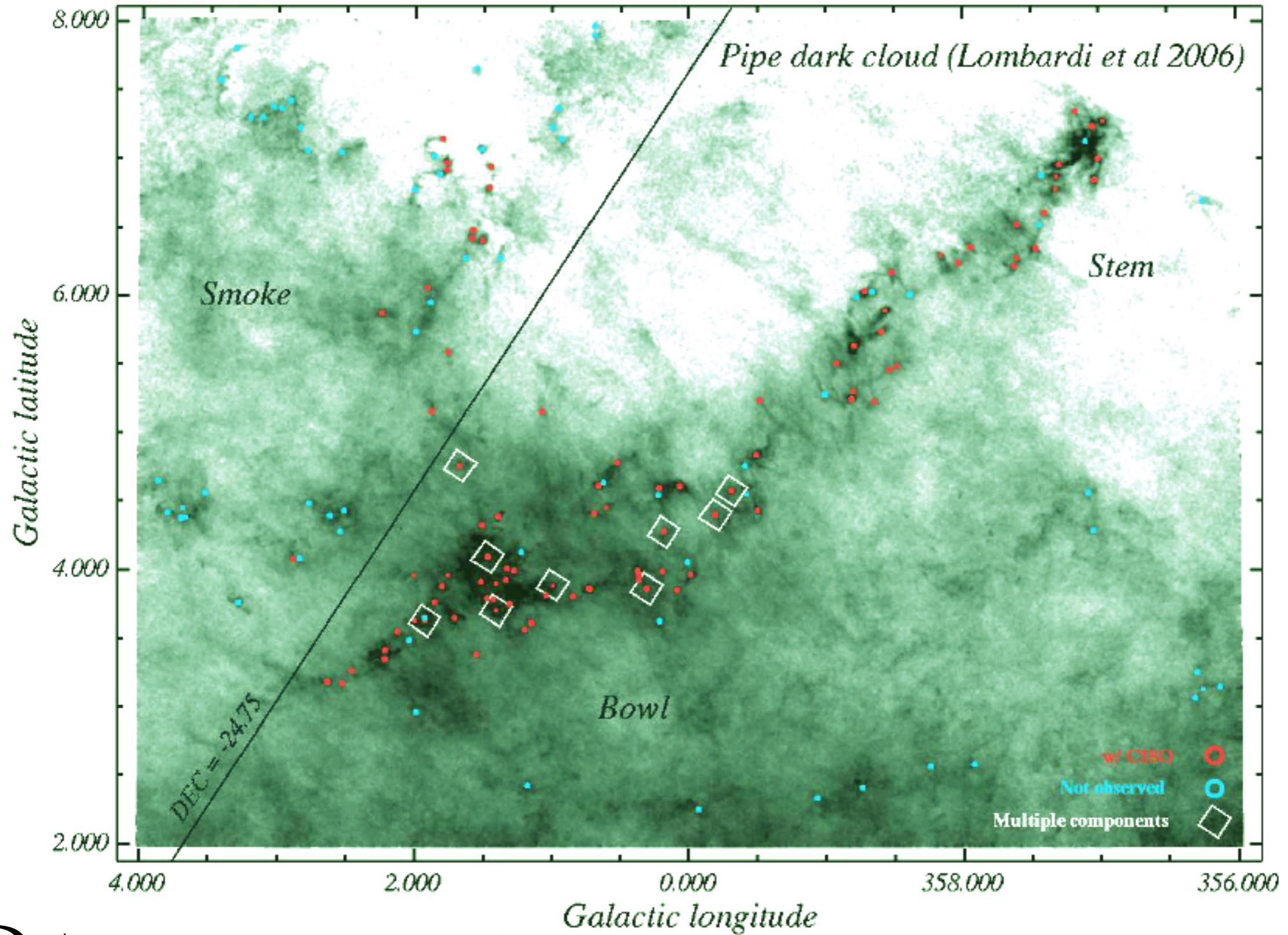
# 3D (Onishi) data

# I2CO



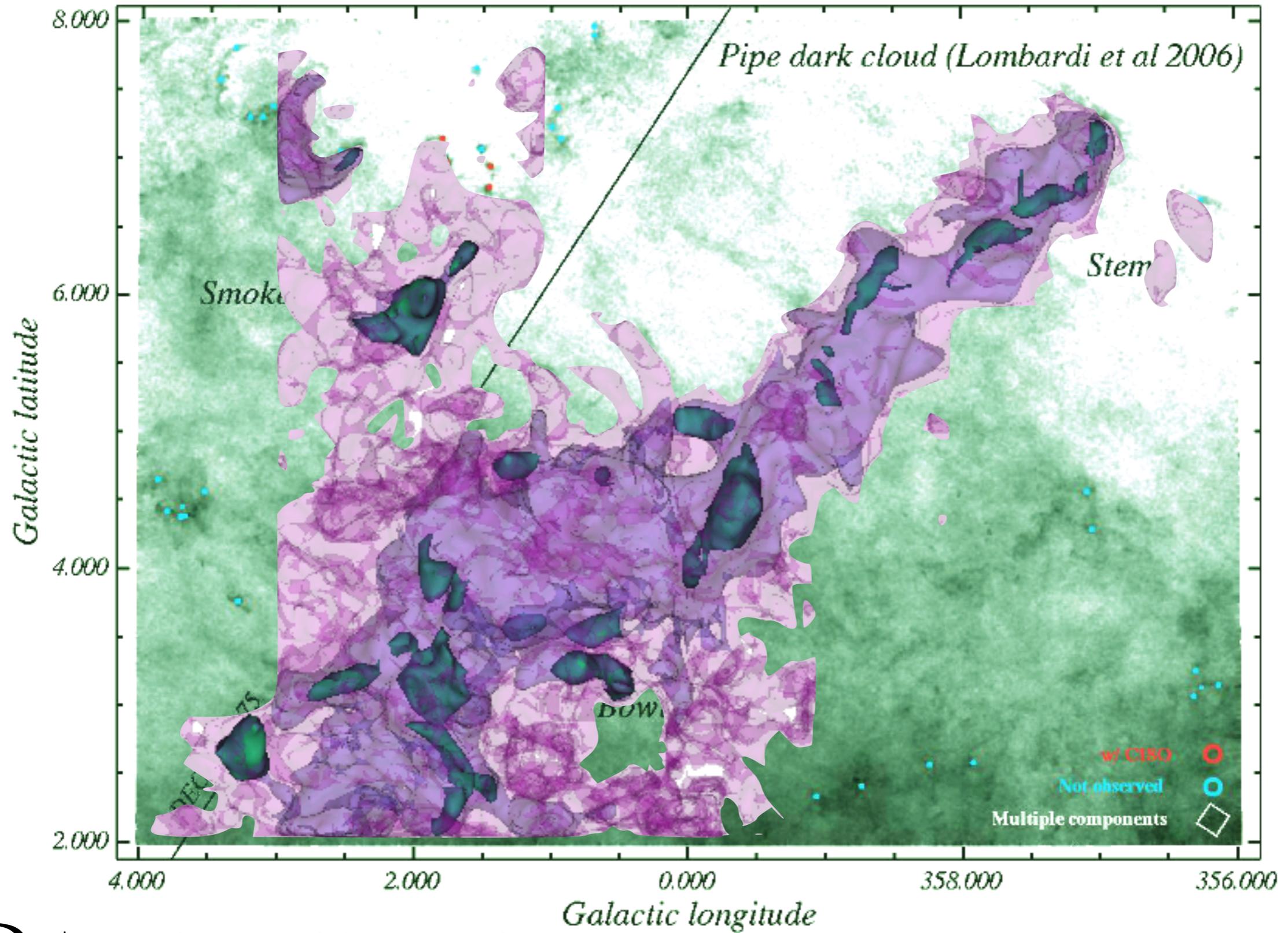
## DENDROGRAMS

# $^{12}\text{CO}$



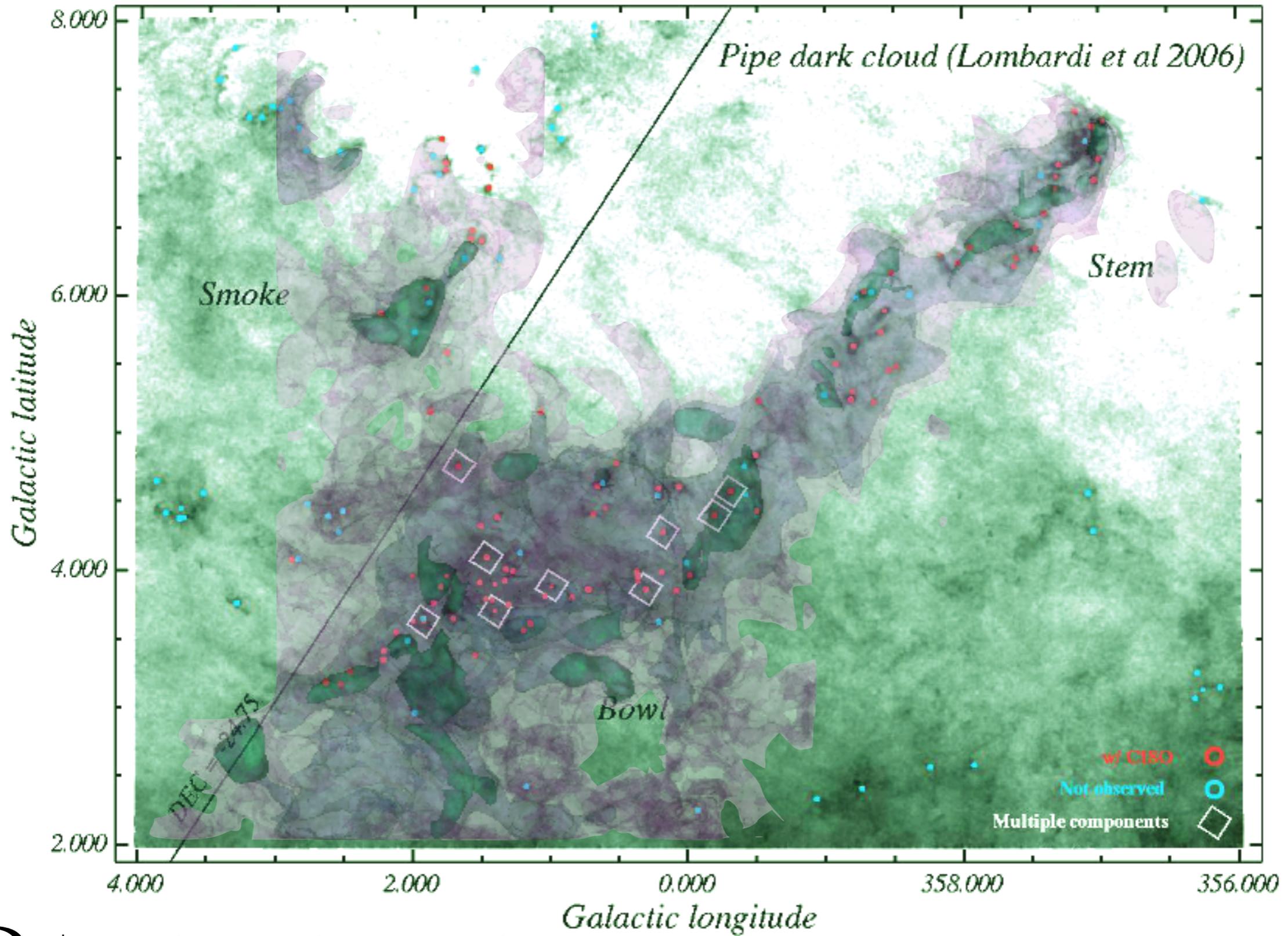
# DENDROGRAMS

# $\text{I}^{2}\text{CO}$



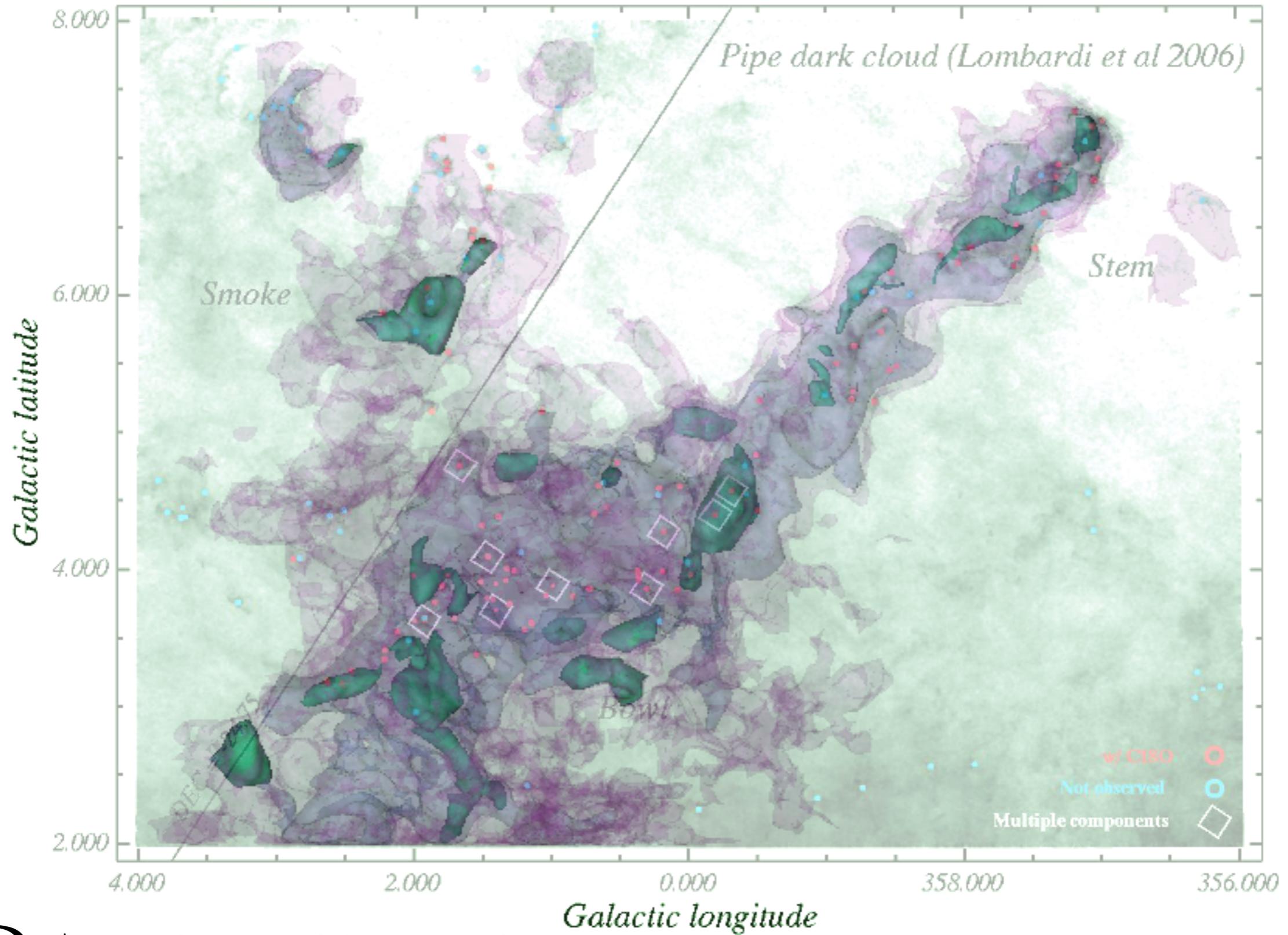
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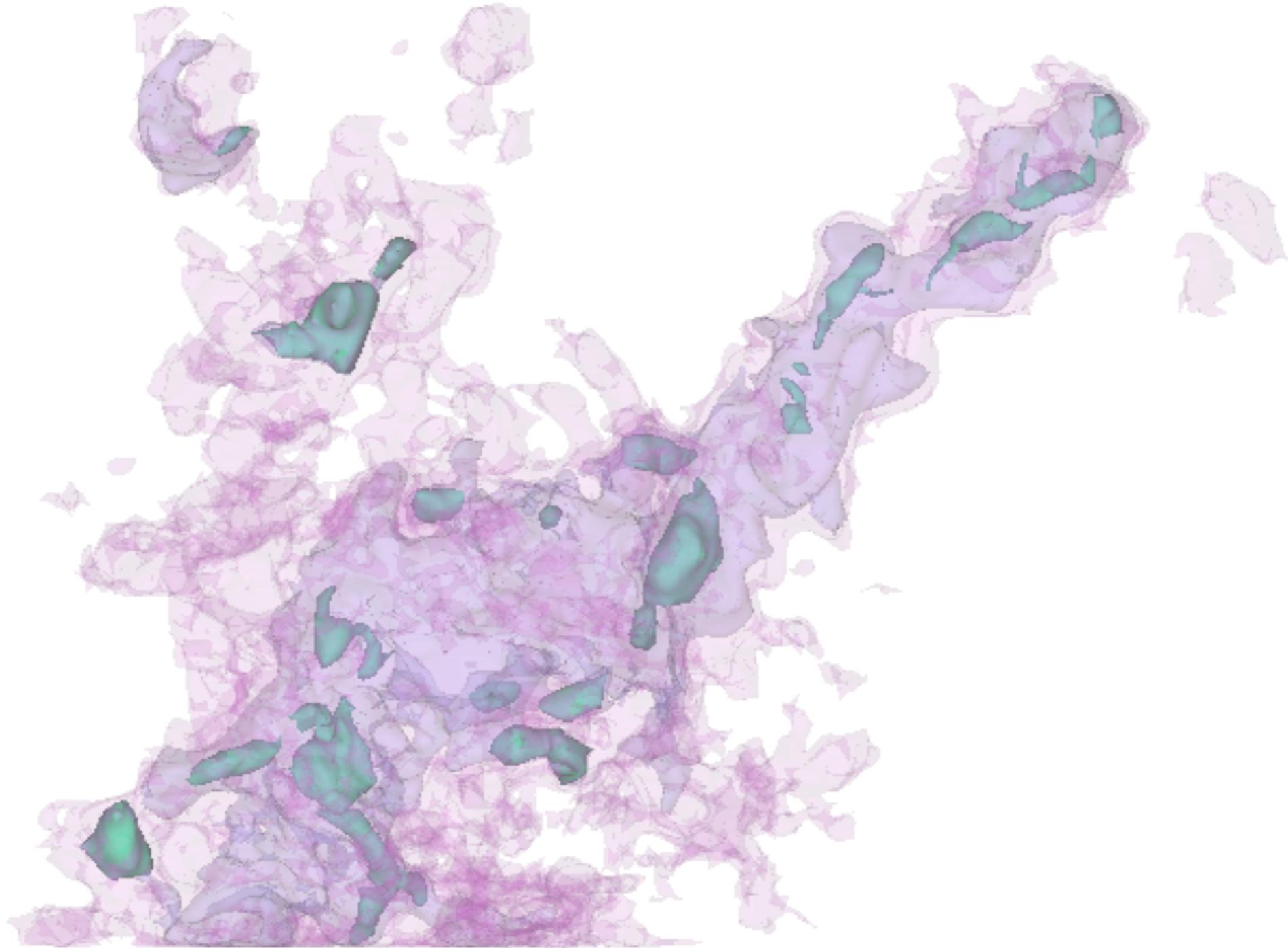
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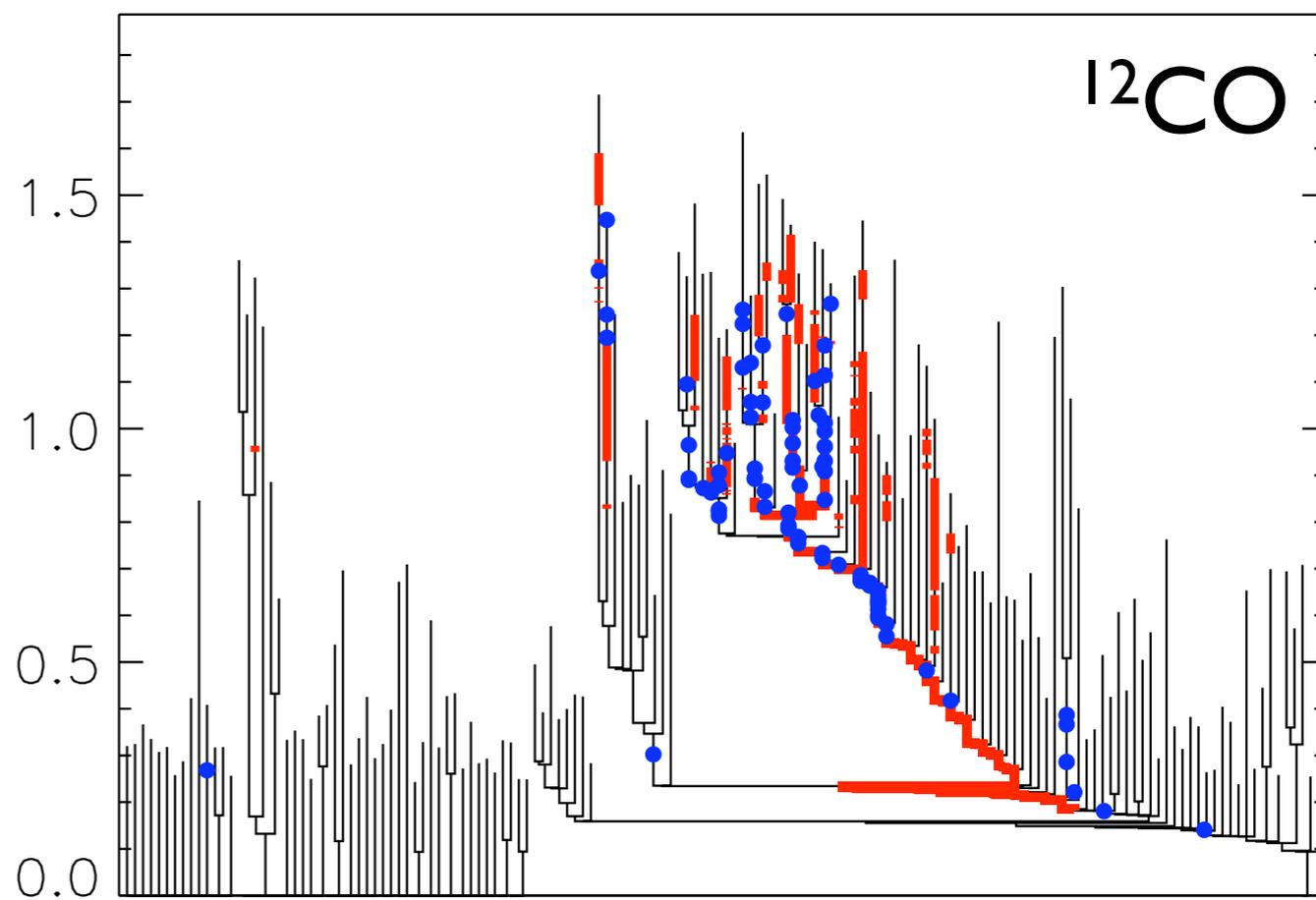
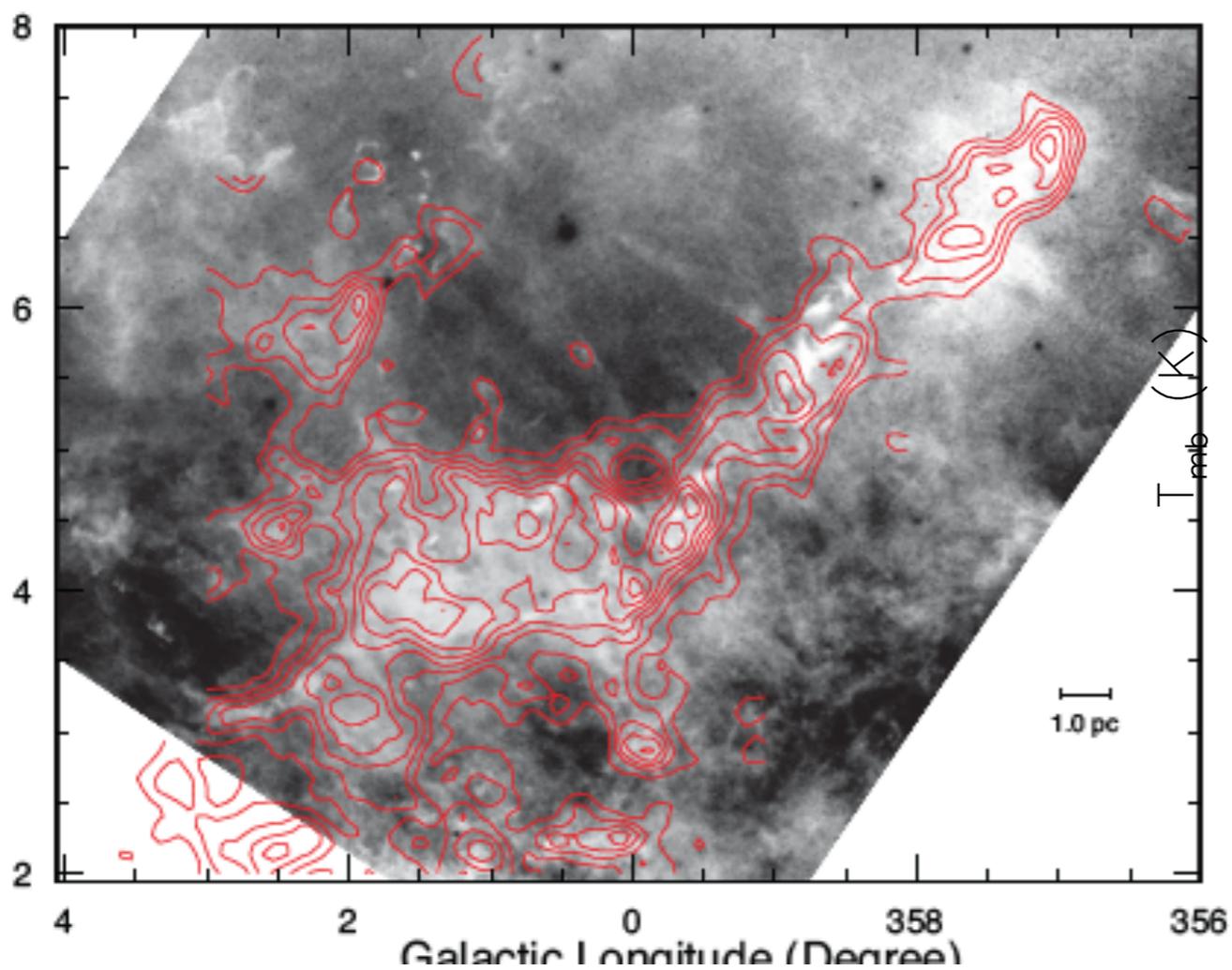
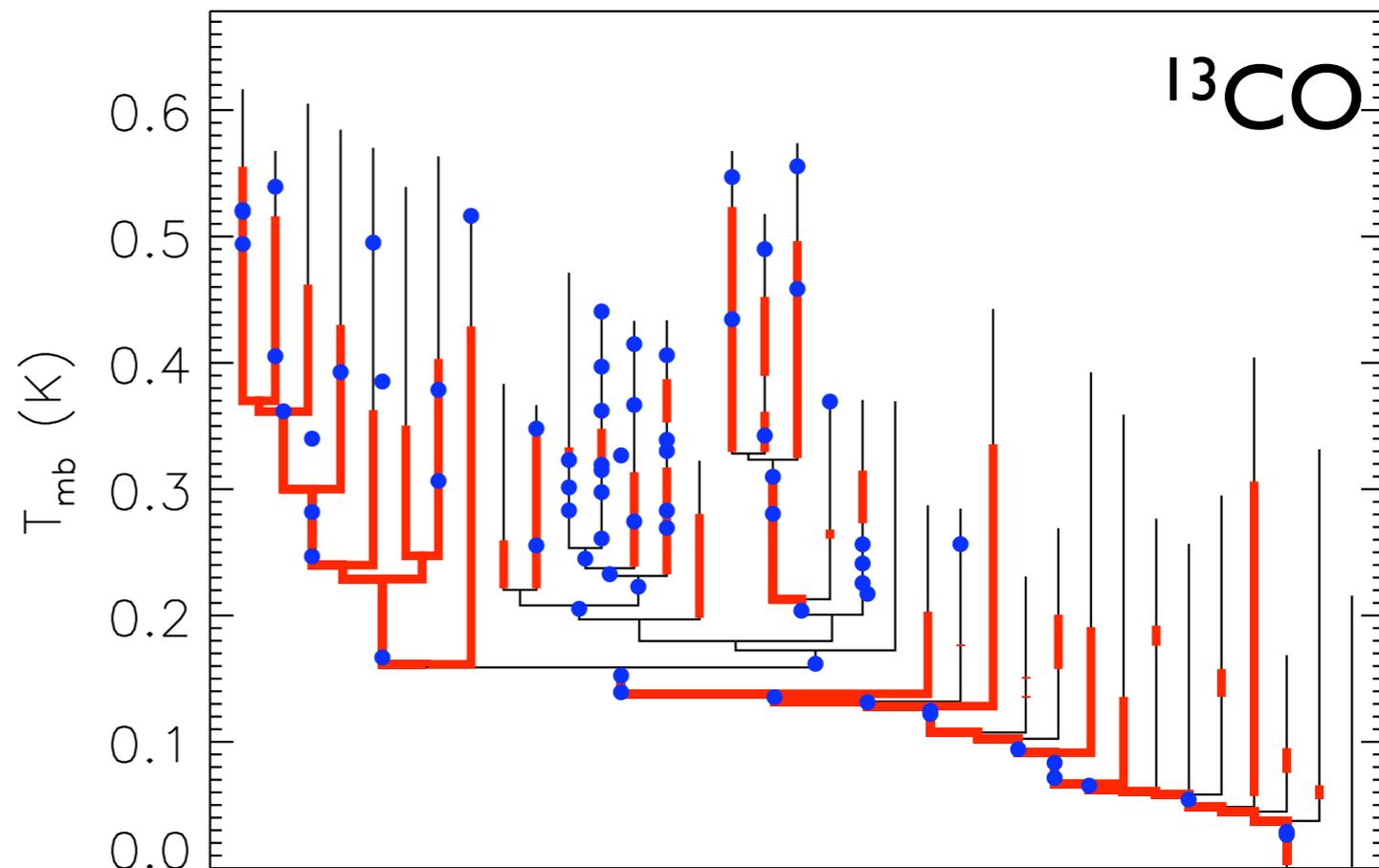
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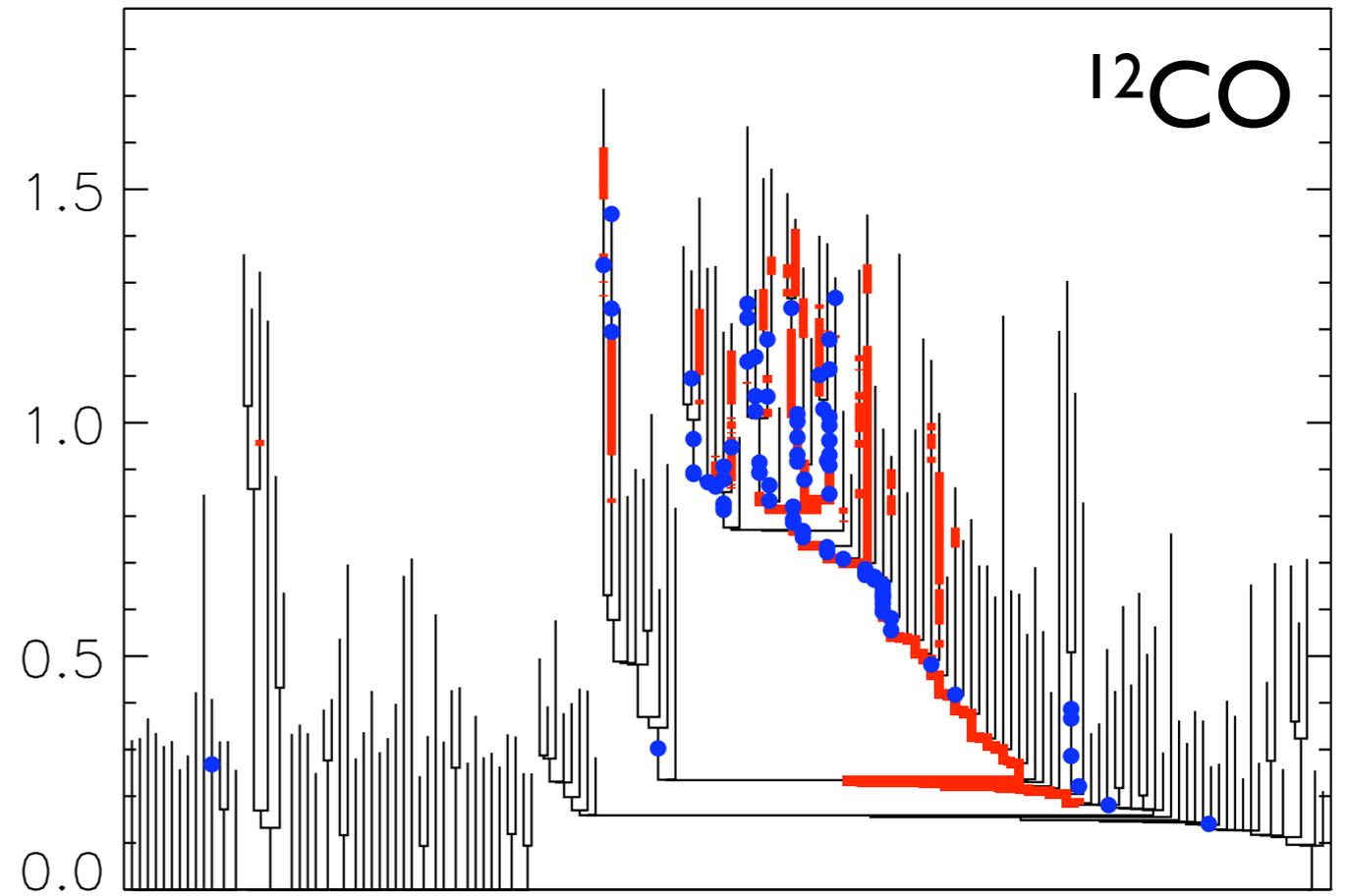
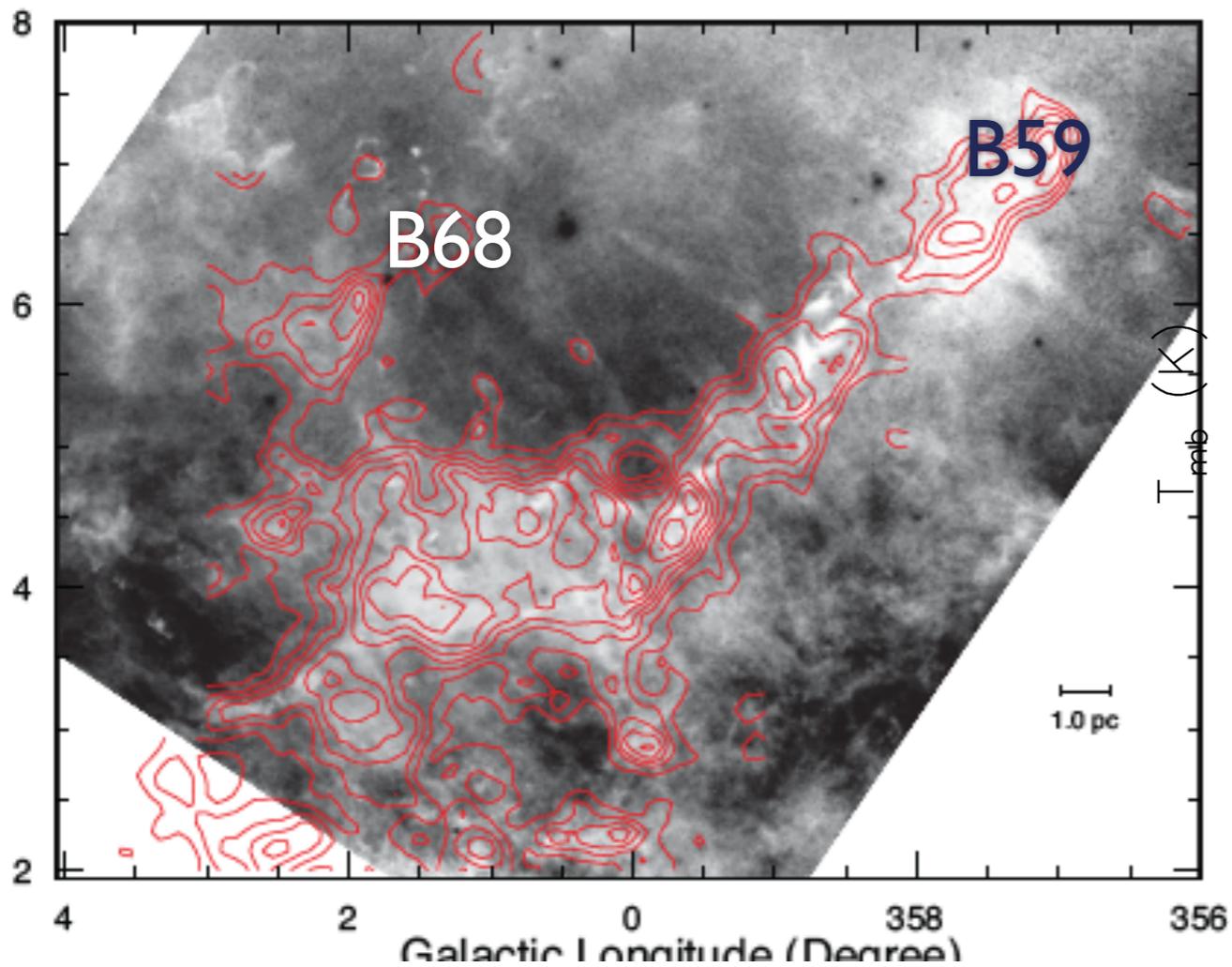
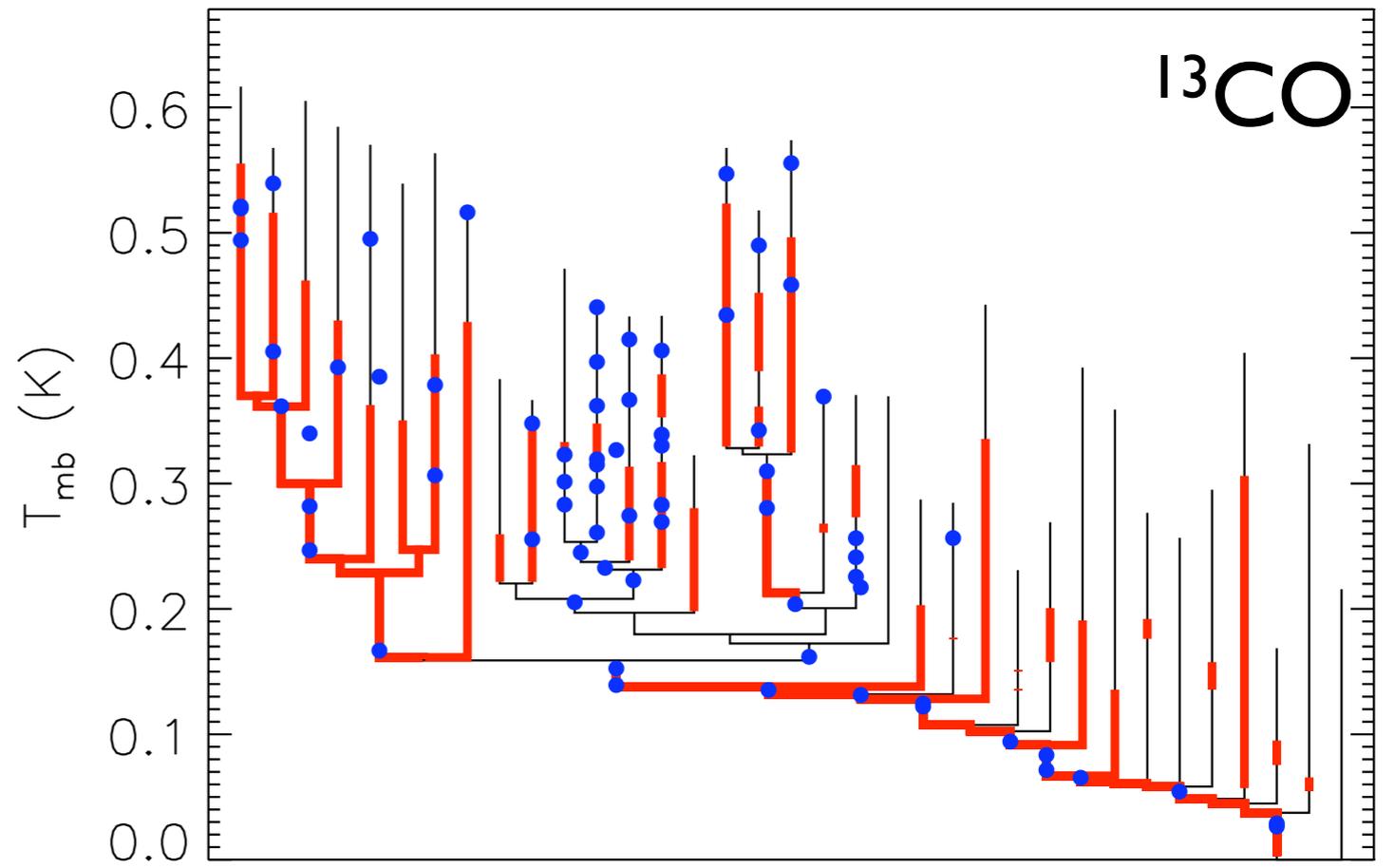
# DENDROGRAMS Kinematic Analysis (Erik)

- “self-gravitating”
- “cores” observed in  $C^{18}O$   
(Muench)



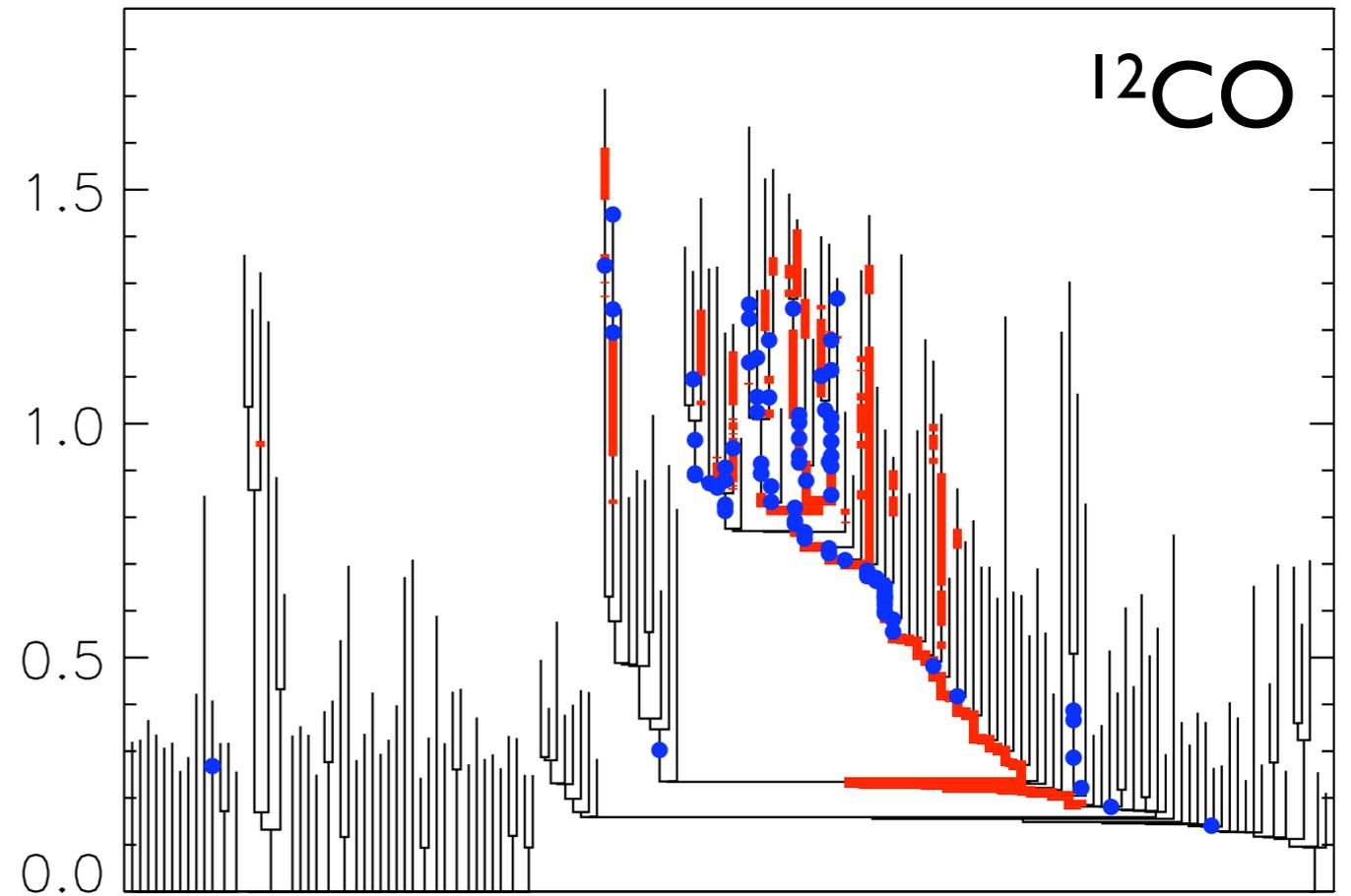
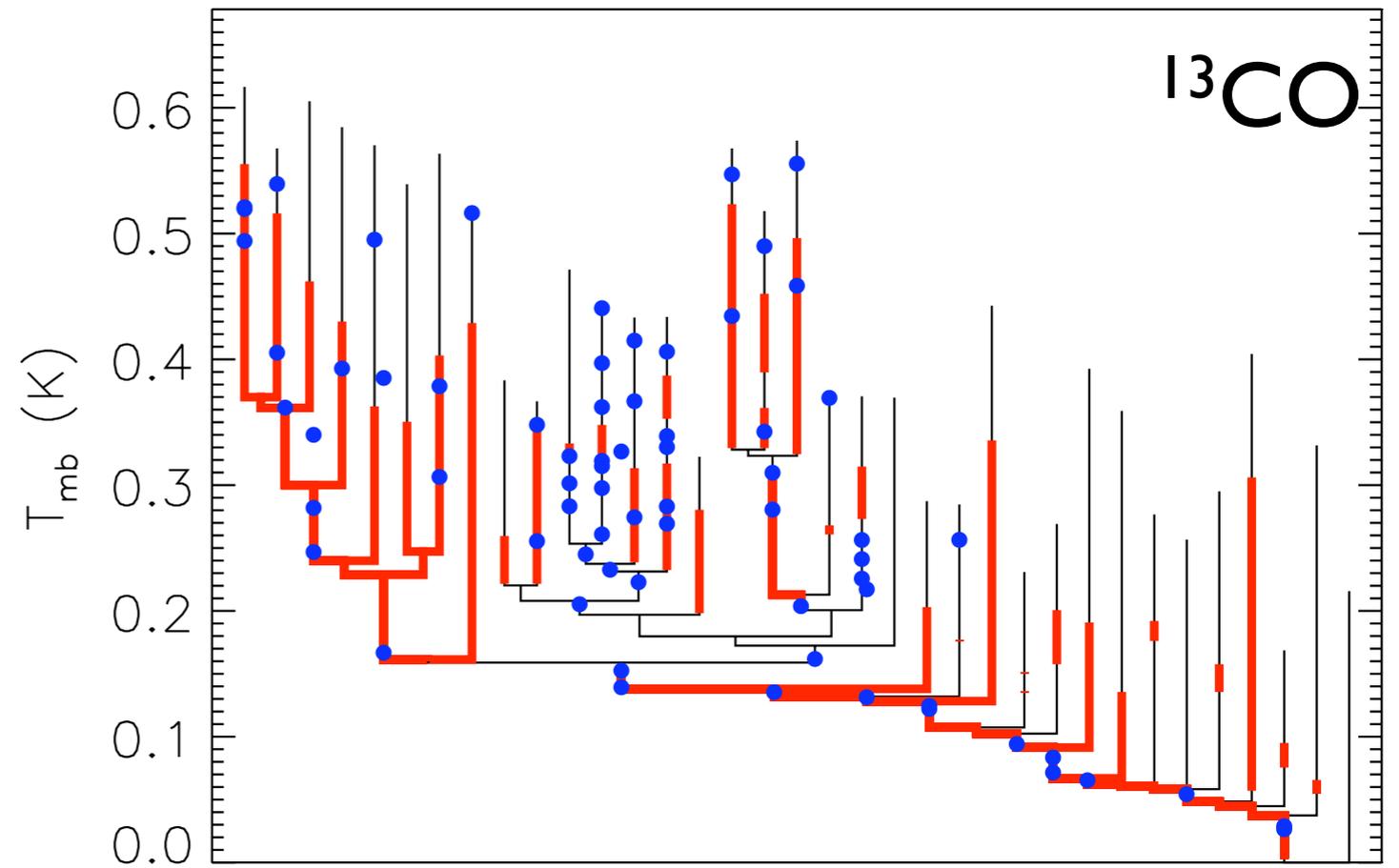
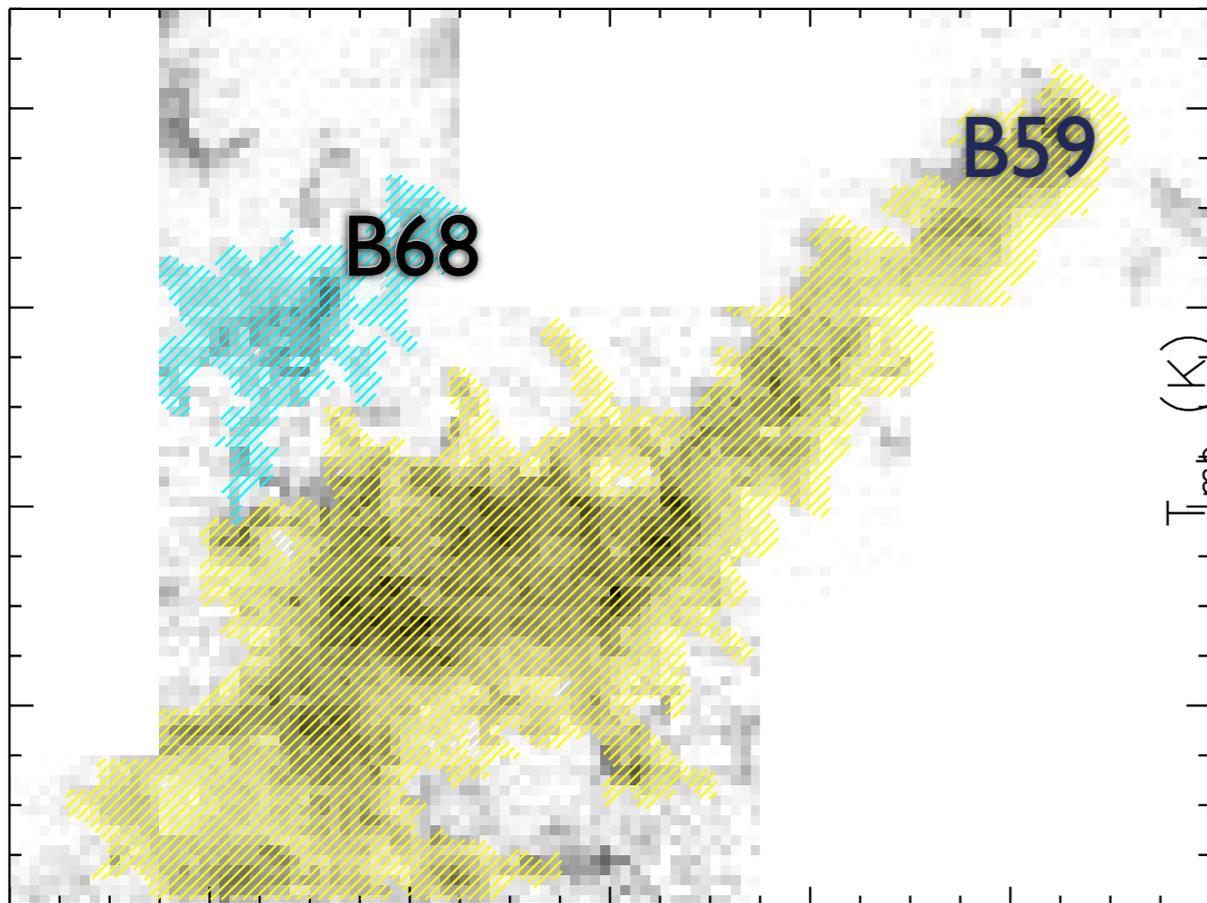
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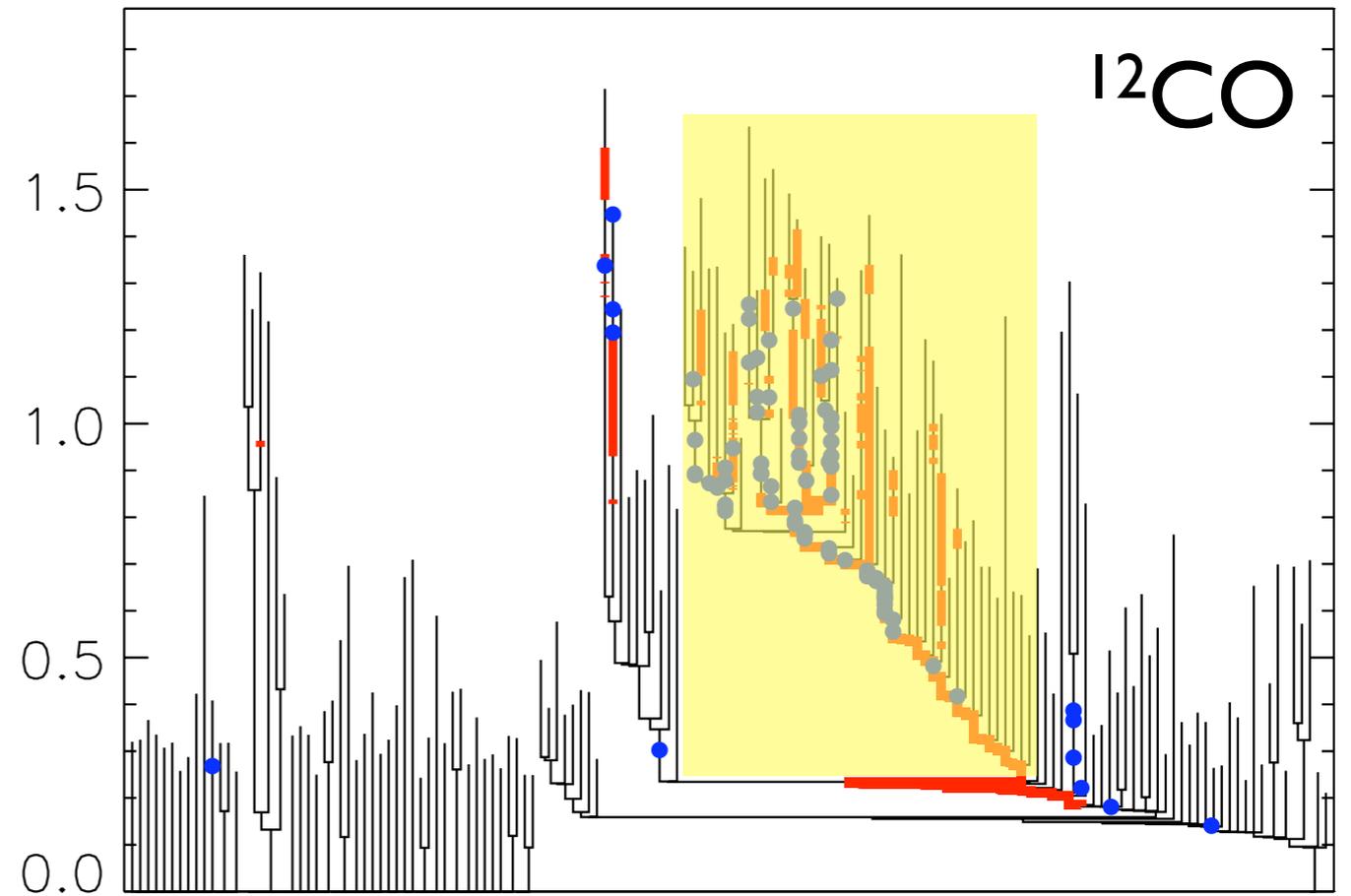
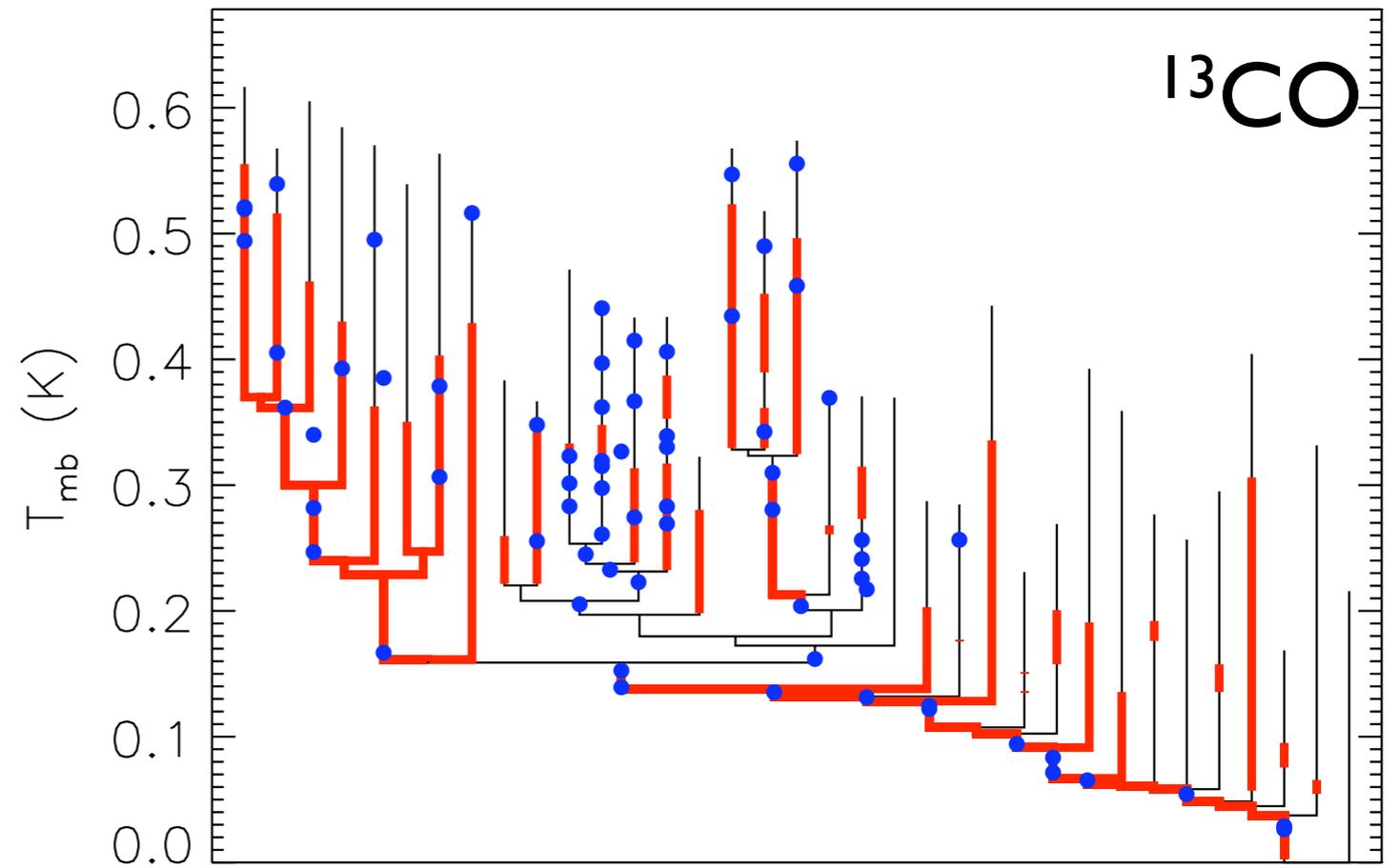
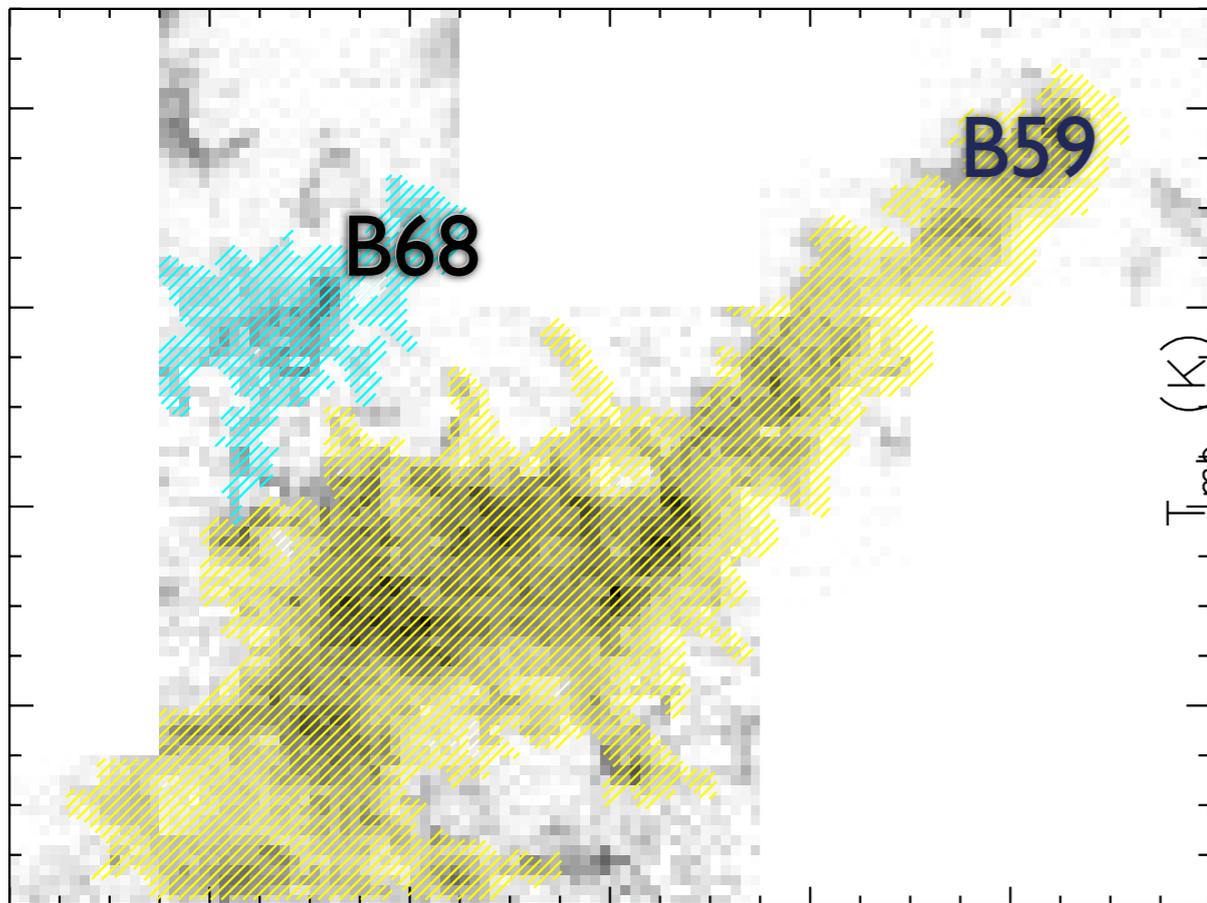
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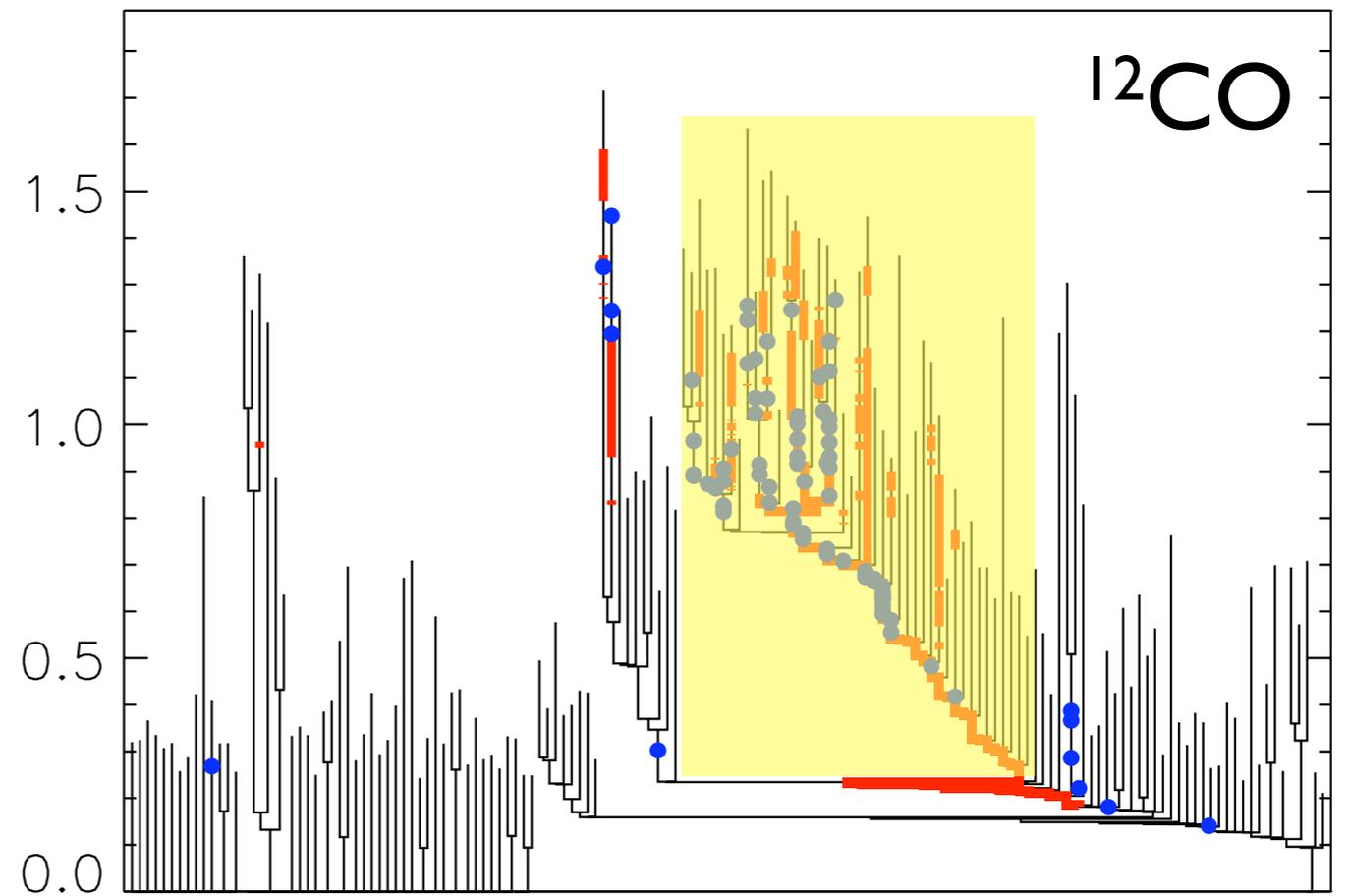
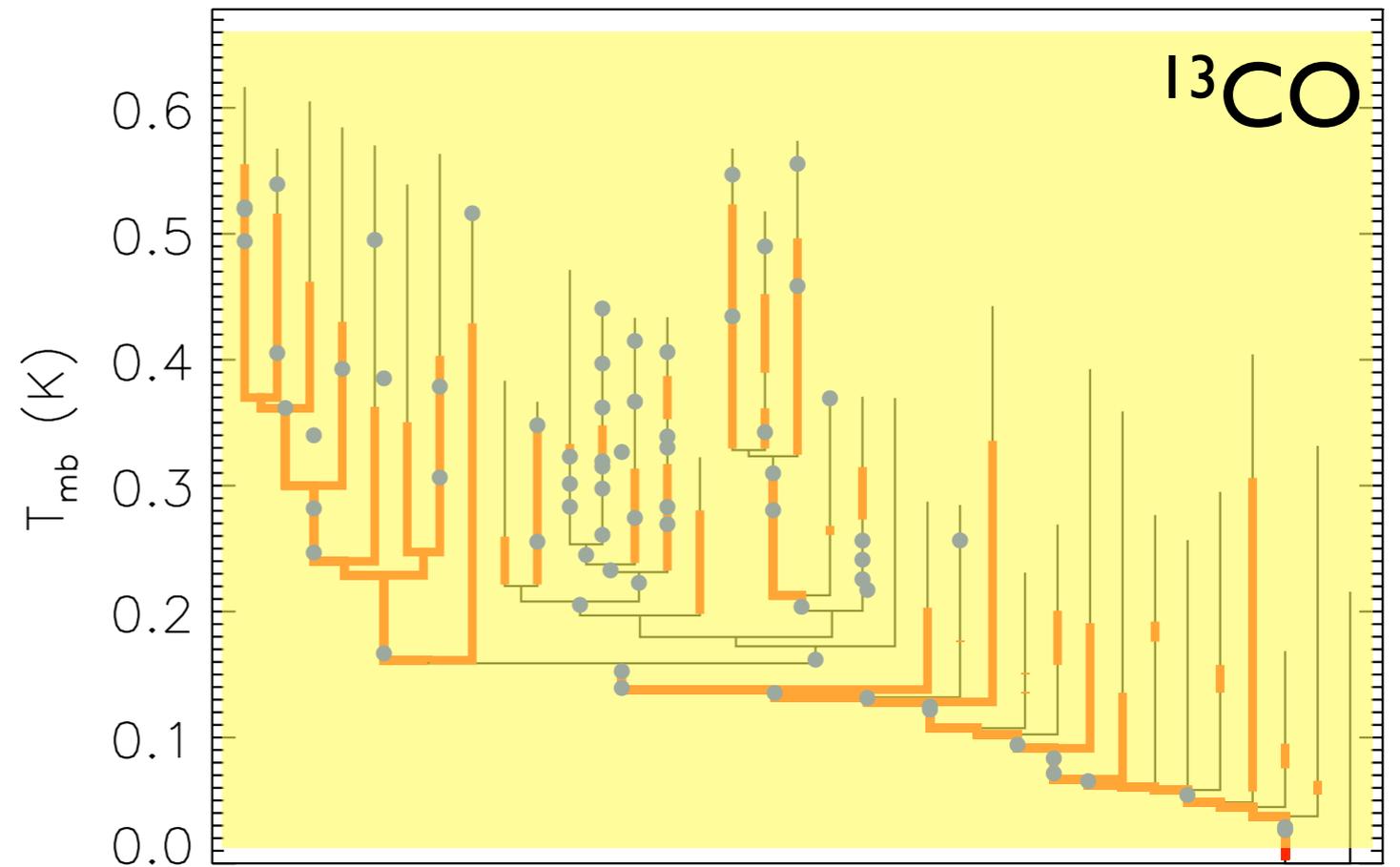
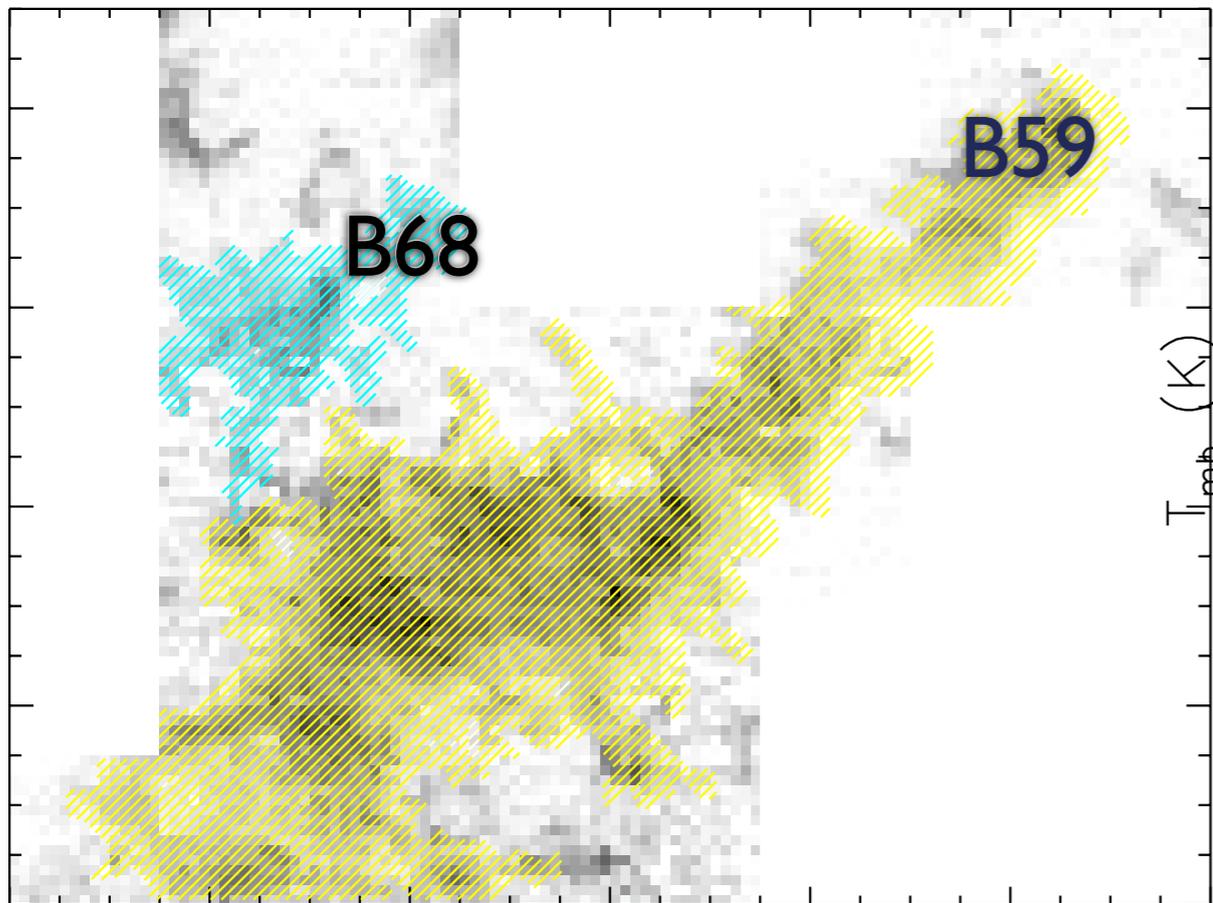
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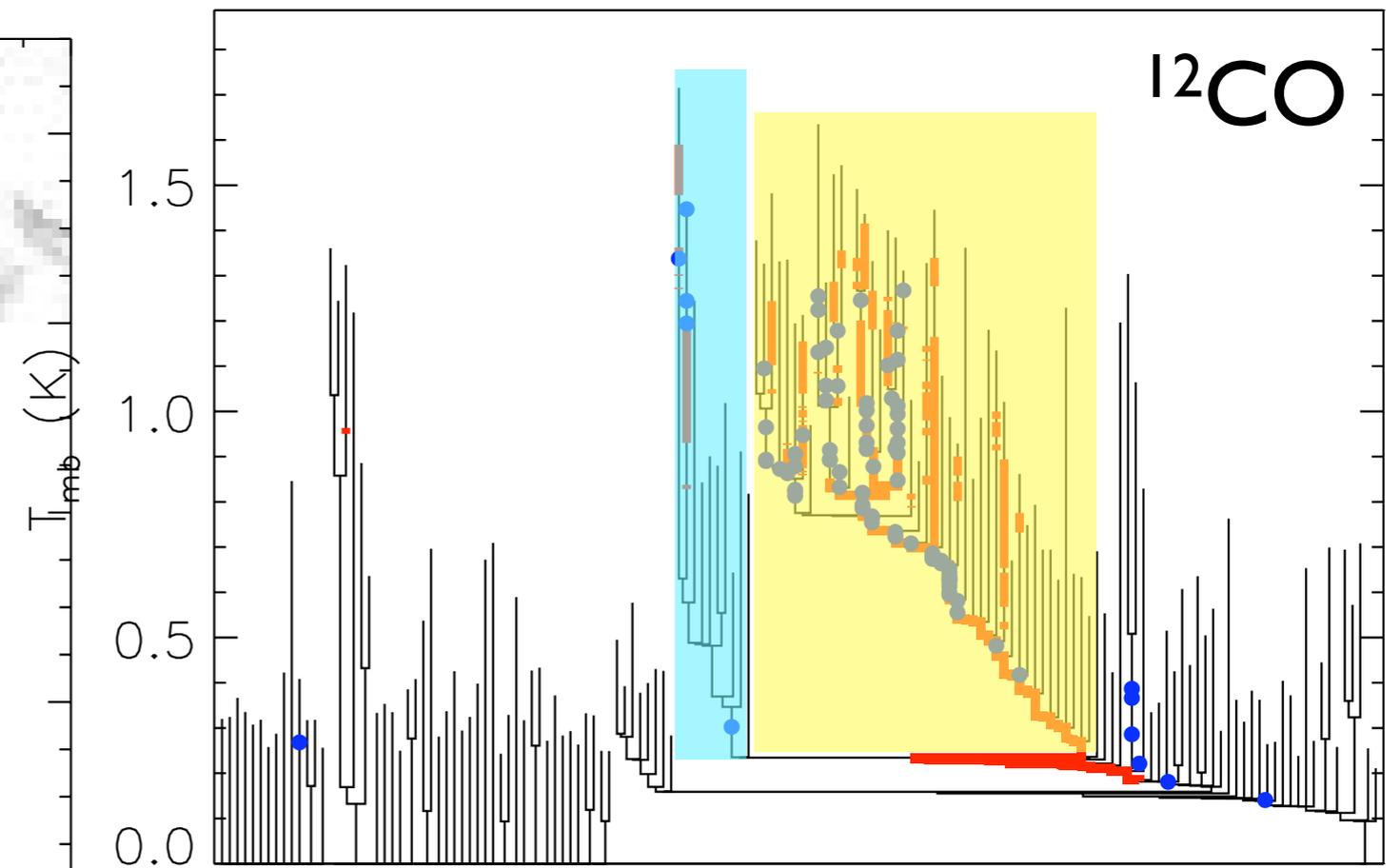
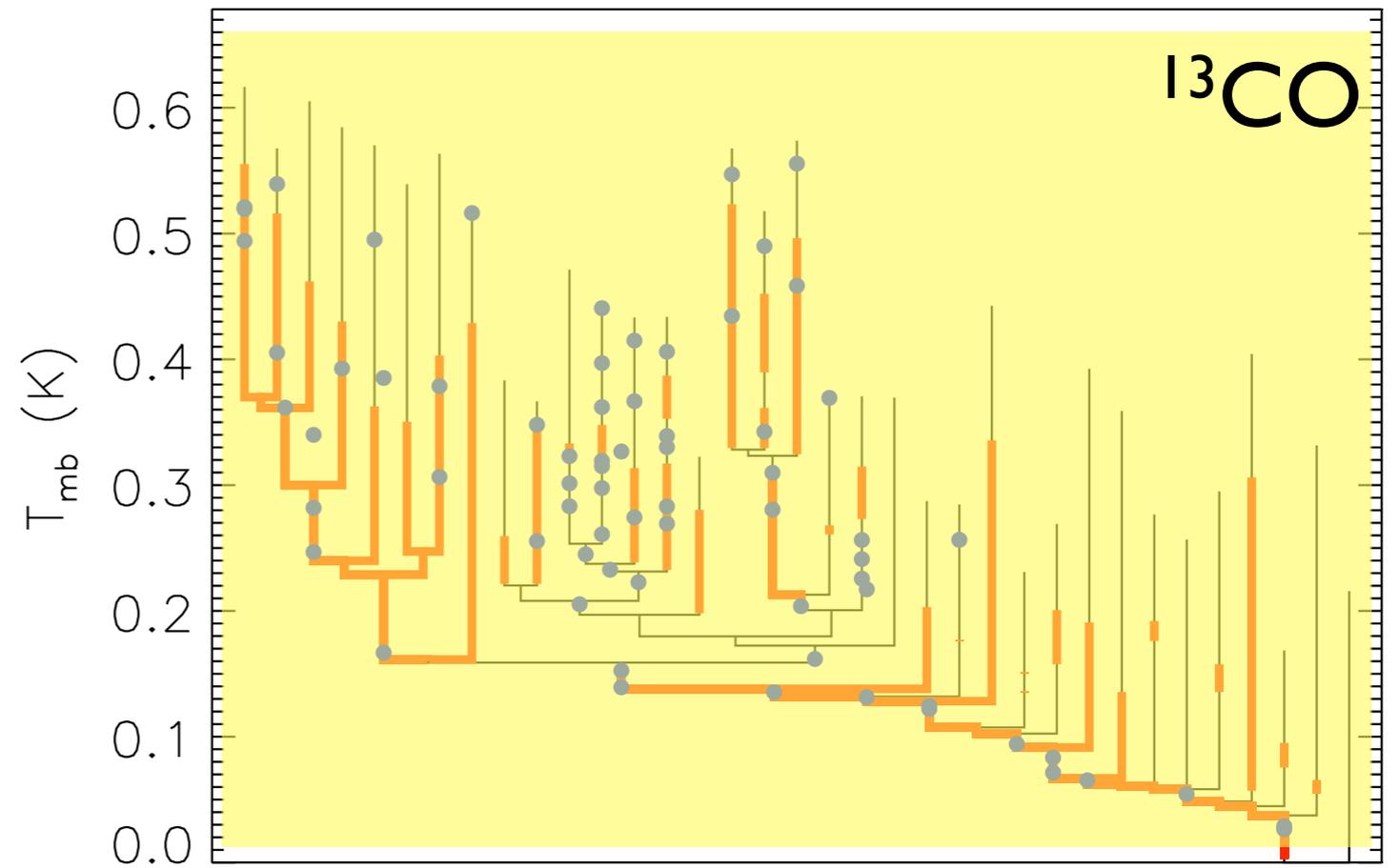
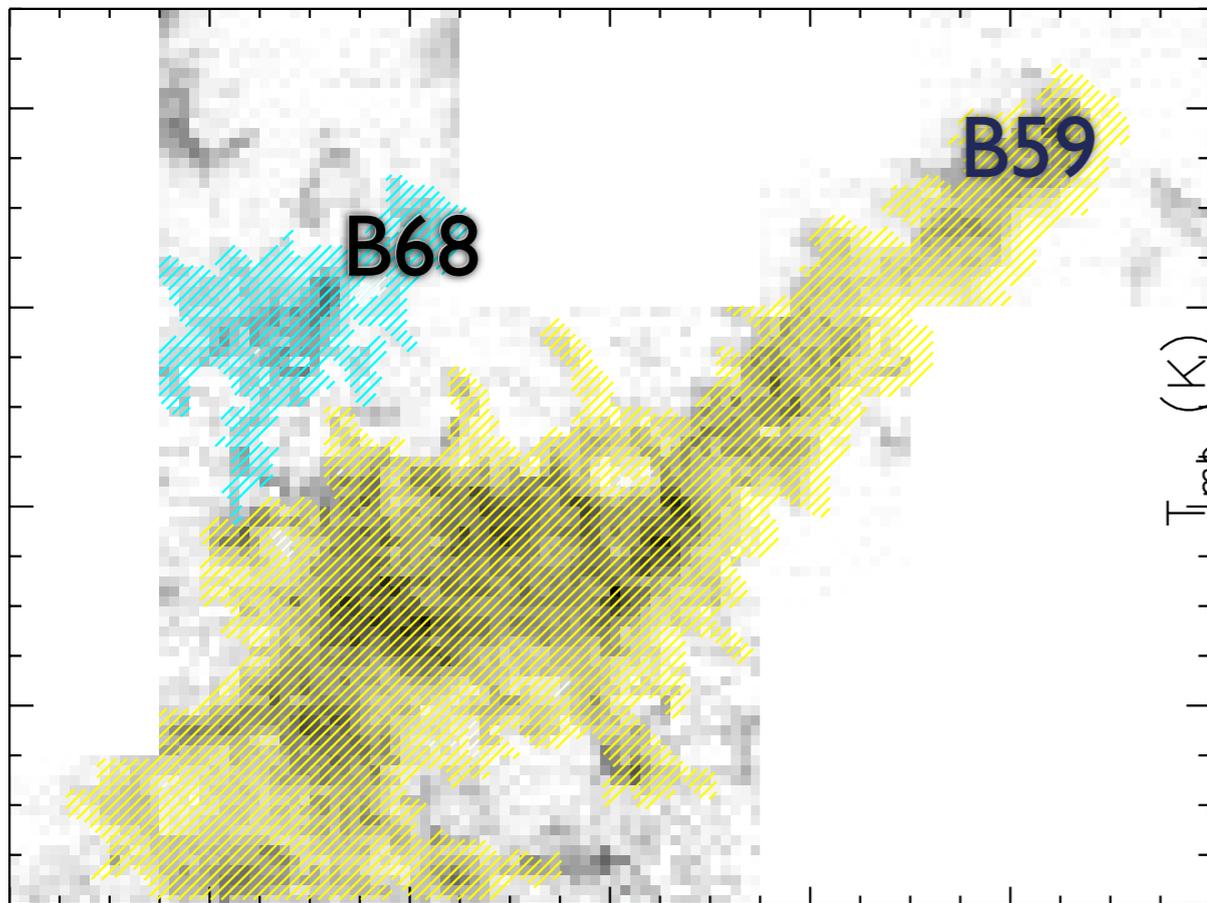
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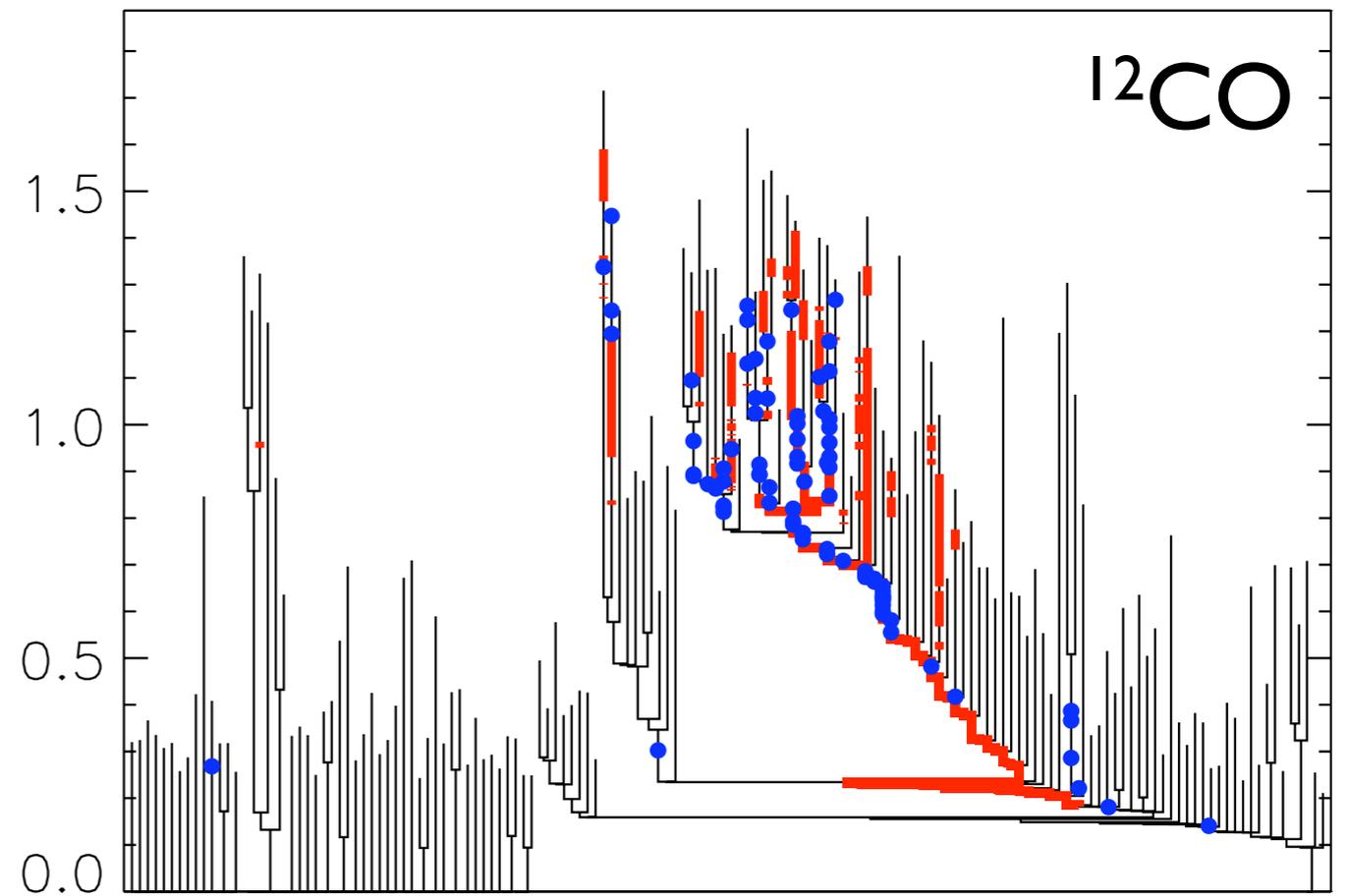
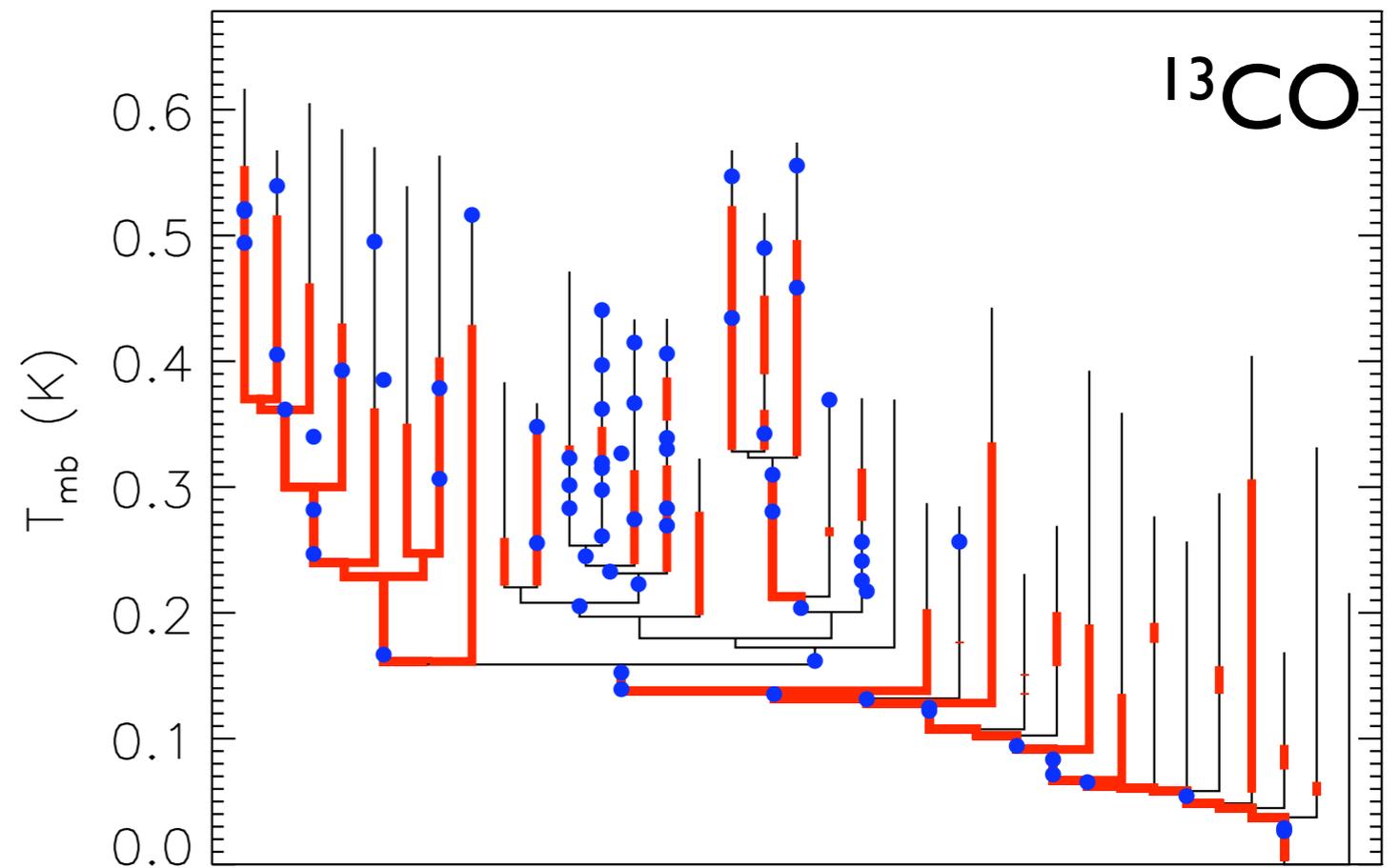
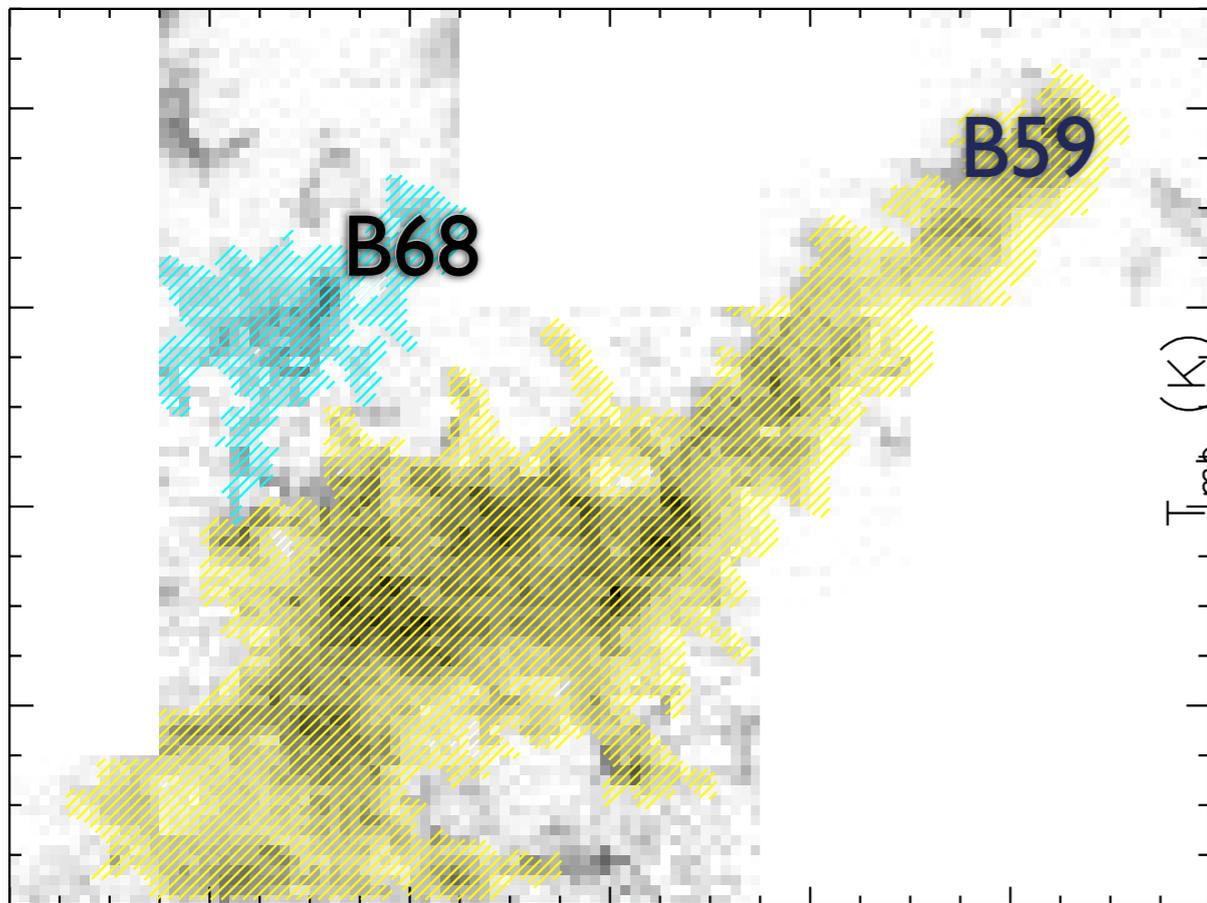
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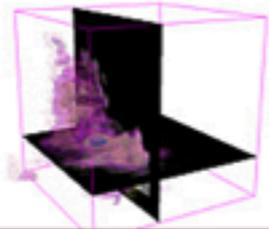


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(Muench)



# Which is which?



The Astronomical Medicine Project



Initiative in Innovative Computing at Harvard

## Harvard IIC Home

### AM Project

overview  
what's new?  
press  
about us  
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### Research

background  
projects  
papers  
images  
movies

### Software

overview  
Slicer: getting started  
Slicer 3  
fits2itk  
OsiriX  
DendroStar

### Links

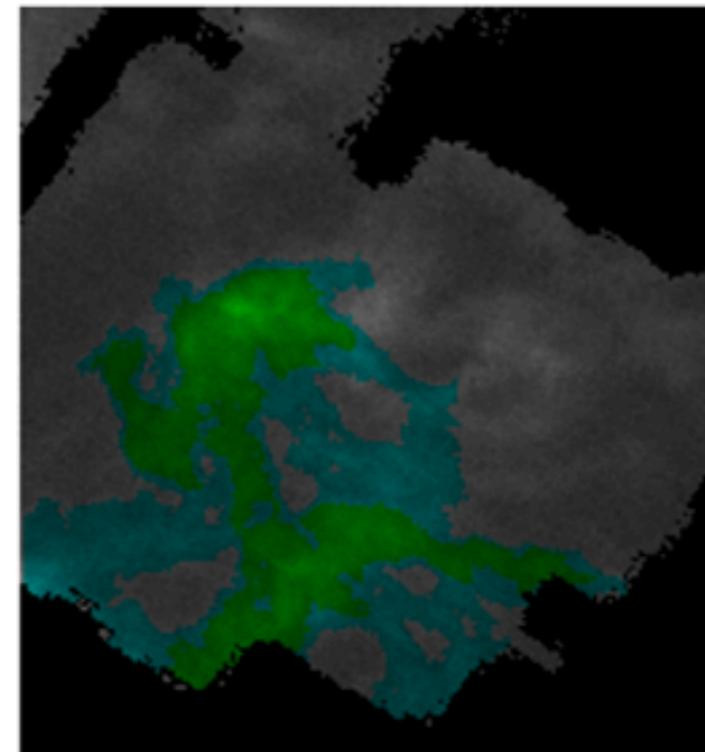
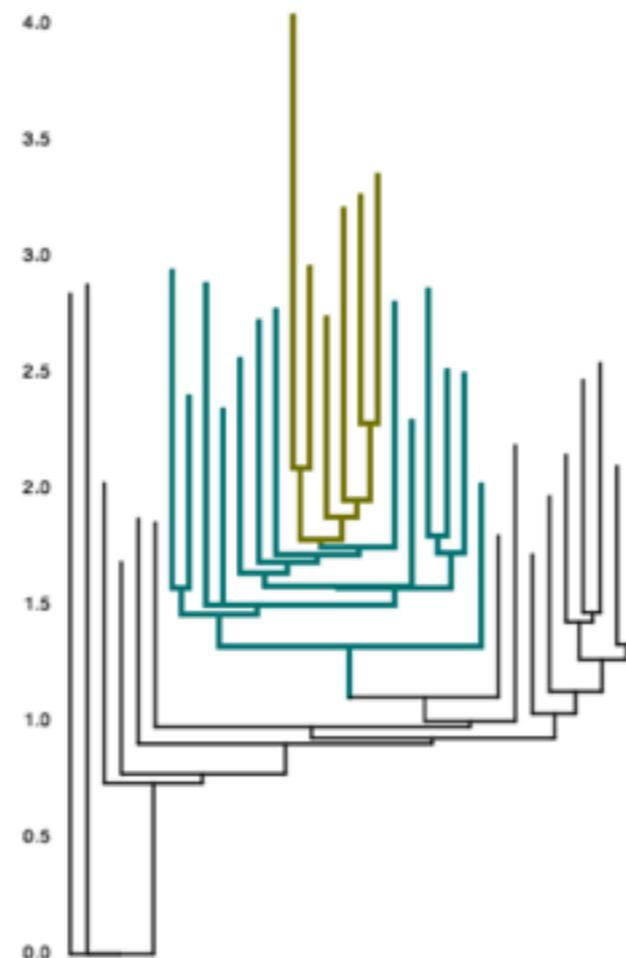
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## The DendroStar Applet for L1448: Try me!

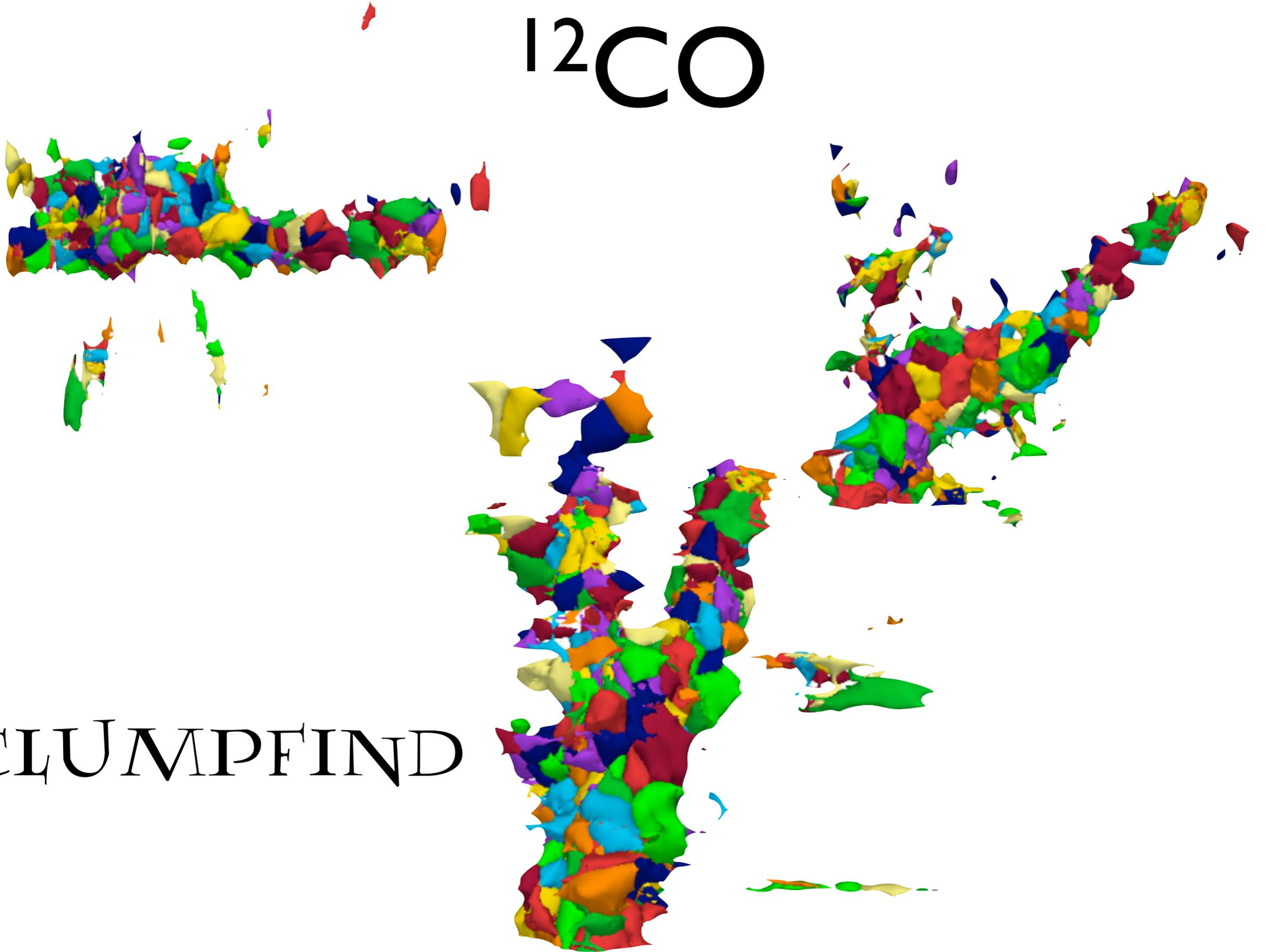


Tint:

Suppress tint:

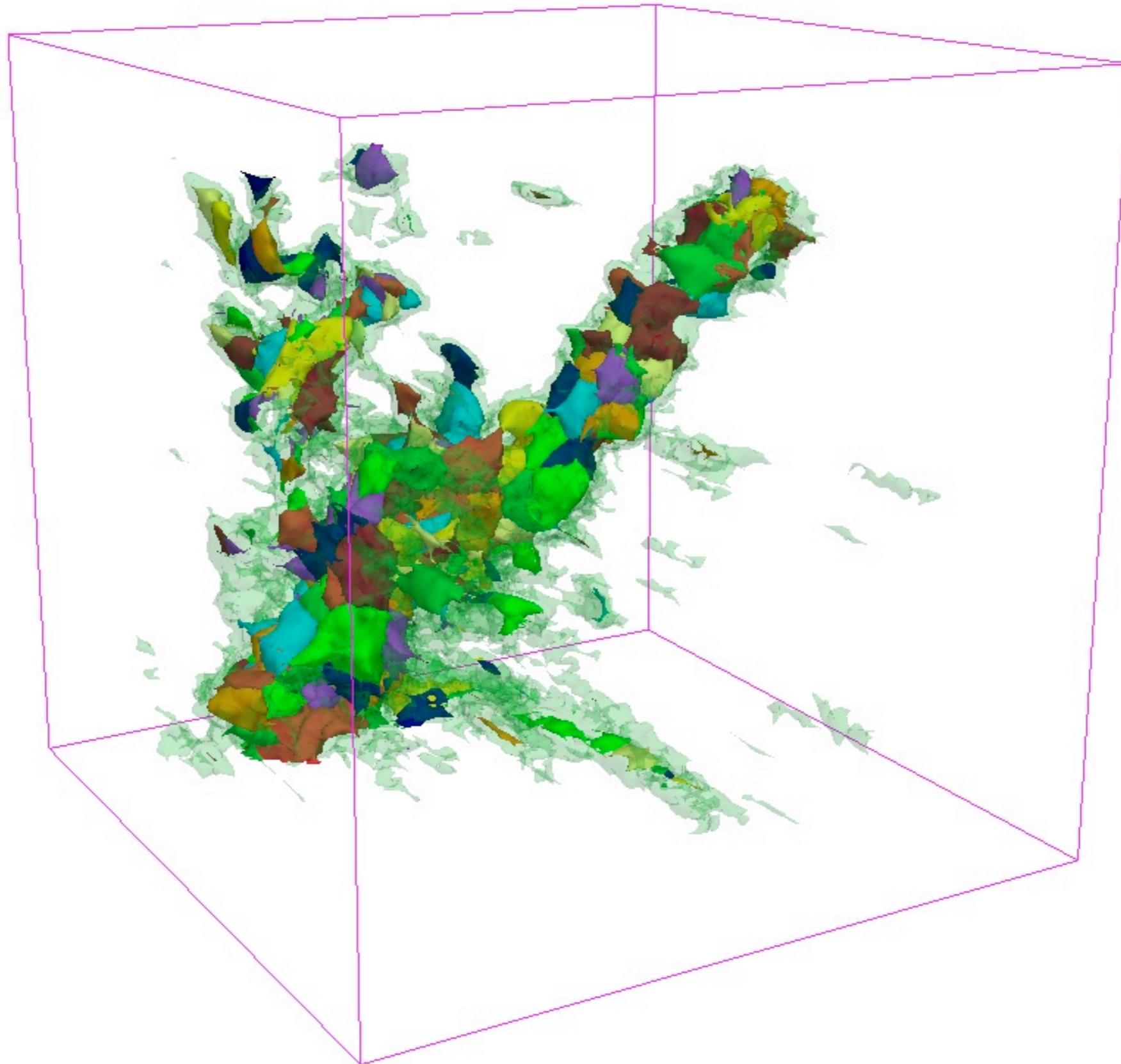
Reset:

$^{12}\text{CO}$

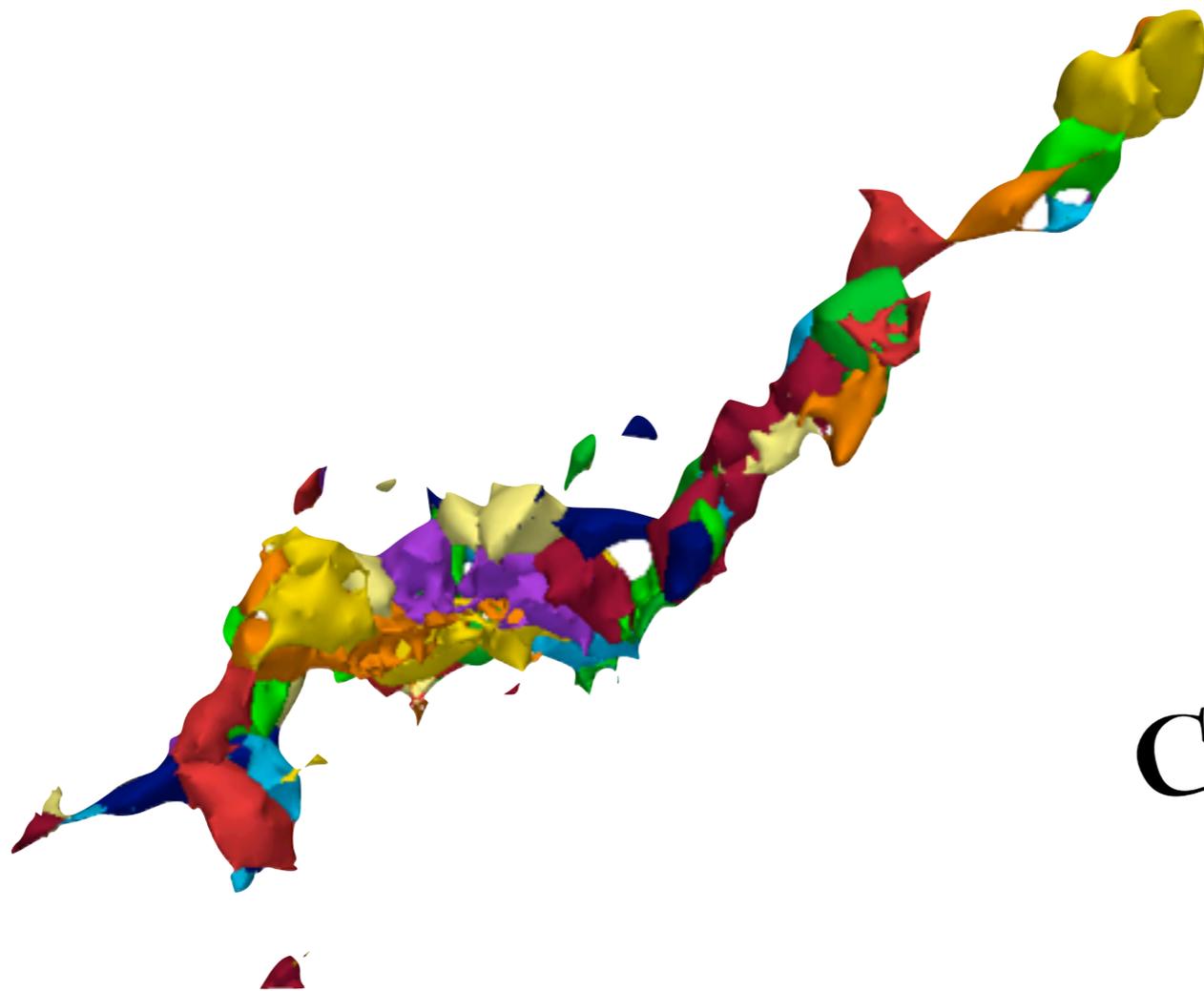
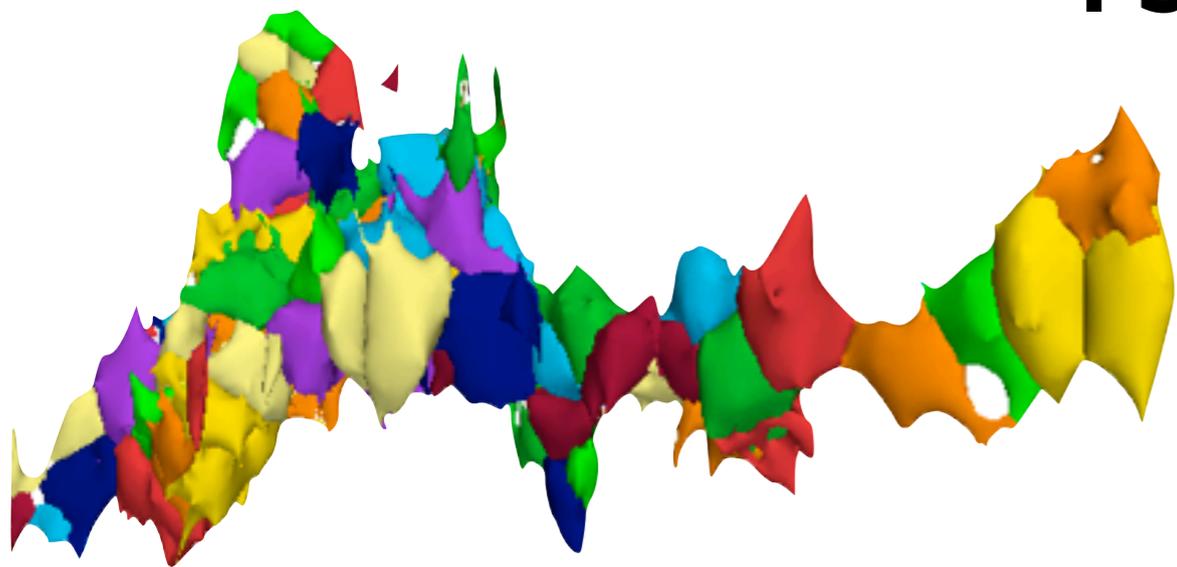


CLUMPFIND

# Clumpfind+Dendro $^{12}\text{CO}$

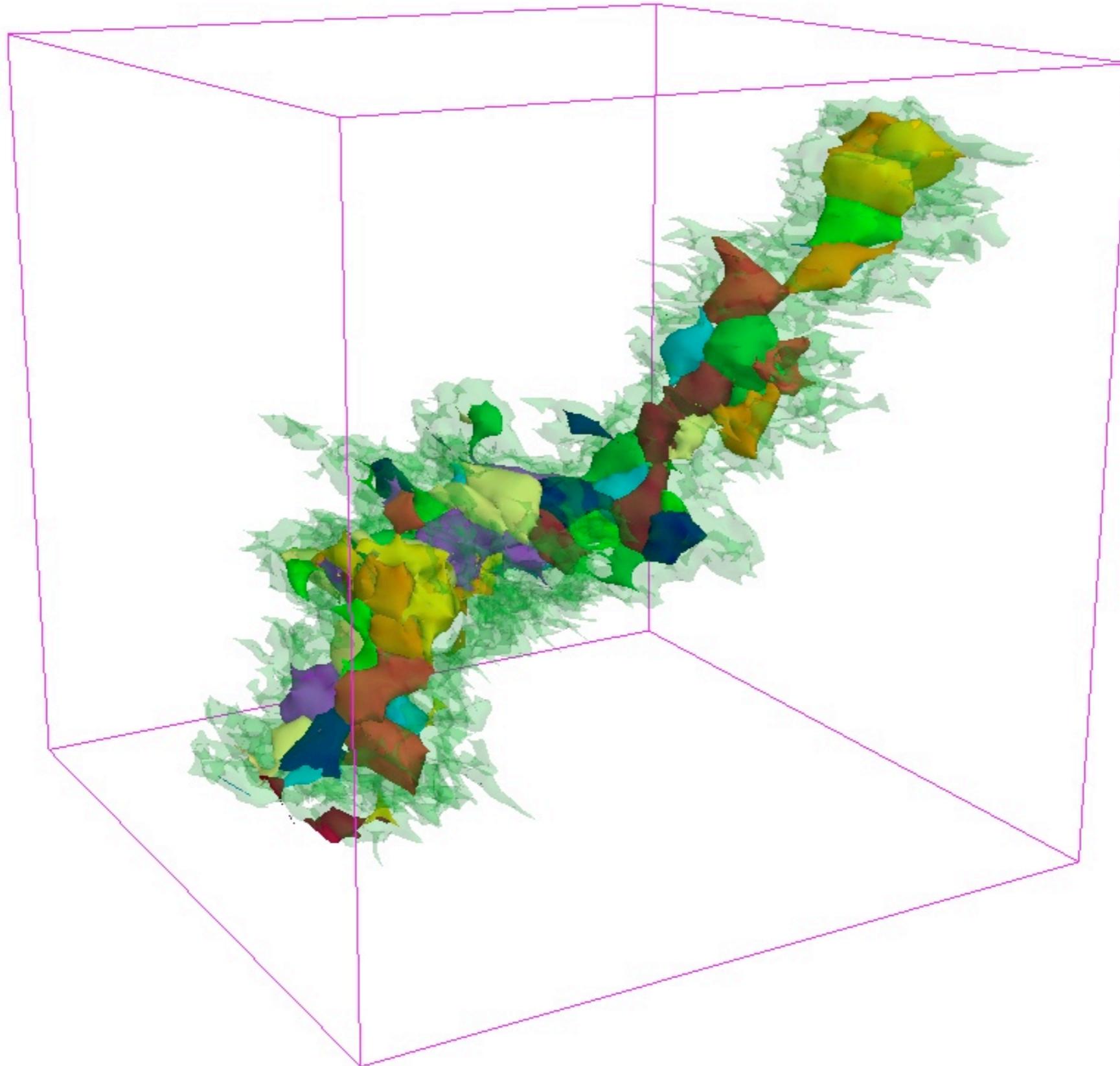


$^{13}\text{CO}$

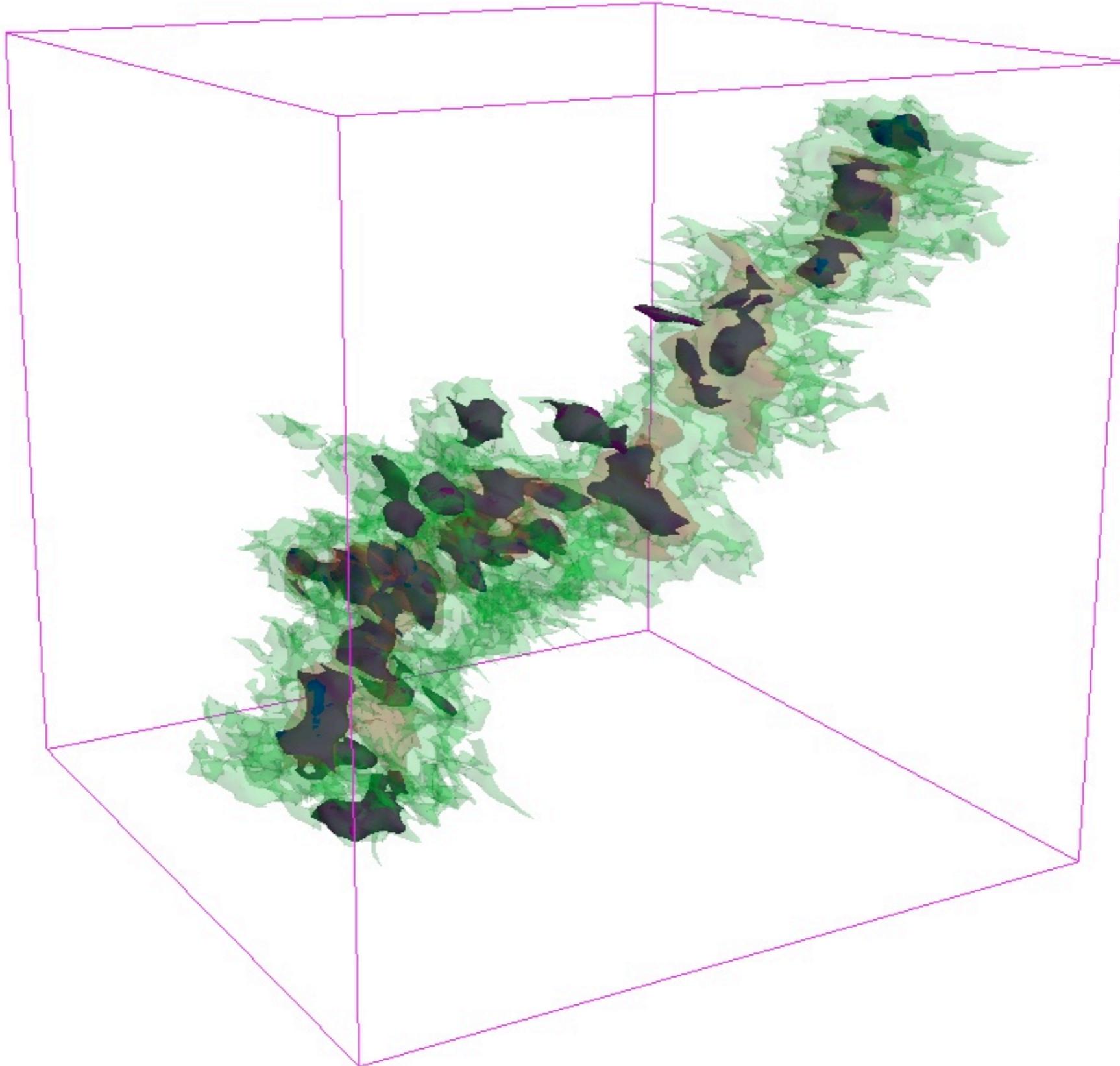


CLUMPFIND

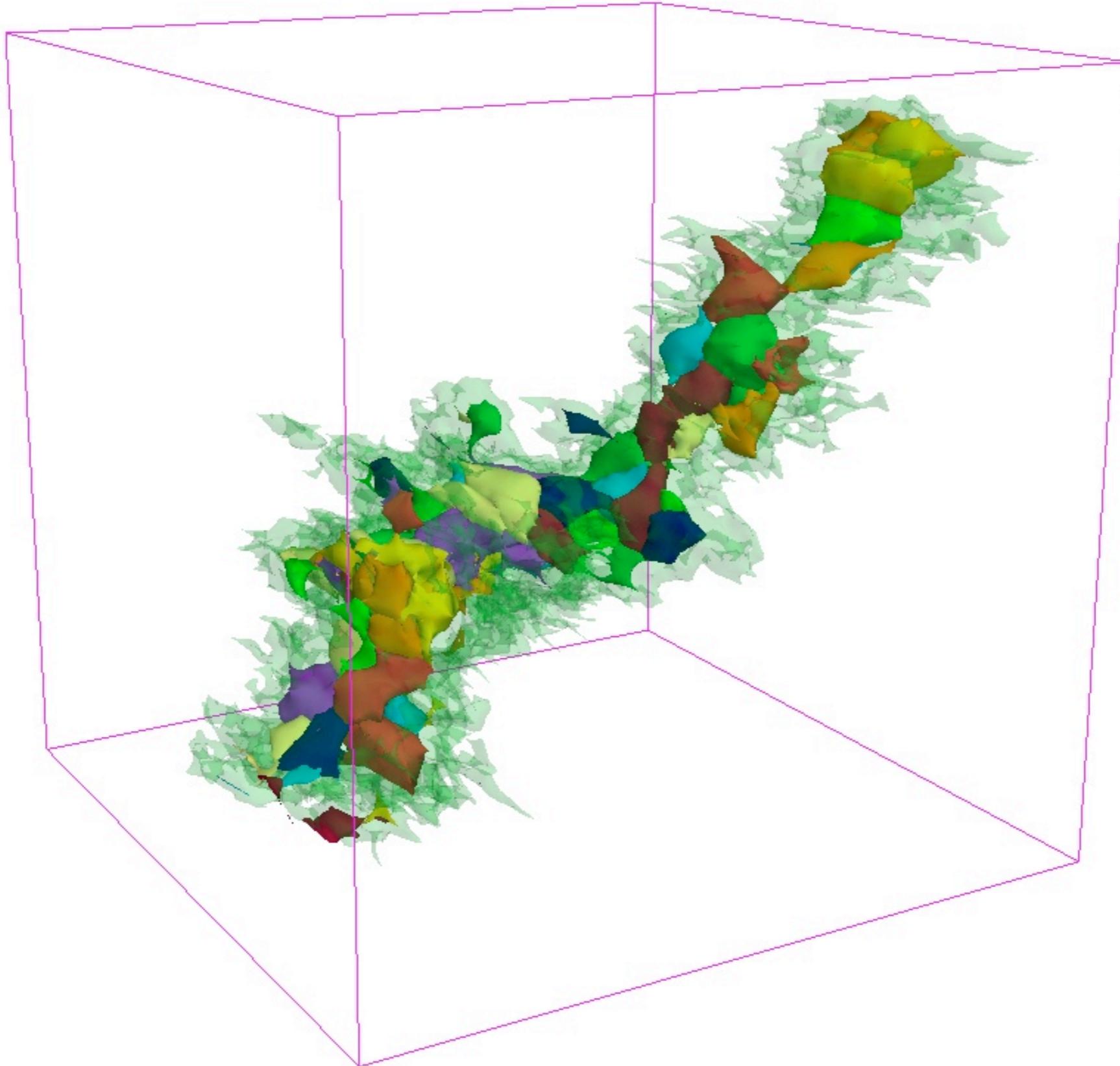
# Clumpfind+Dendro $^{13}\text{CO}$



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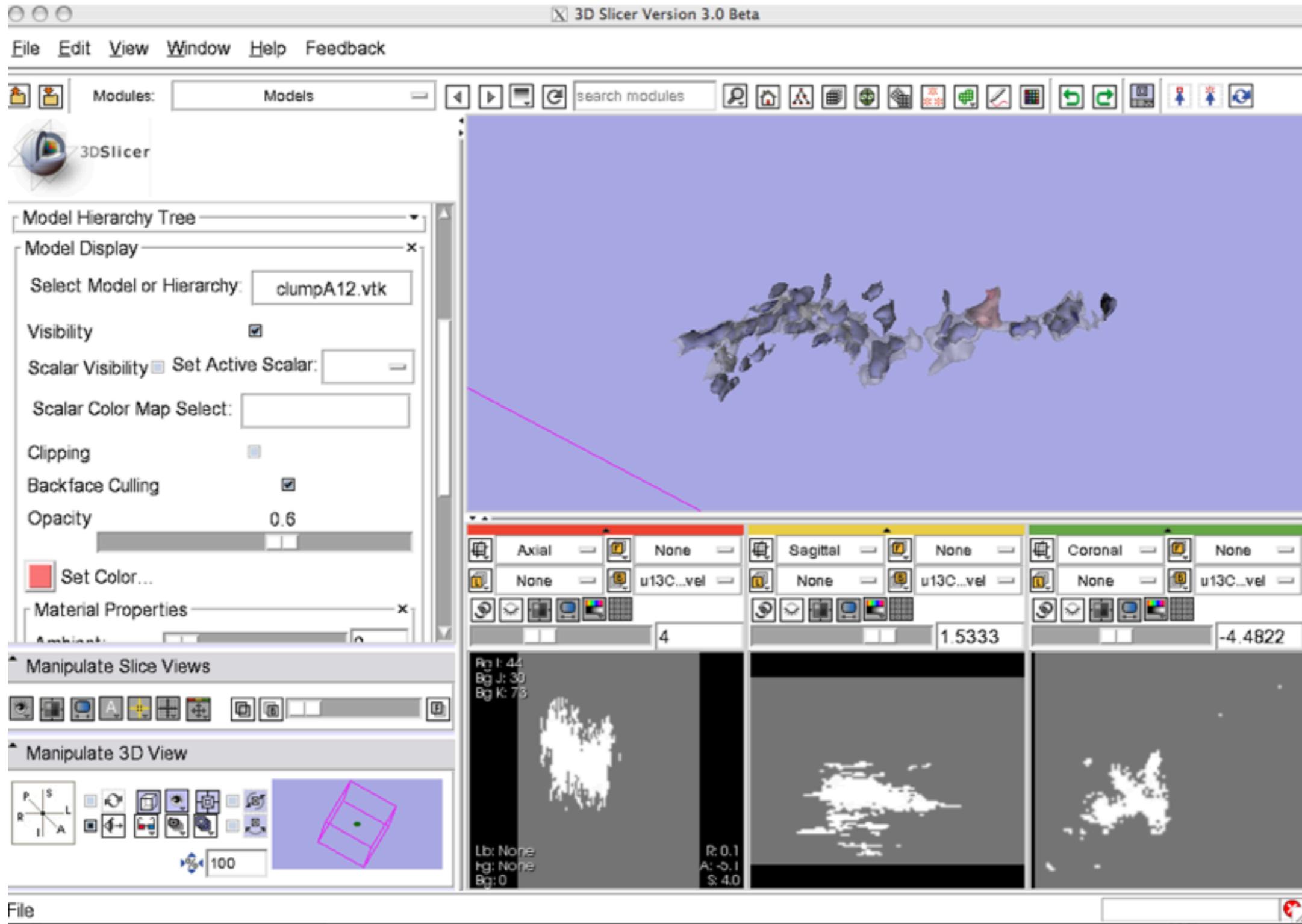


# Clumpfind+Dendro $^{13}\text{CO}$



# Slicer demo...

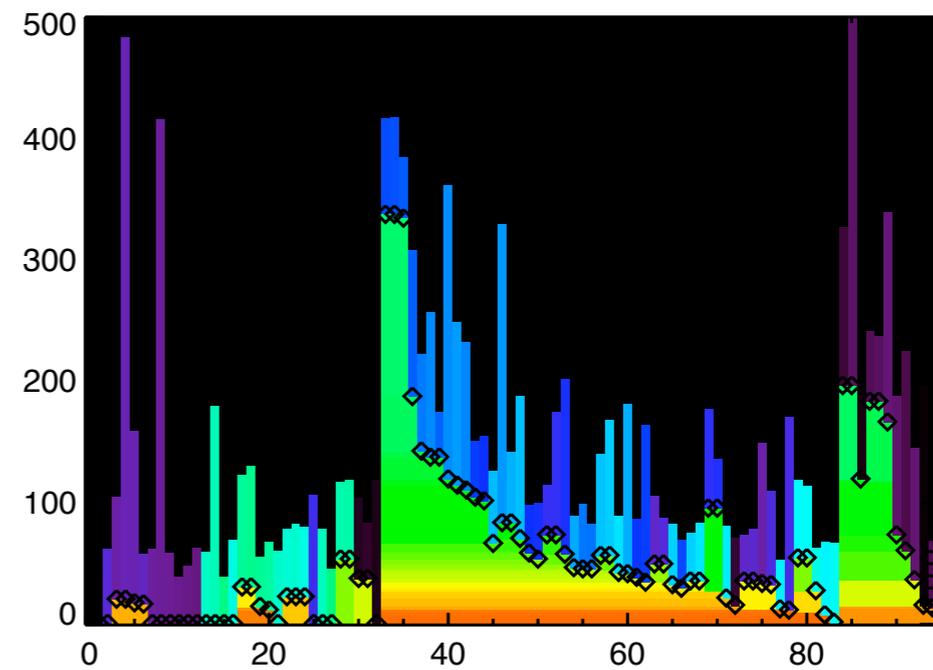
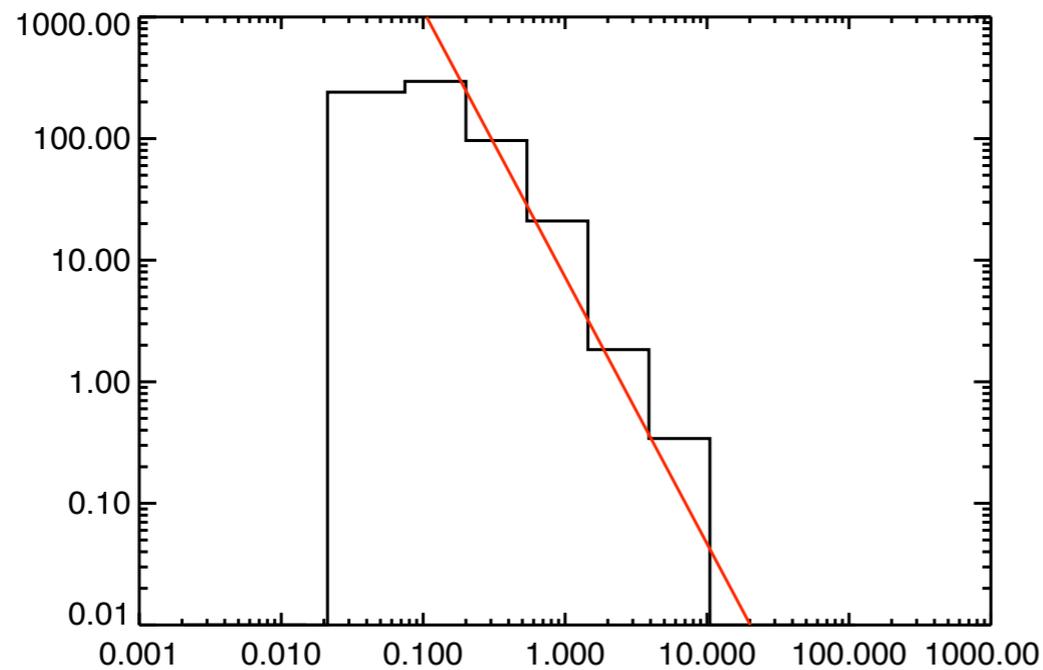
# I3CO



# DENDROGRAMS

What about the Pipe CMF..from  
extinction data leaves only?

(Jaime)



slope 2.2

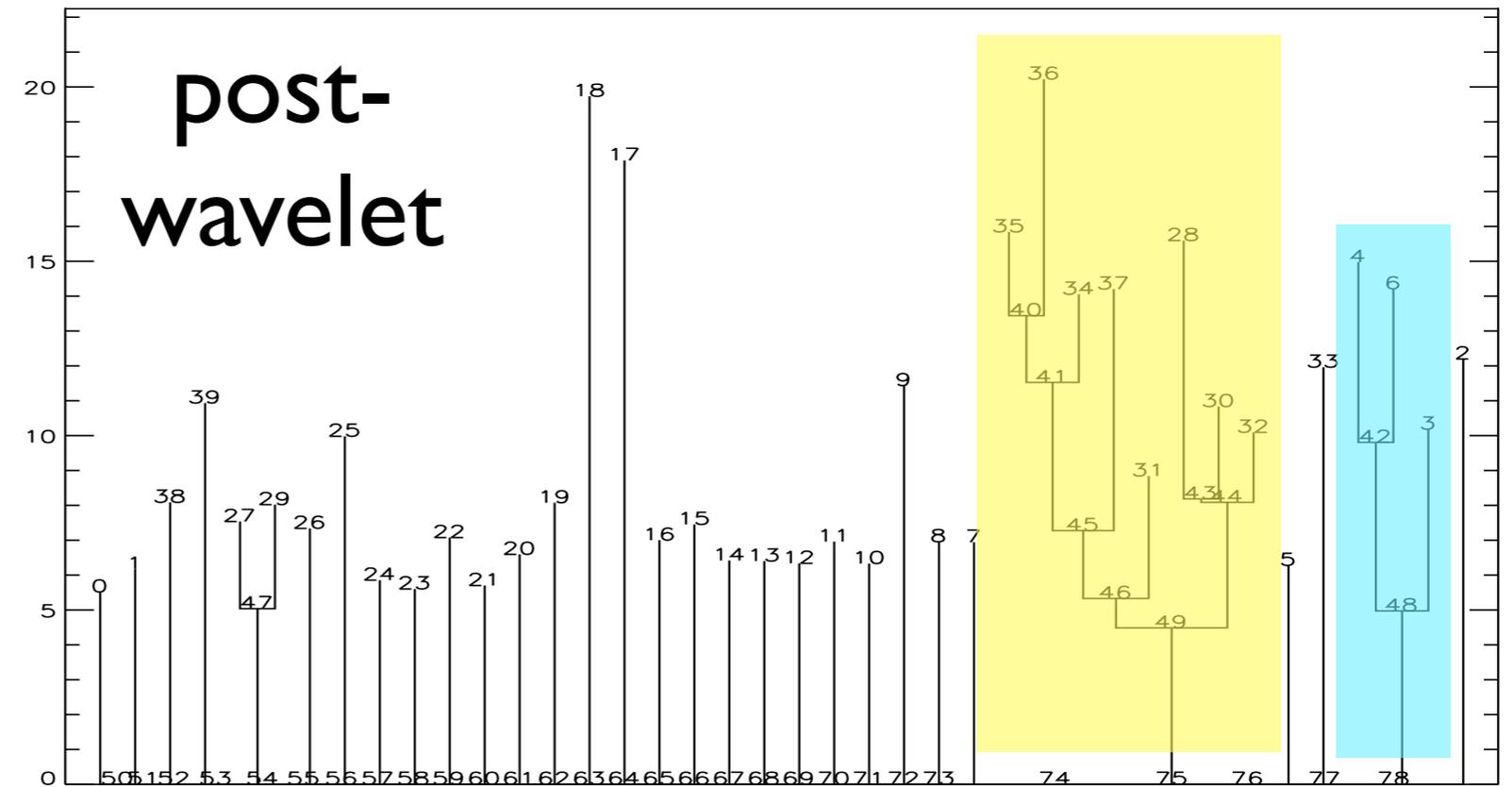
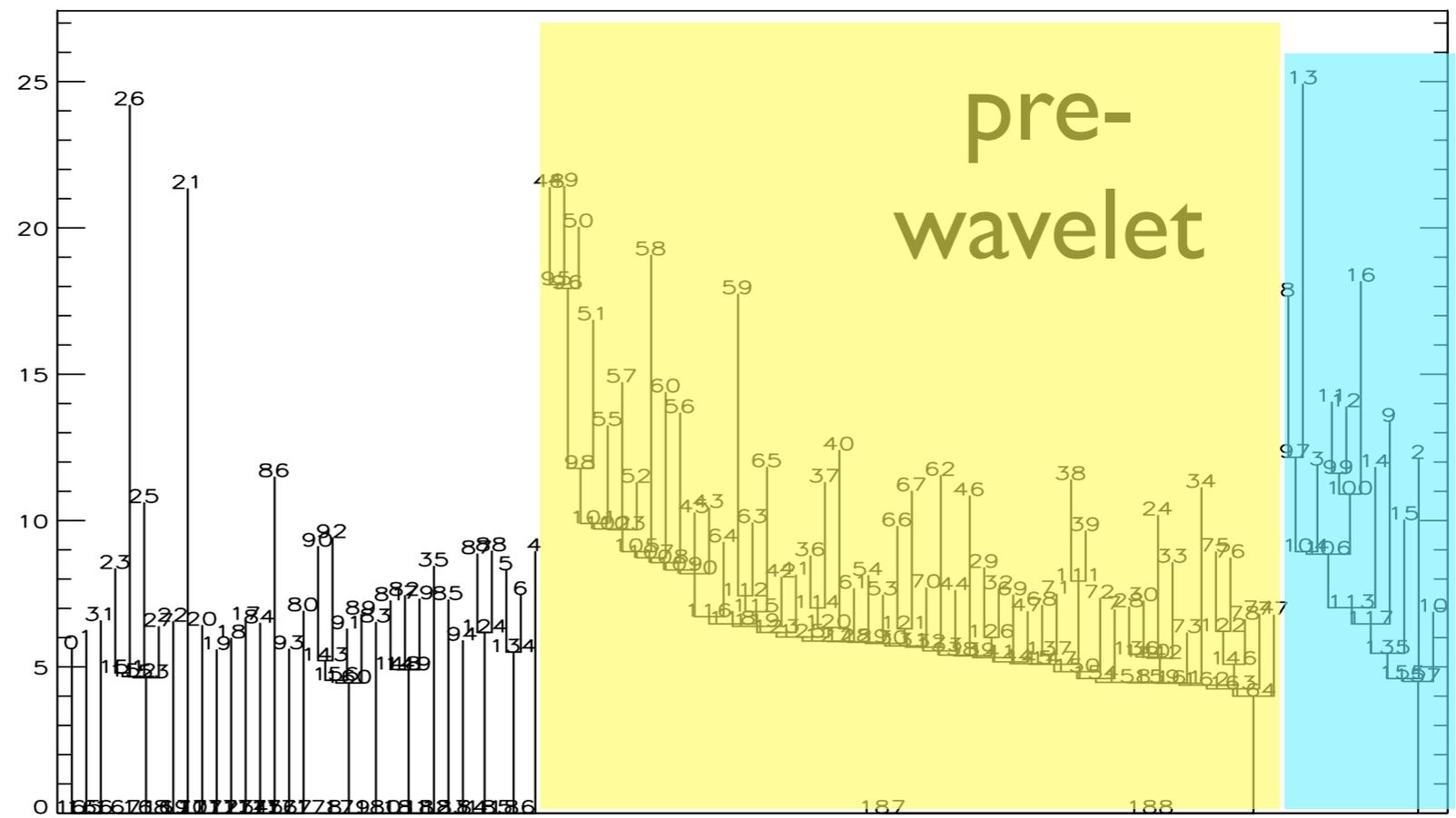
# DENDRO MASS-RADIUS

Special Bonus

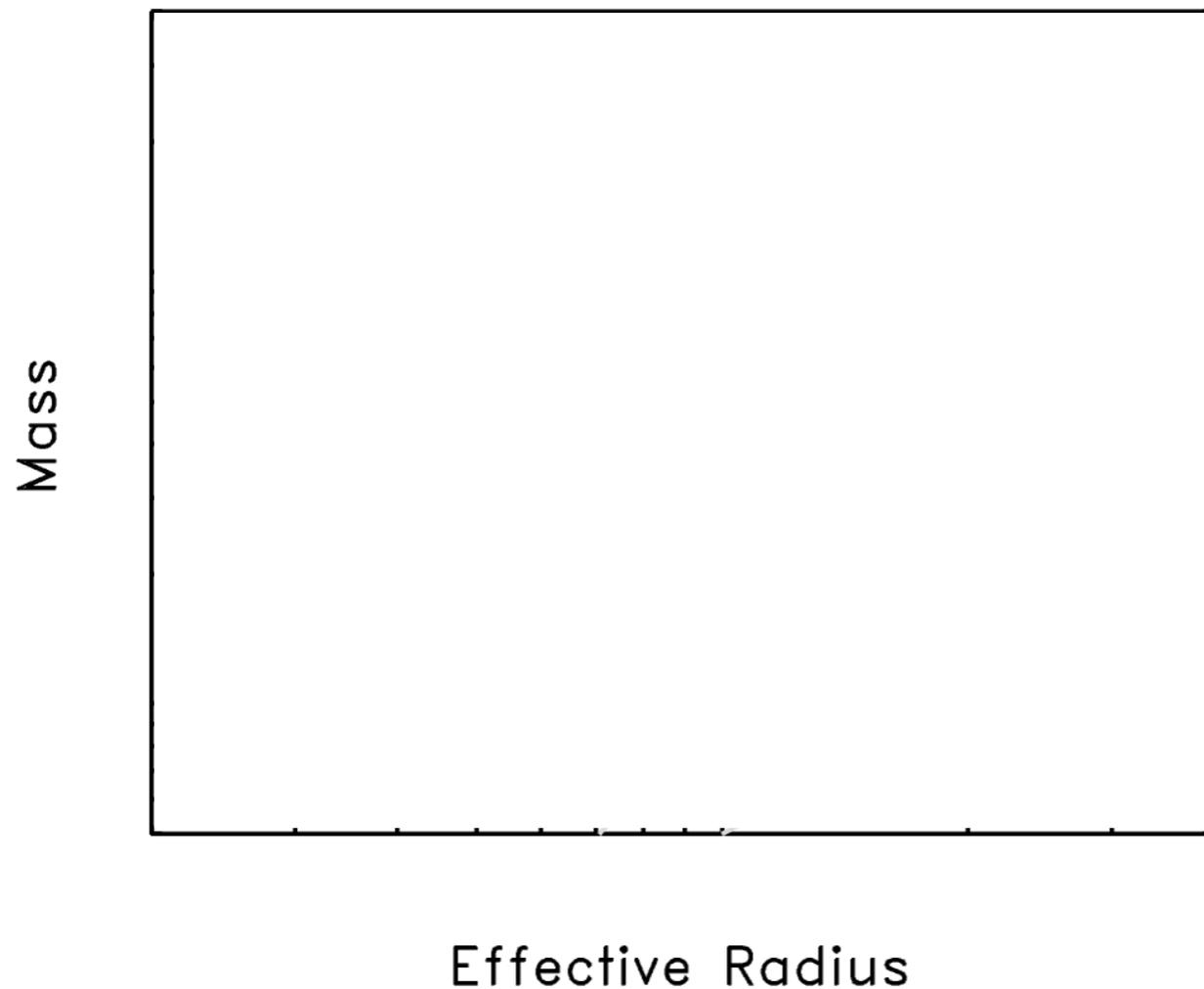
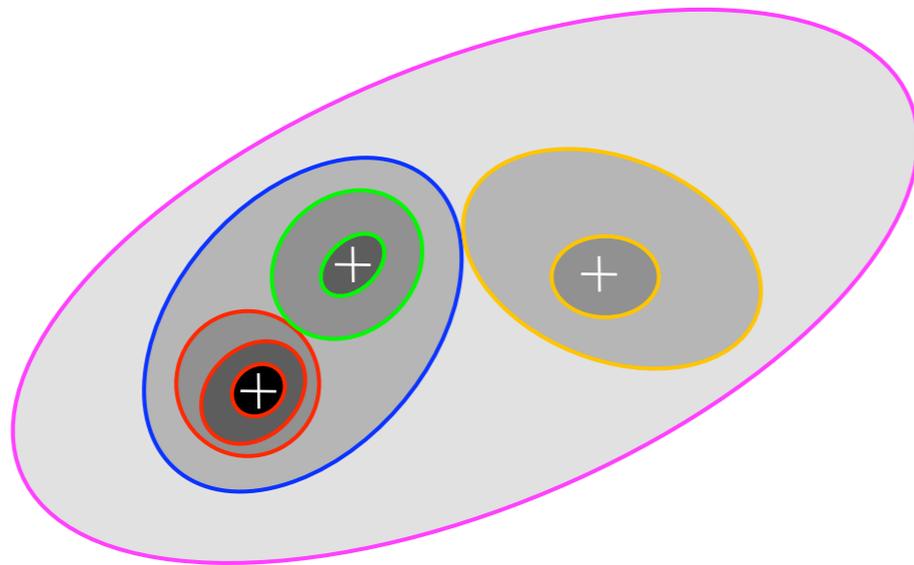
courtesy Jens Kauffmann...

(work in progress!!)

# Jens' "pruned" dendrograms...



# Method: Analysis of nested Contours

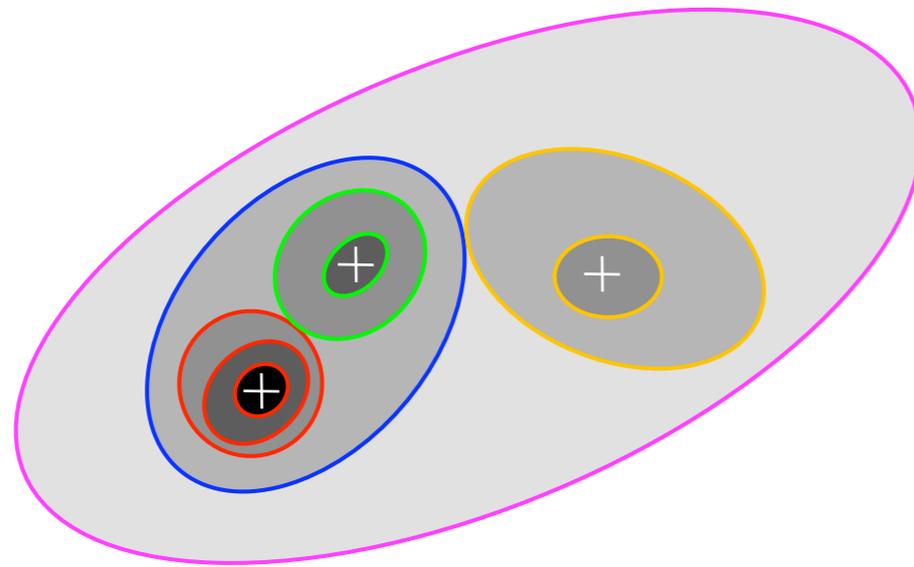


effective radius:

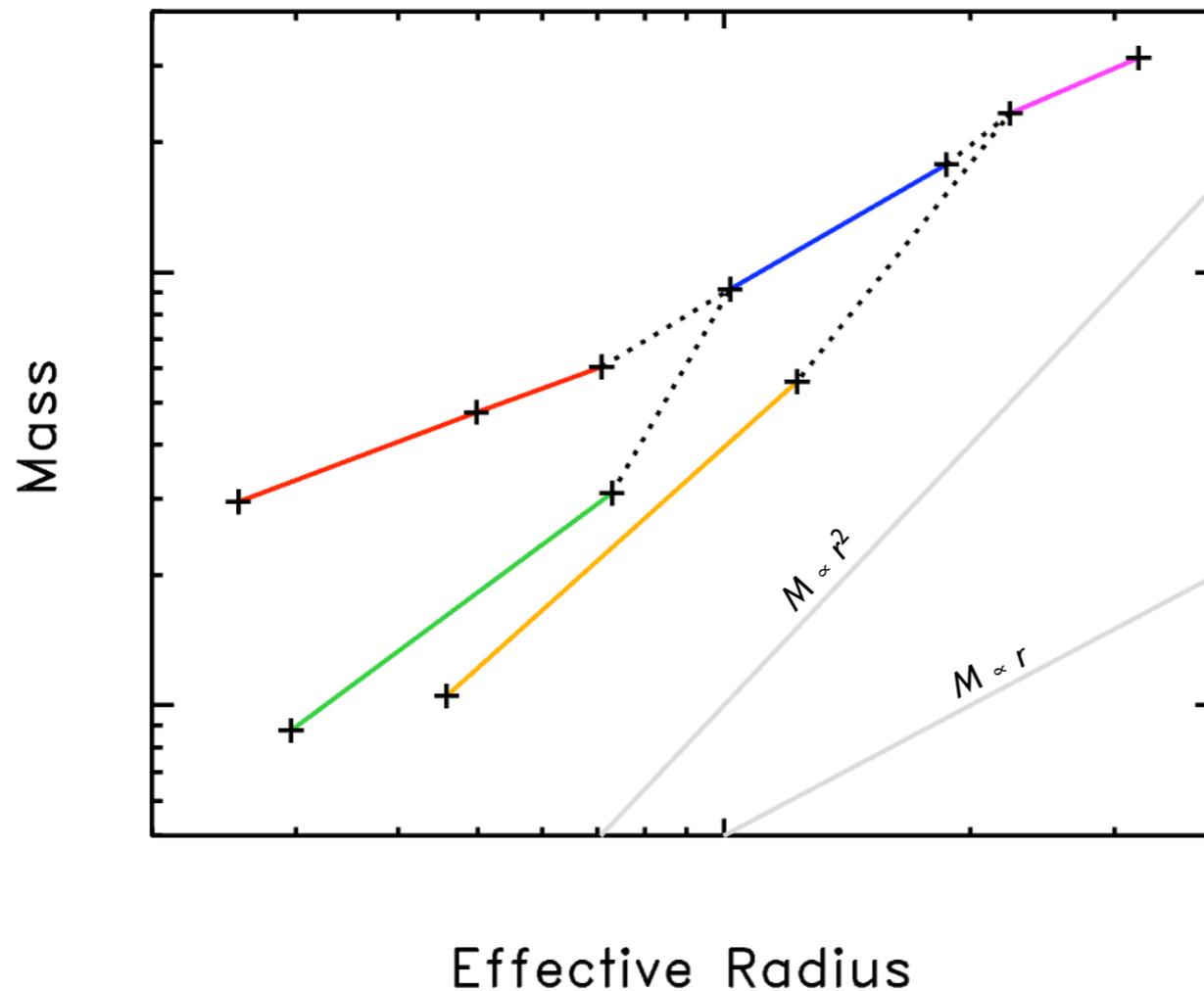
$$R = (A/\pi)^{1/2}$$

Jens Kauffmann (in prep.)

# Method: Analysis of nested Contours



stepping through all contours...

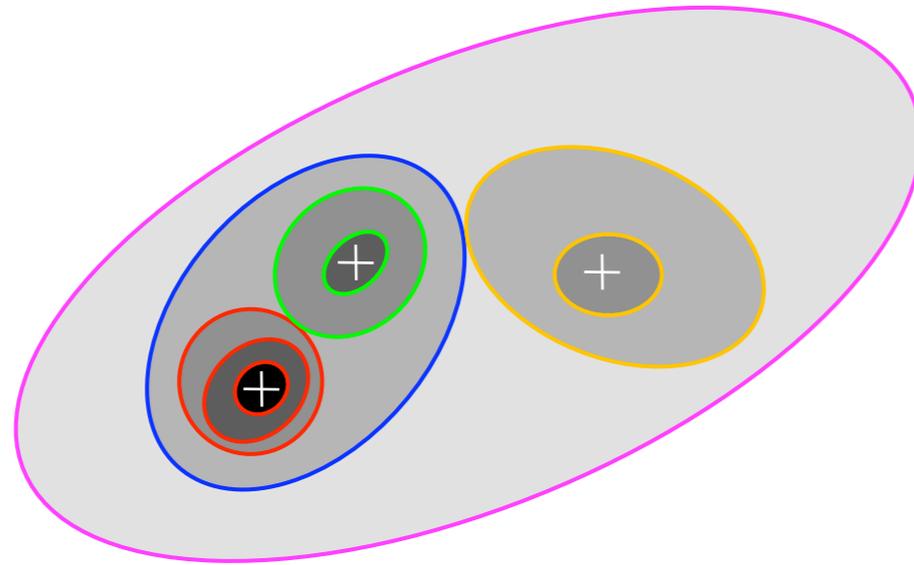


effective radius:

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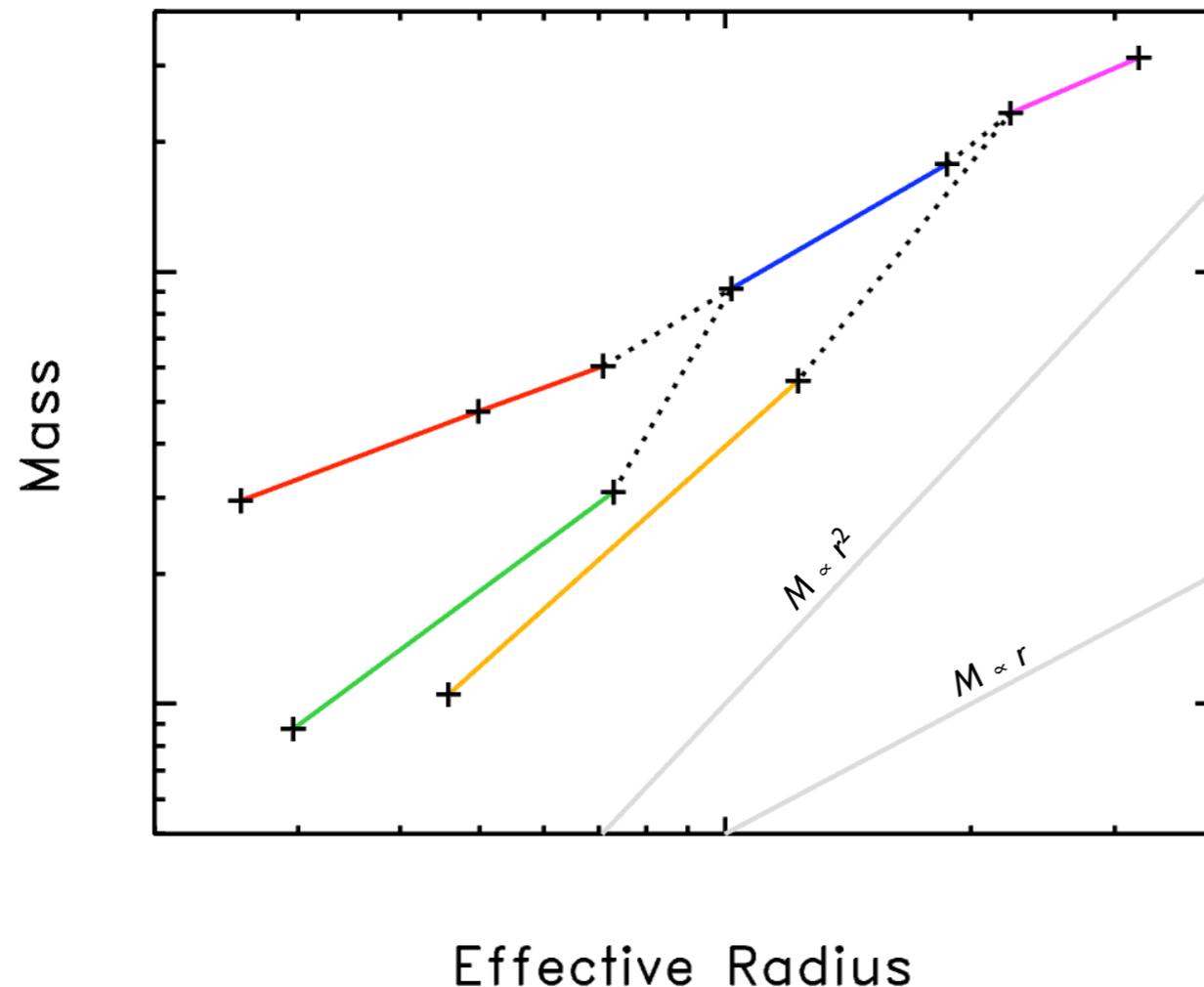
Jens Kauffmann (in prep.)

# Method: Analysis of nested Contours



stepping through all contours...

✓ consideration of all spatial scales

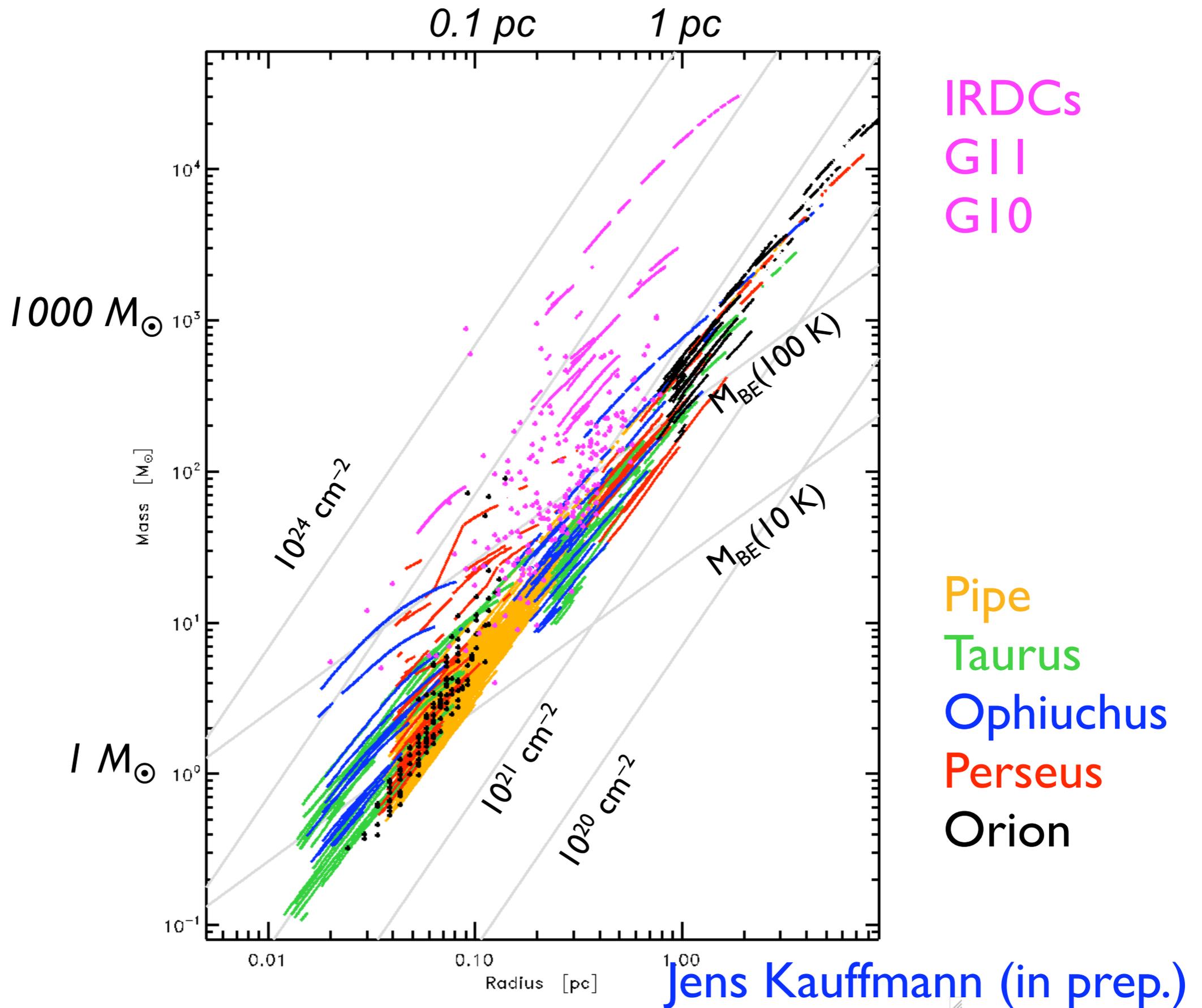


effective radius:

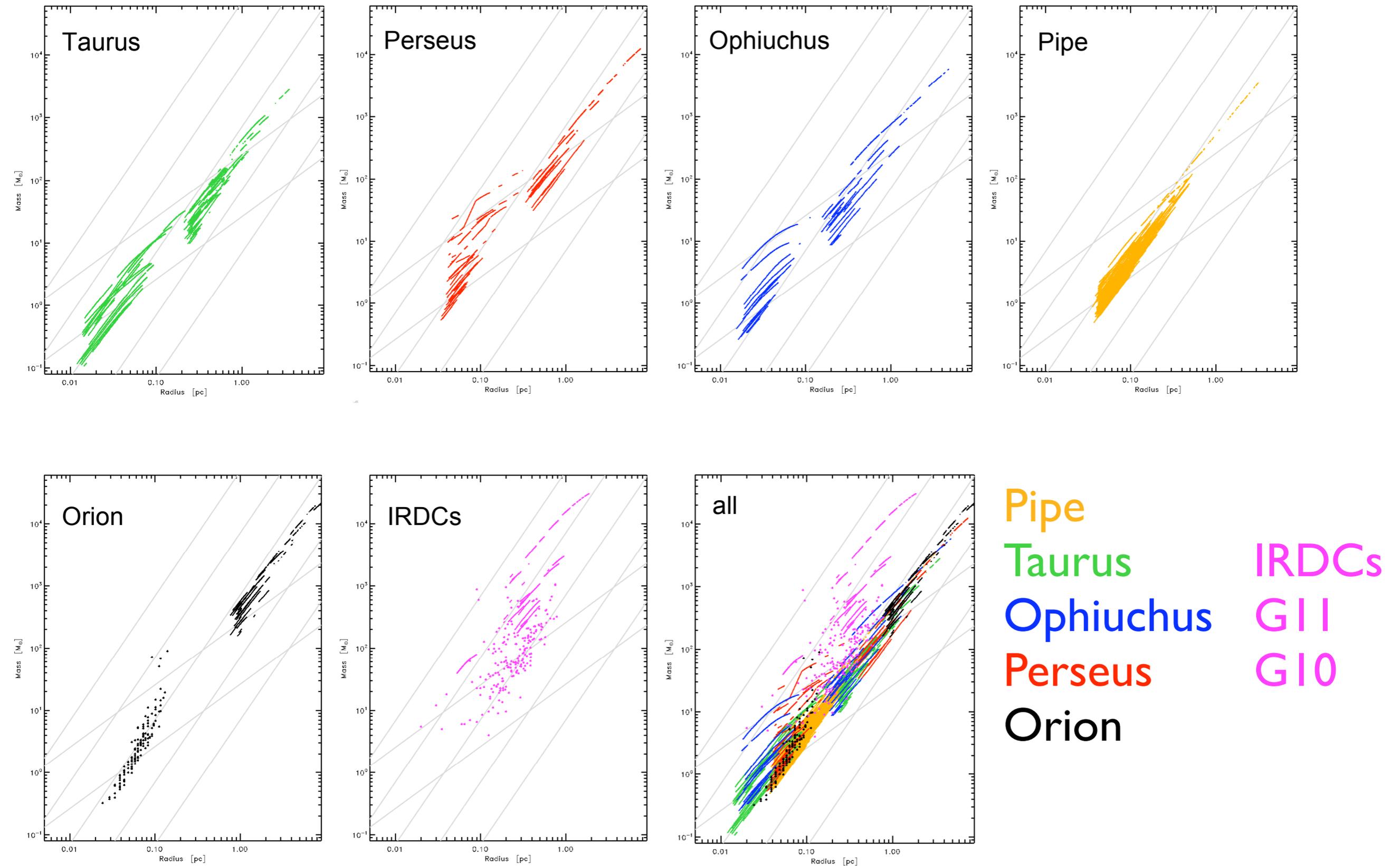
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Jens Kauffmann (in prep.)

# Regions Studied so far

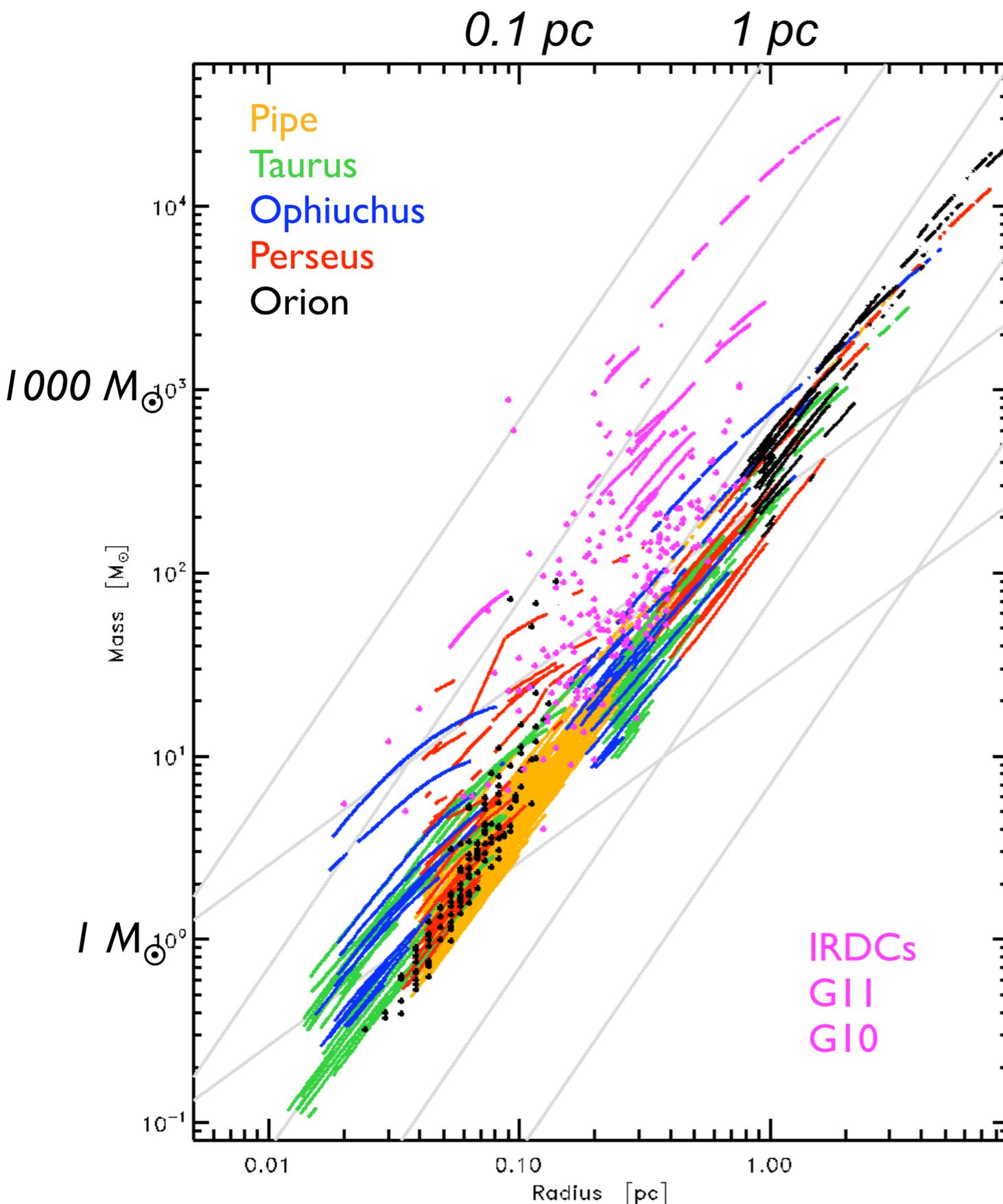


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Jens Kauffmann (in prep.)

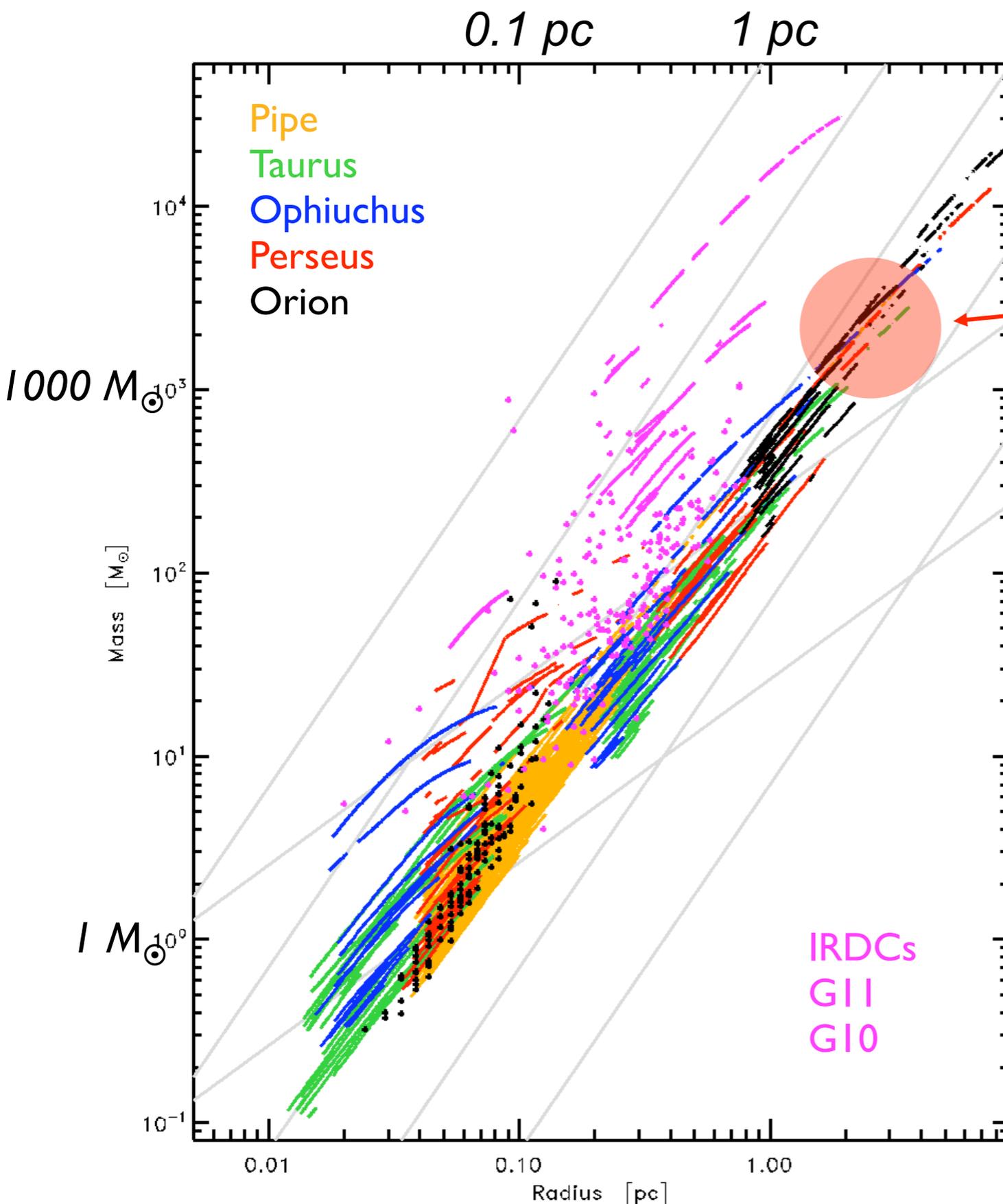
# Interesting Trends



- at sizes  $\sim 1$  pc, all nearby clouds ( $< 500$  pc) behave similarly
- at smaller sizes, they diverge in their behavior
- IRDCs don't behave so "regularly"

Jens Kauffmann (in prep.)

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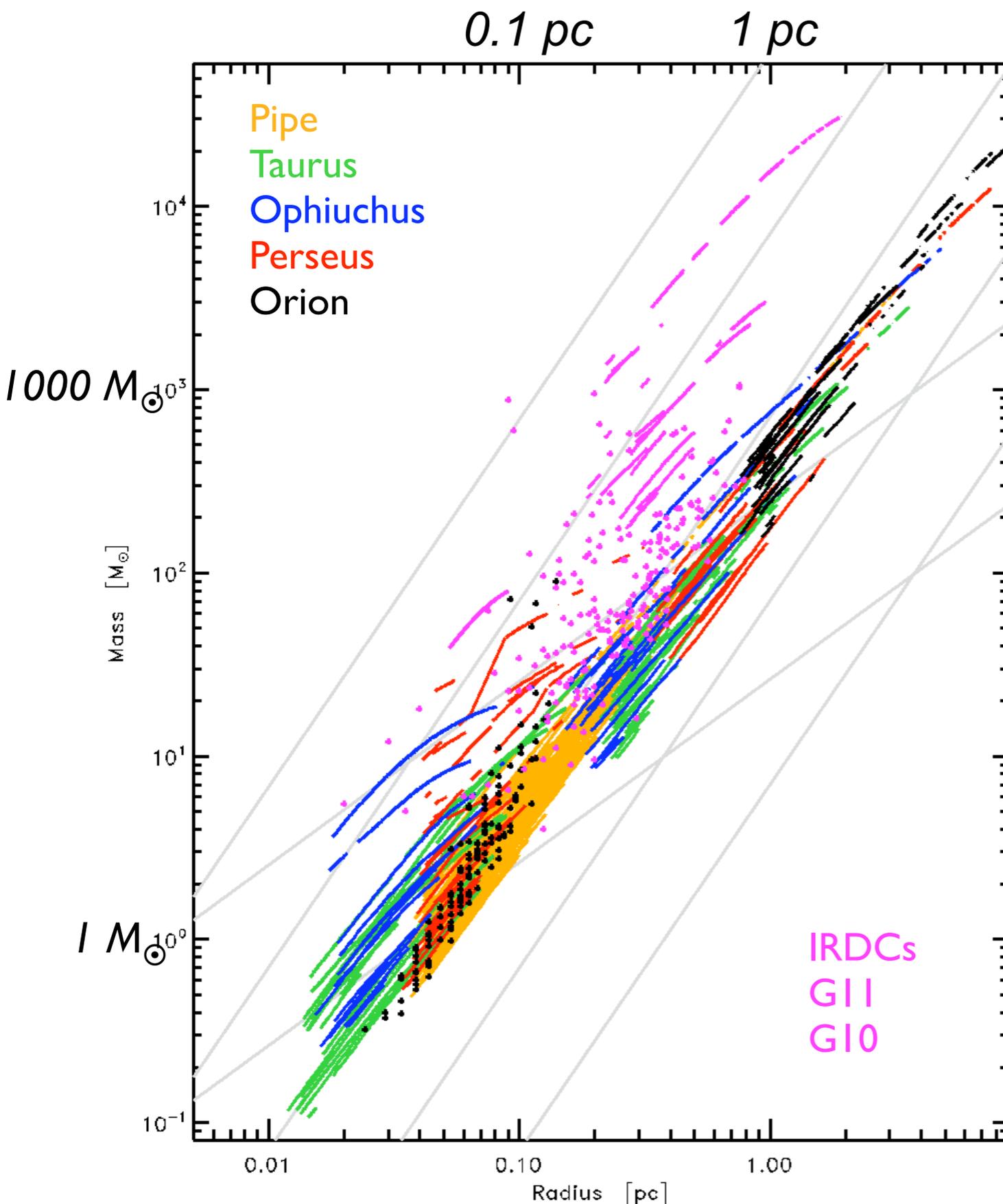


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Pipe & Taurus  $\sim$  Orion!

Jens Kauffmann (in prep.)

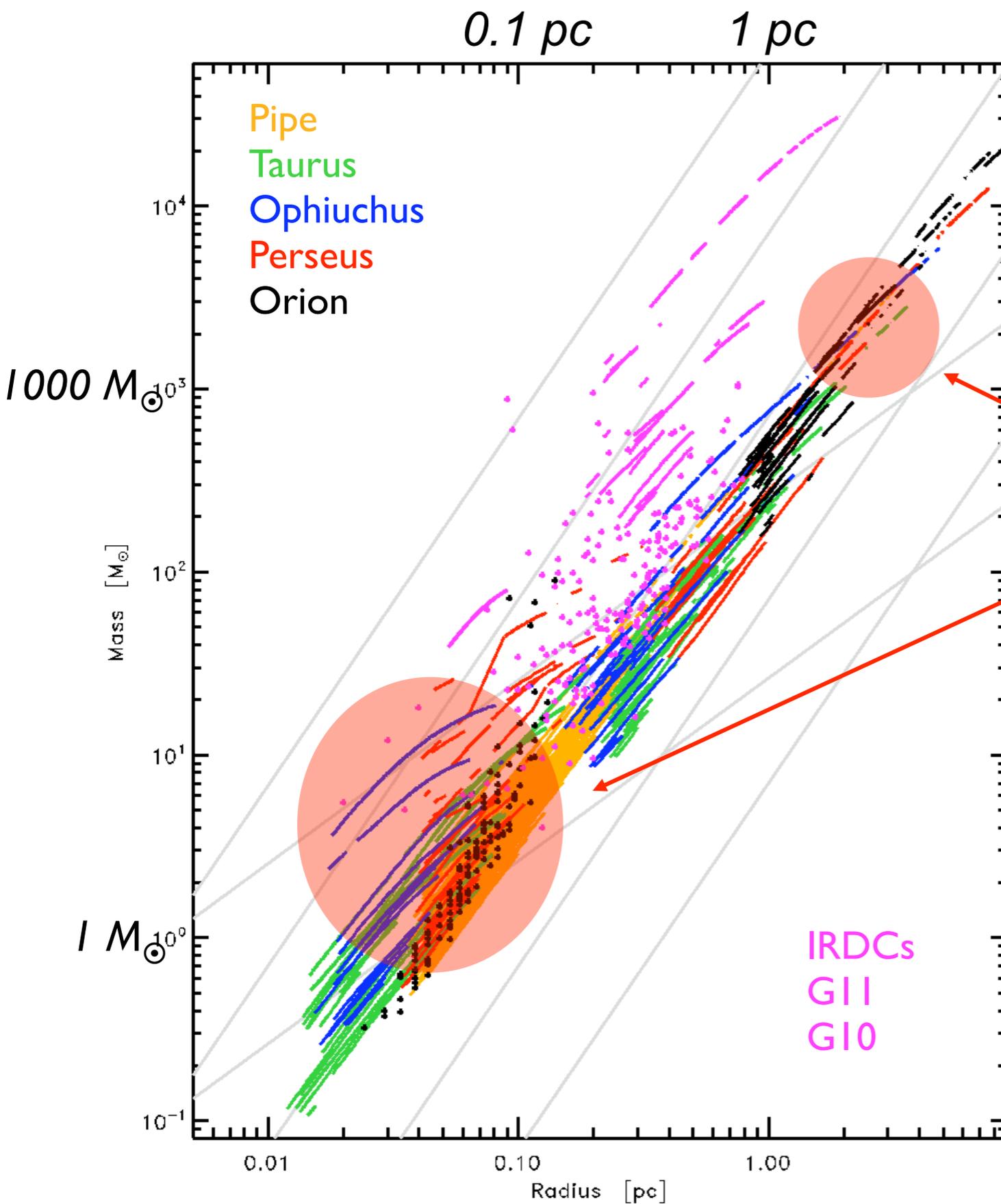
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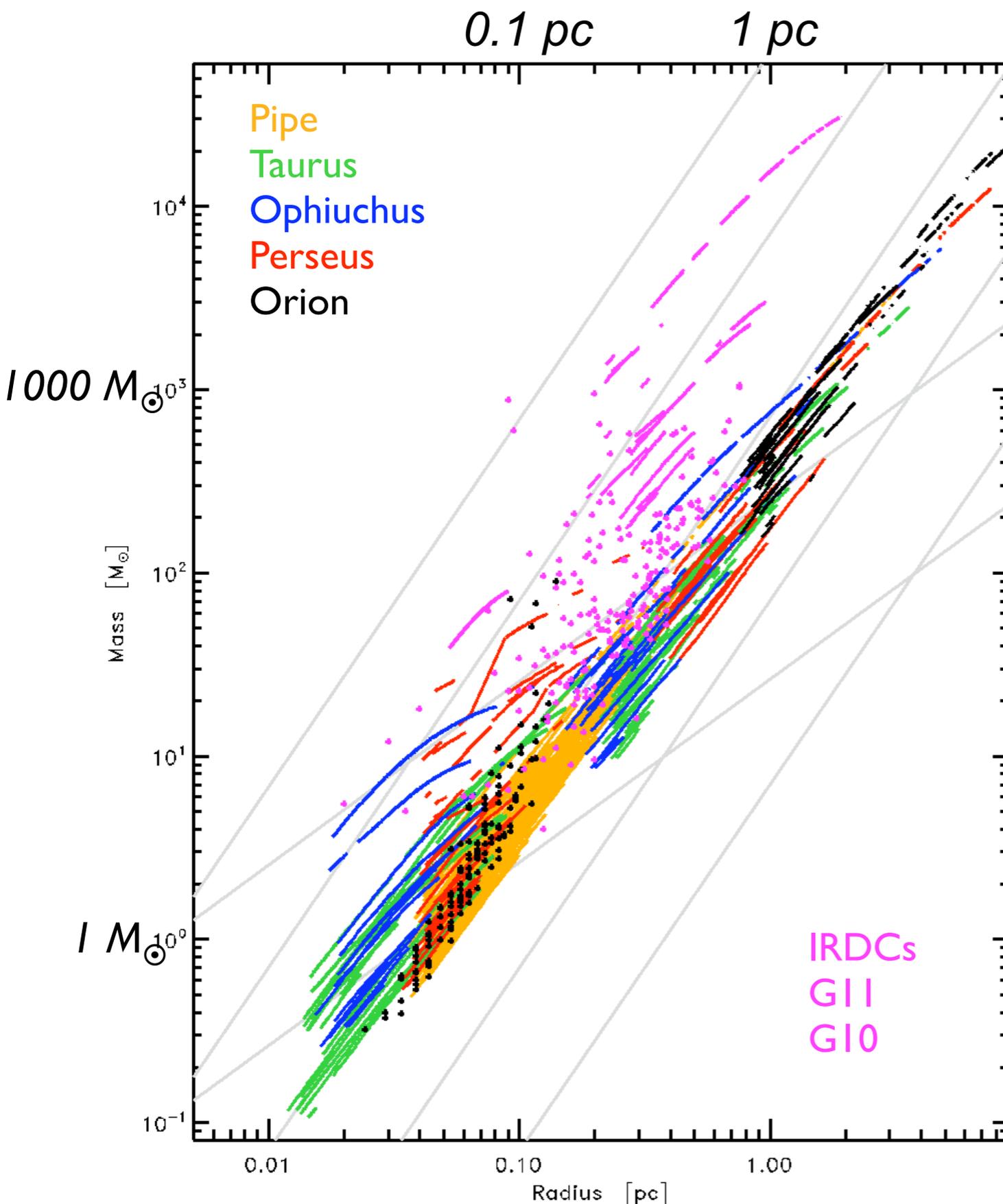
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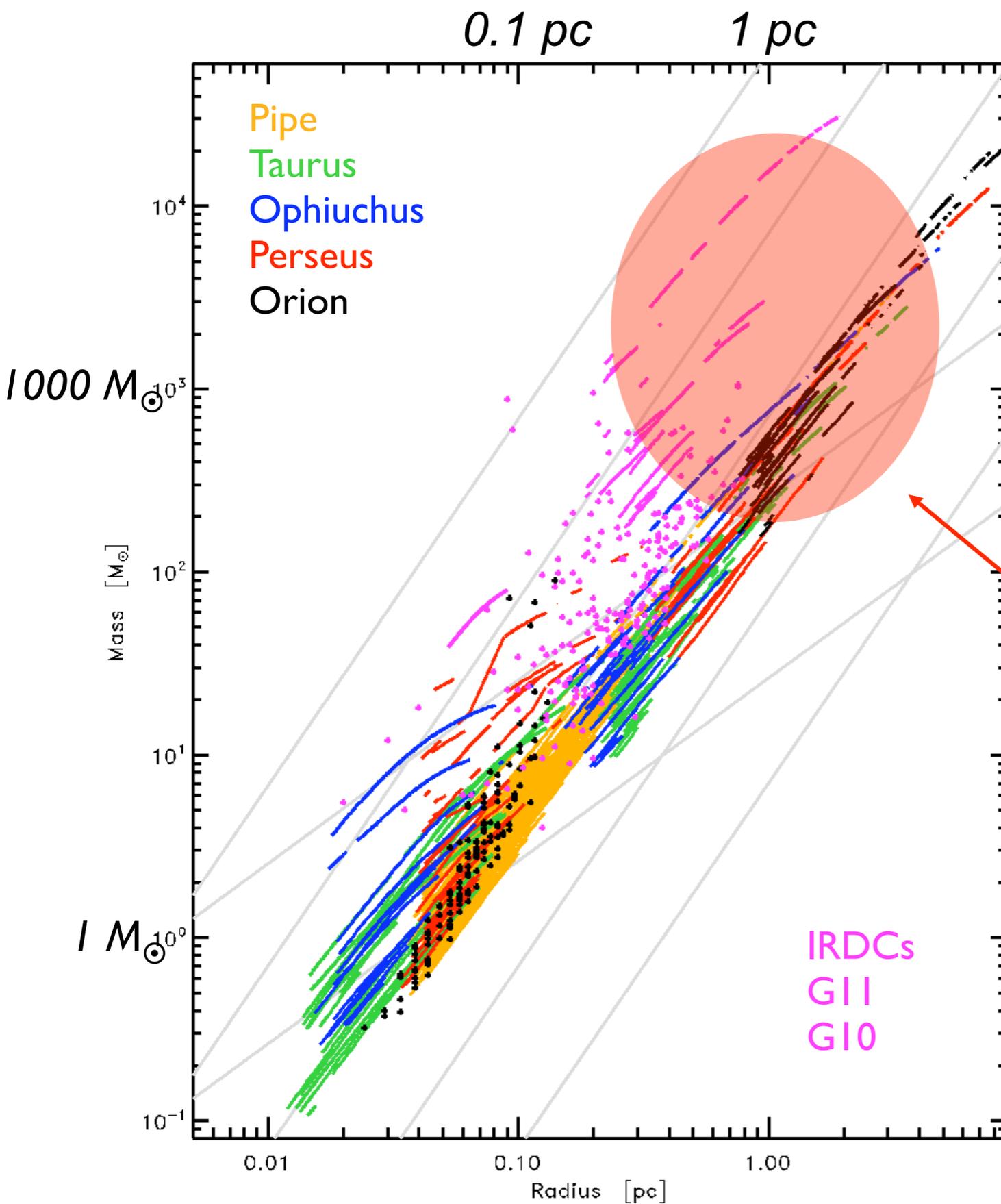
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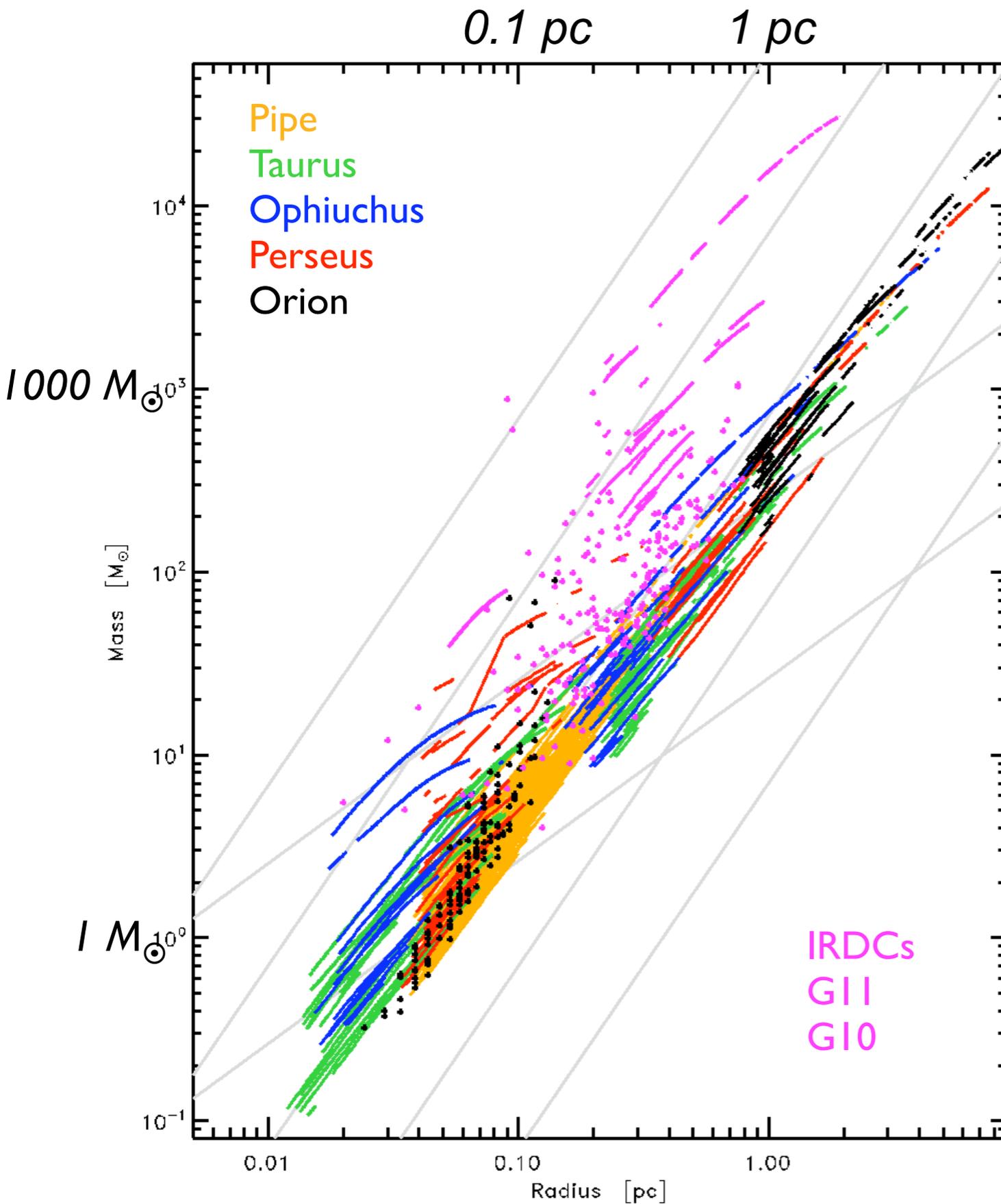
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# Related Cloud Physics

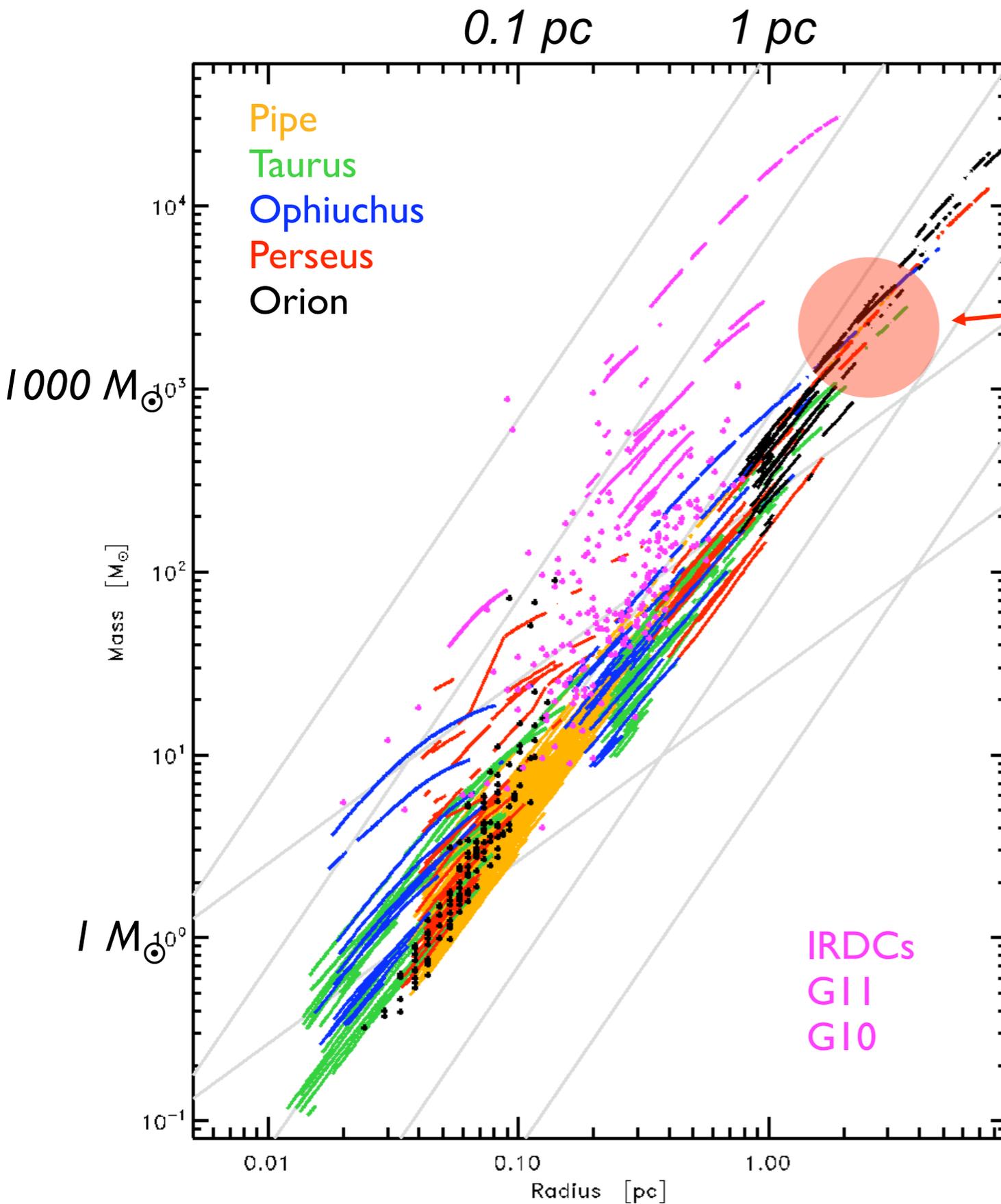


for nearby clouds...

- large-scale structure probably set by galactic environment (pressure, etc.)
- increase of density towards cores, depends on cloud
- usual dense core models

Jens Kauffmann (in prep.)

# Related Cloud Physics

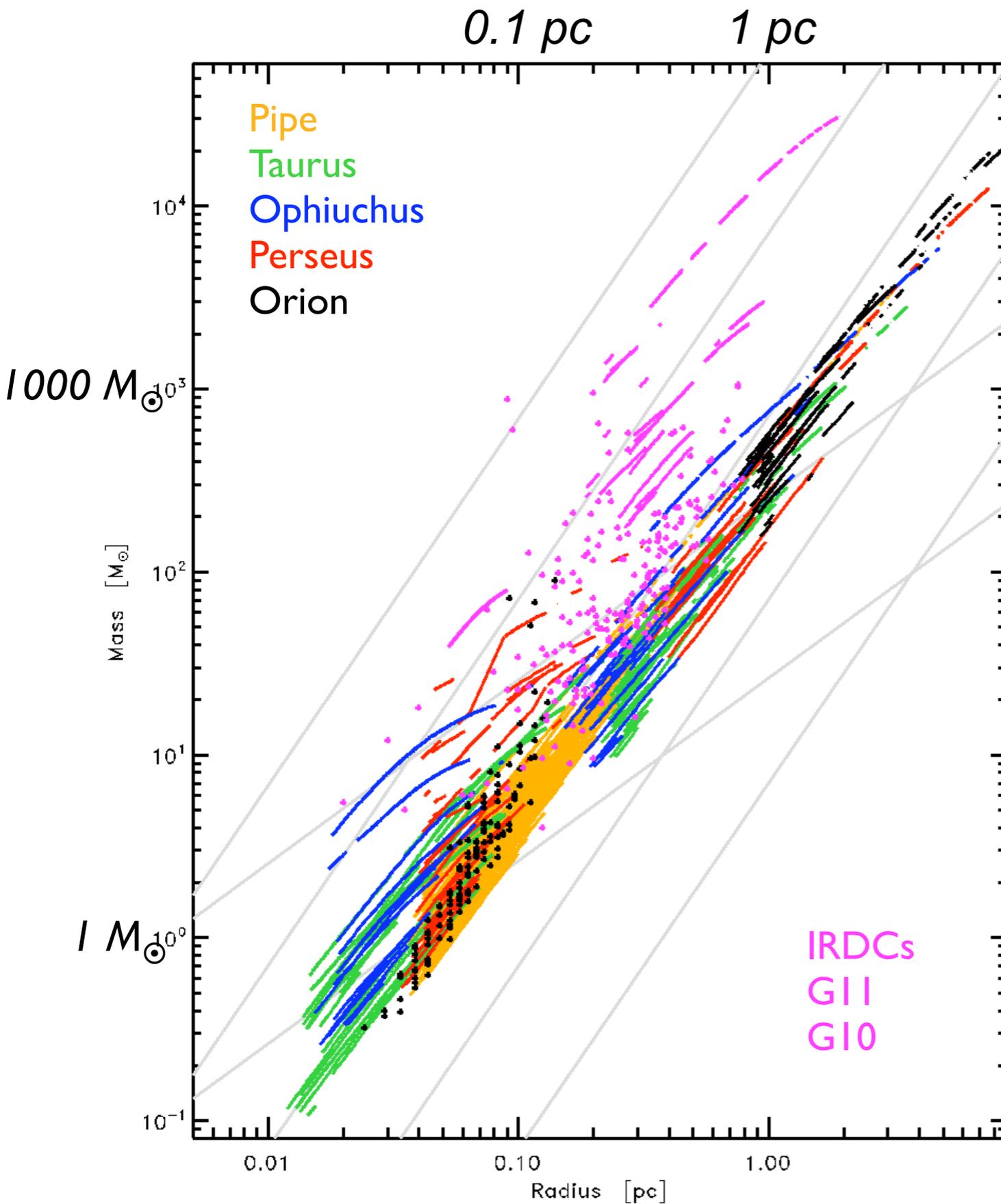


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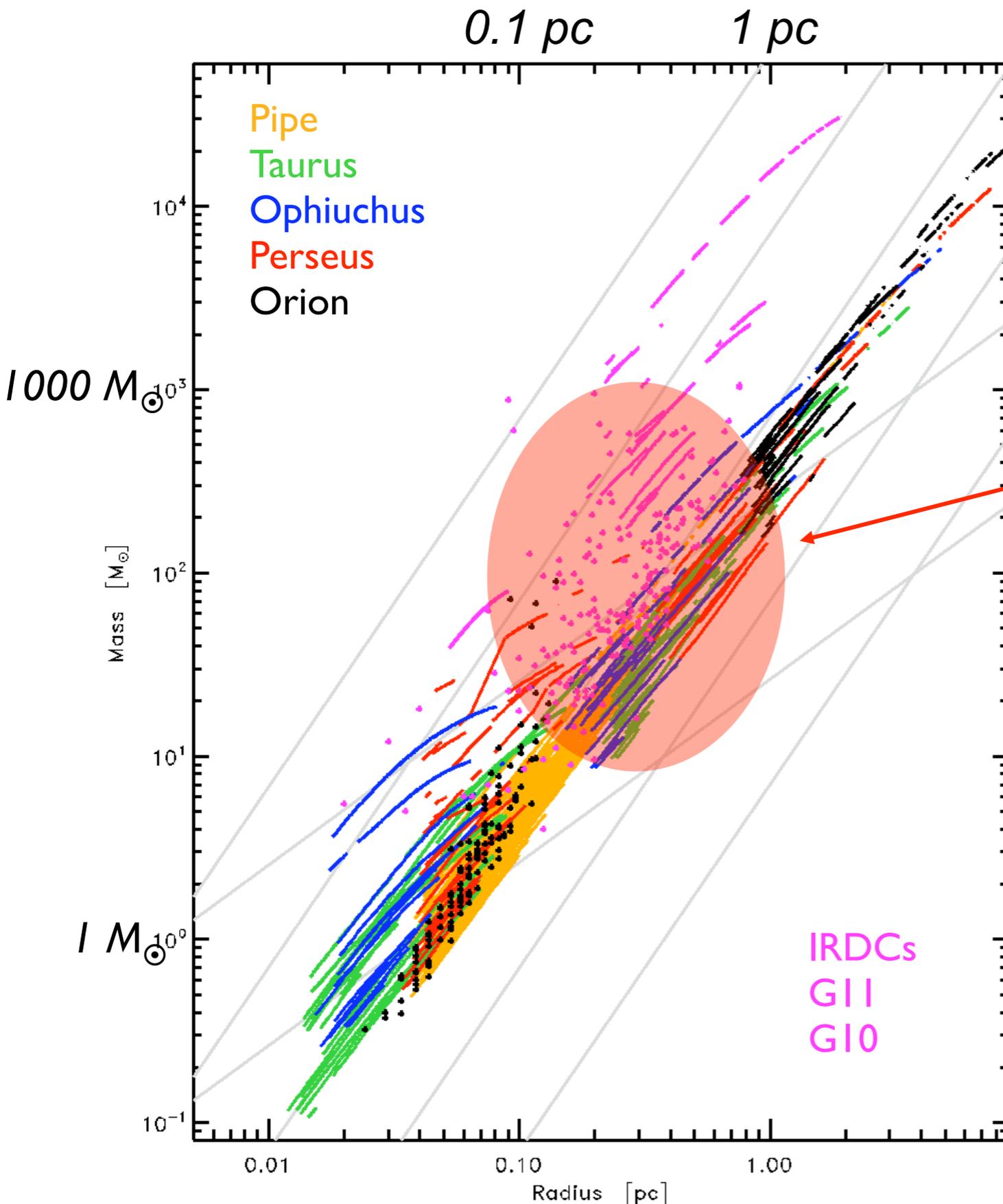


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Jens Kauffmann (in prep.)

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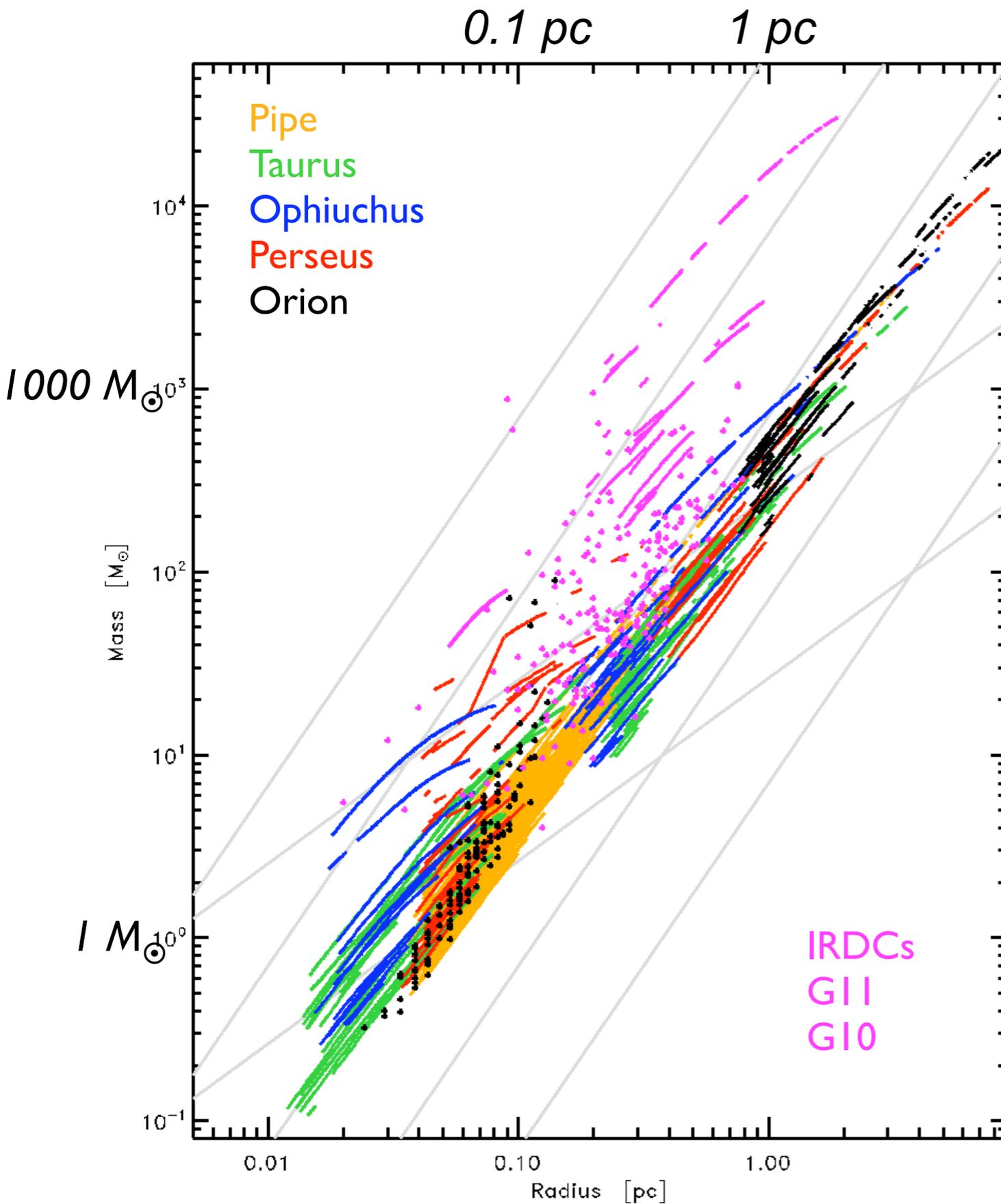
for nearby clouds...

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Are cores surrounded by smooth column density profiles? Or is there a sharp jump?

Jens Kauffmann (in prep.)

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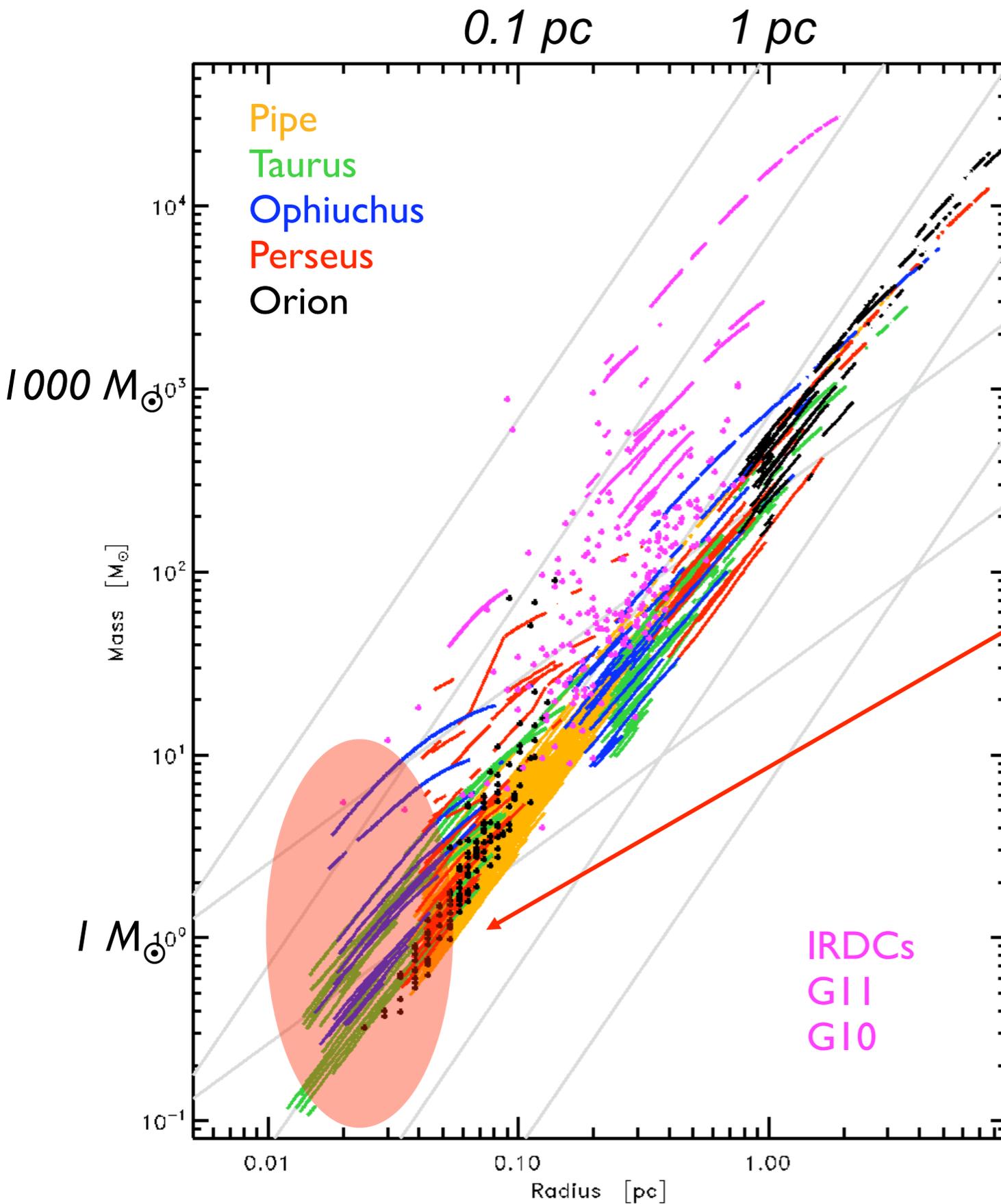


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Jens Kauffmann (in prep.)

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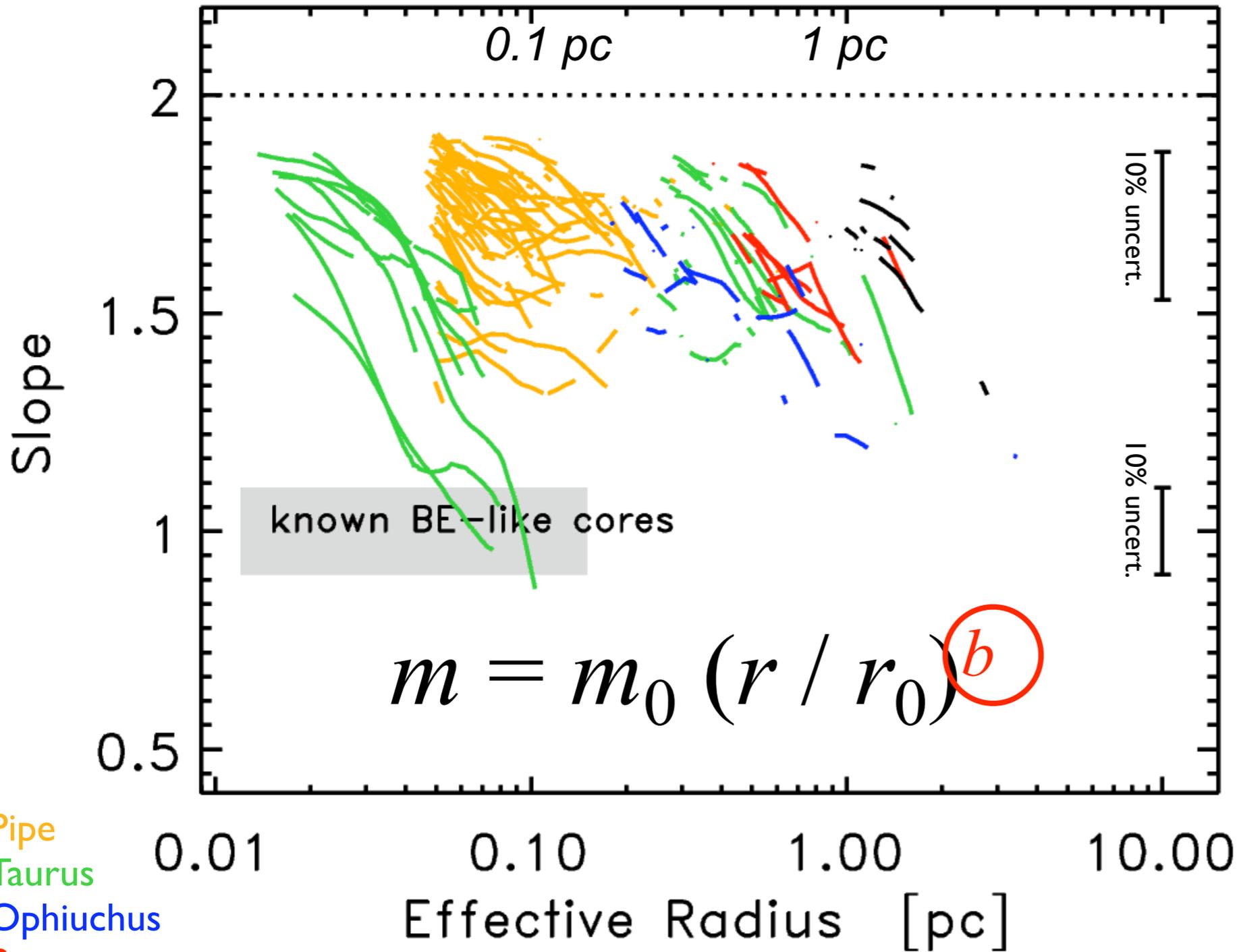
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Jens Kauffmann (in prep.)

# Detailed Cloud Physics I

first m-r slope measurement using single tracer/single region



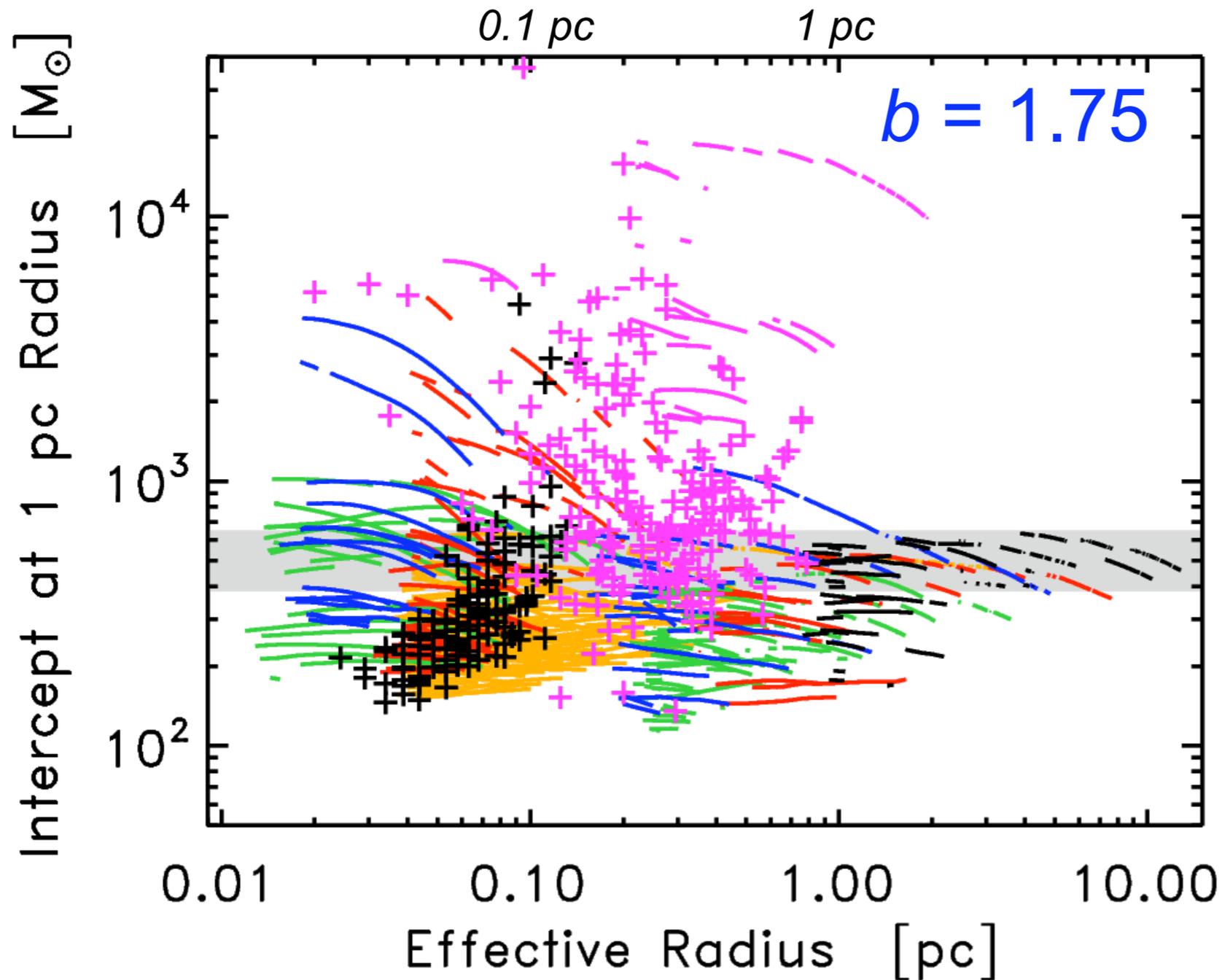
singular polytrope:  
 $\rho \propto r^{-k}, P \propto \rho^\gamma$   
 $\Rightarrow b = (4 - 3\gamma)/(2 - \gamma)$   
 $\Rightarrow \gamma$   
 $\Rightarrow$  cloud physics from b!

Jens Kauffmann (in prep.)

# Detailed Cloud Physics II

IRDCs  
GII  
G10  
Pipe  
Taurus  
Ophiuchus  
Perseus  
Orion

$m = 500 M_{\odot} (r/\text{pc})^{1.75}$  as a limiting relation...



- describes all nearby clouds on large scales
- describes Pipe on all scales
- regions forming massive stars and clusters must evolve with  $b < 1.75$  at intermediate radii

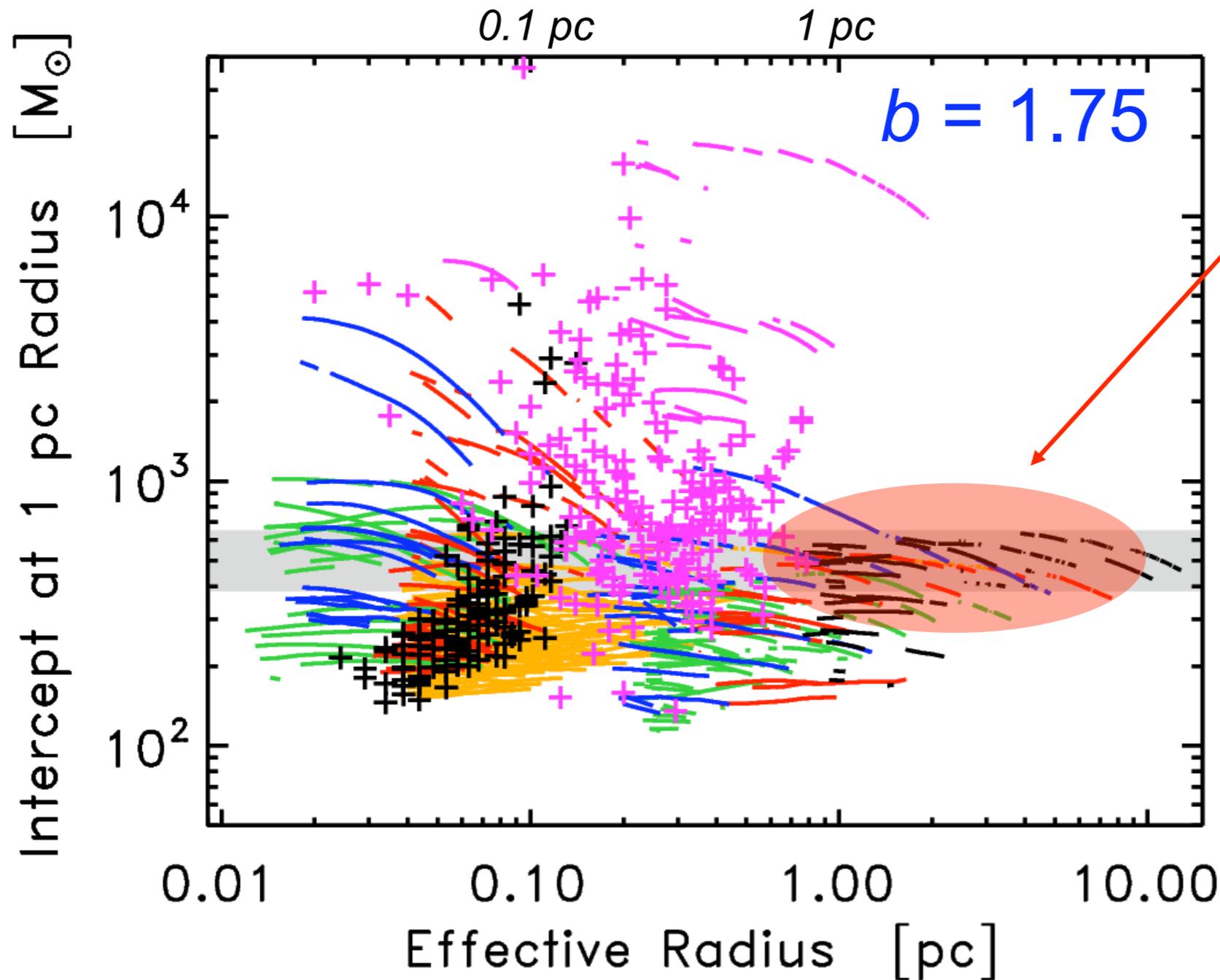
$$m = m_0 (r / r_0)^b$$

Jens Kauffmann (in prep.)

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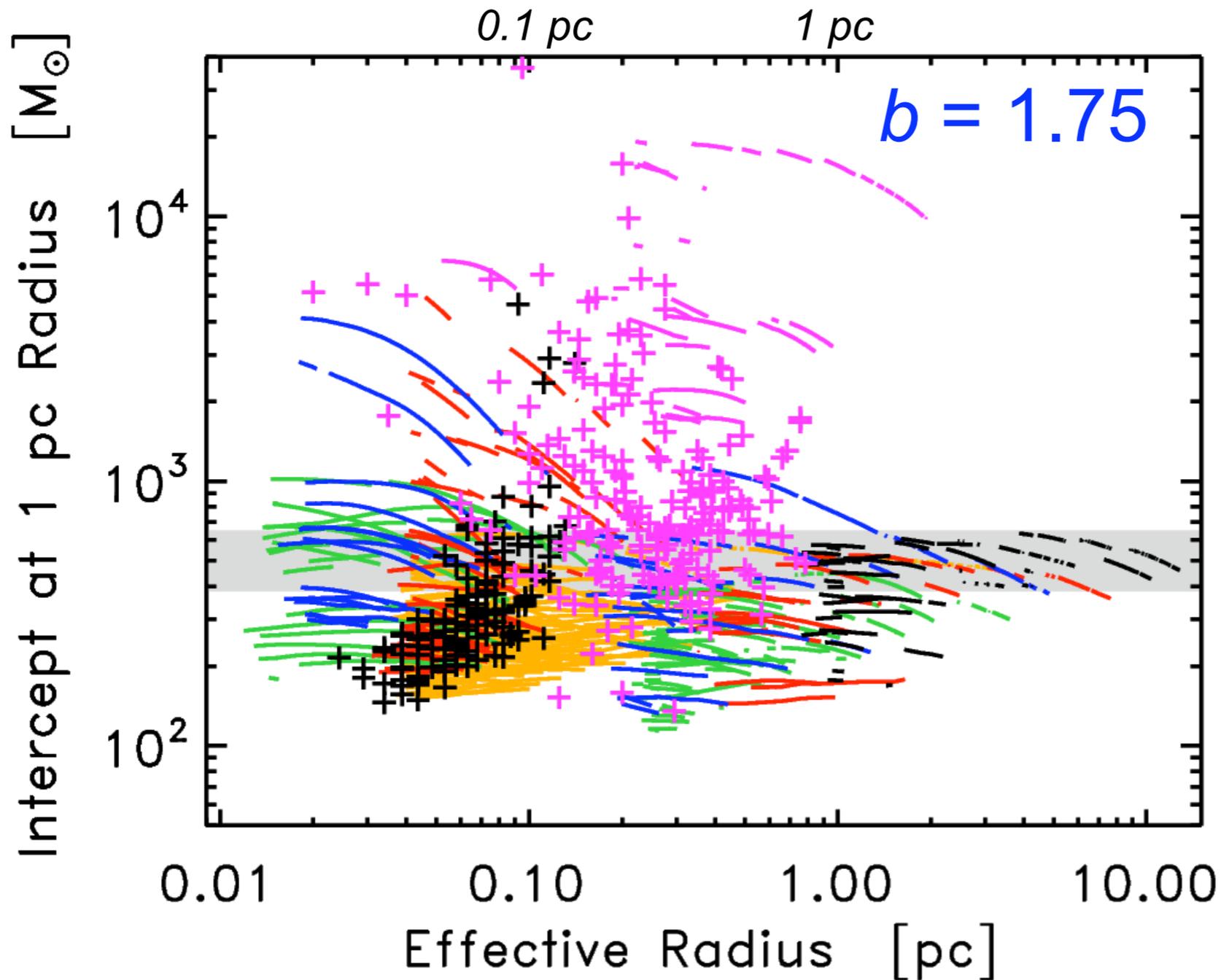
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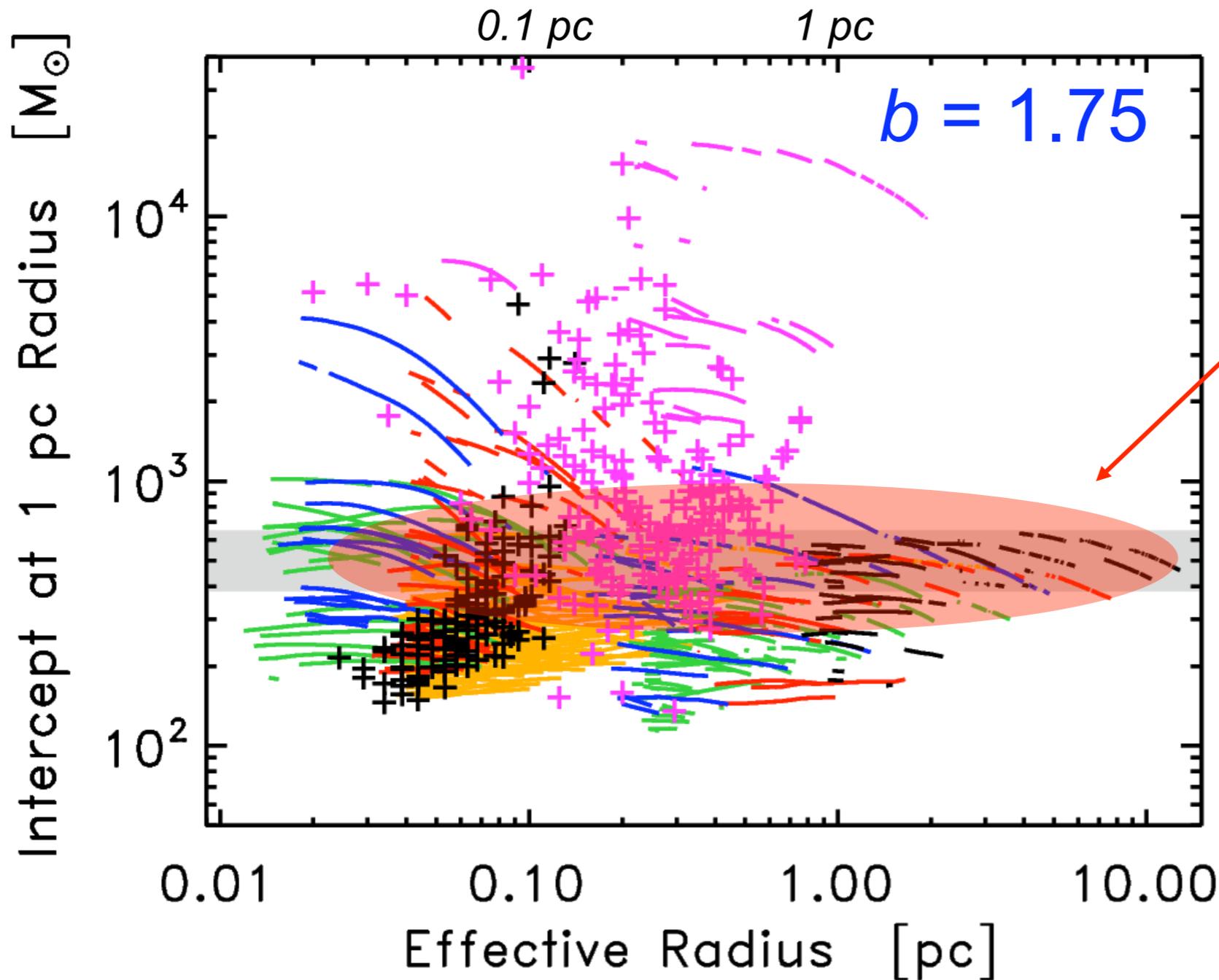
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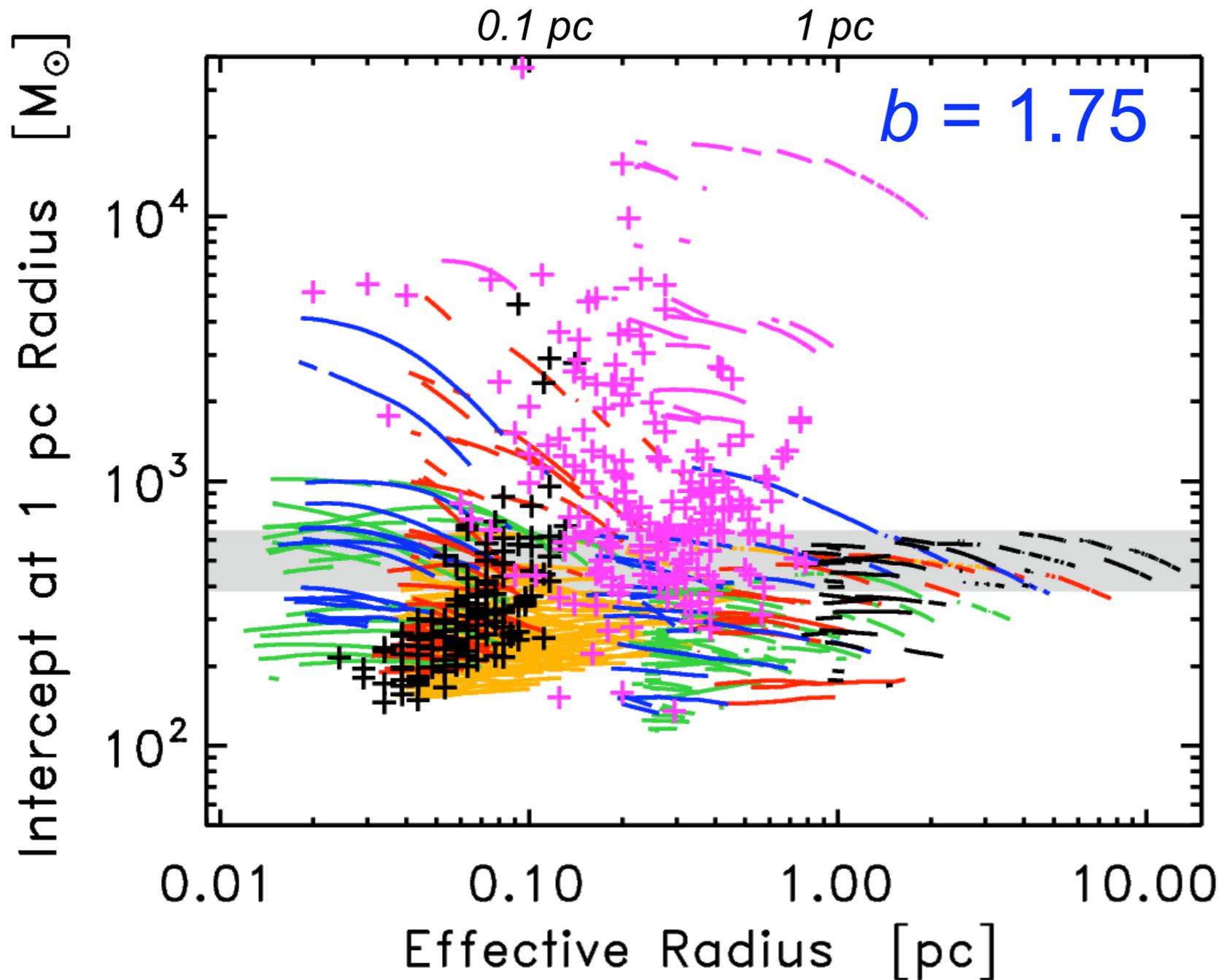
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Jens Kauffmann (in prep.)

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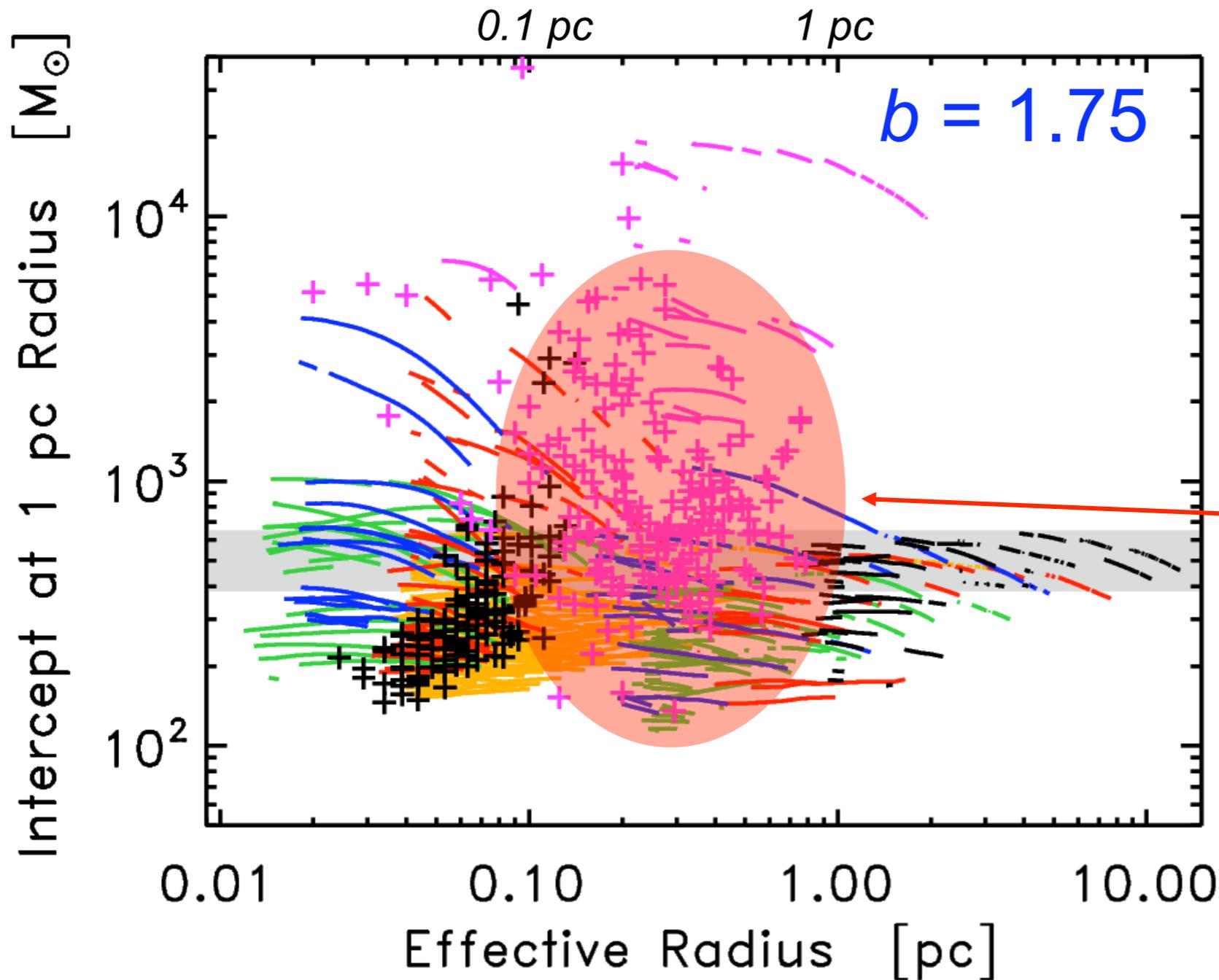
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radius range and slope reflect cloud physics

$$m = m_0 (r / r_0)^b$$

Jens Kauffmann (in prep.)