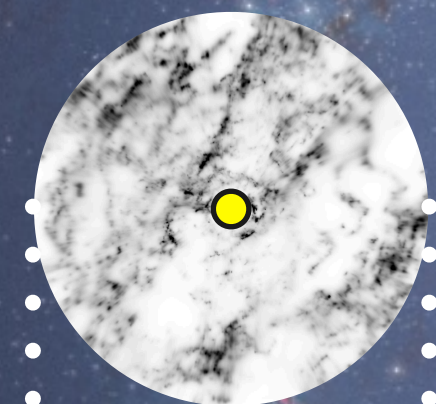
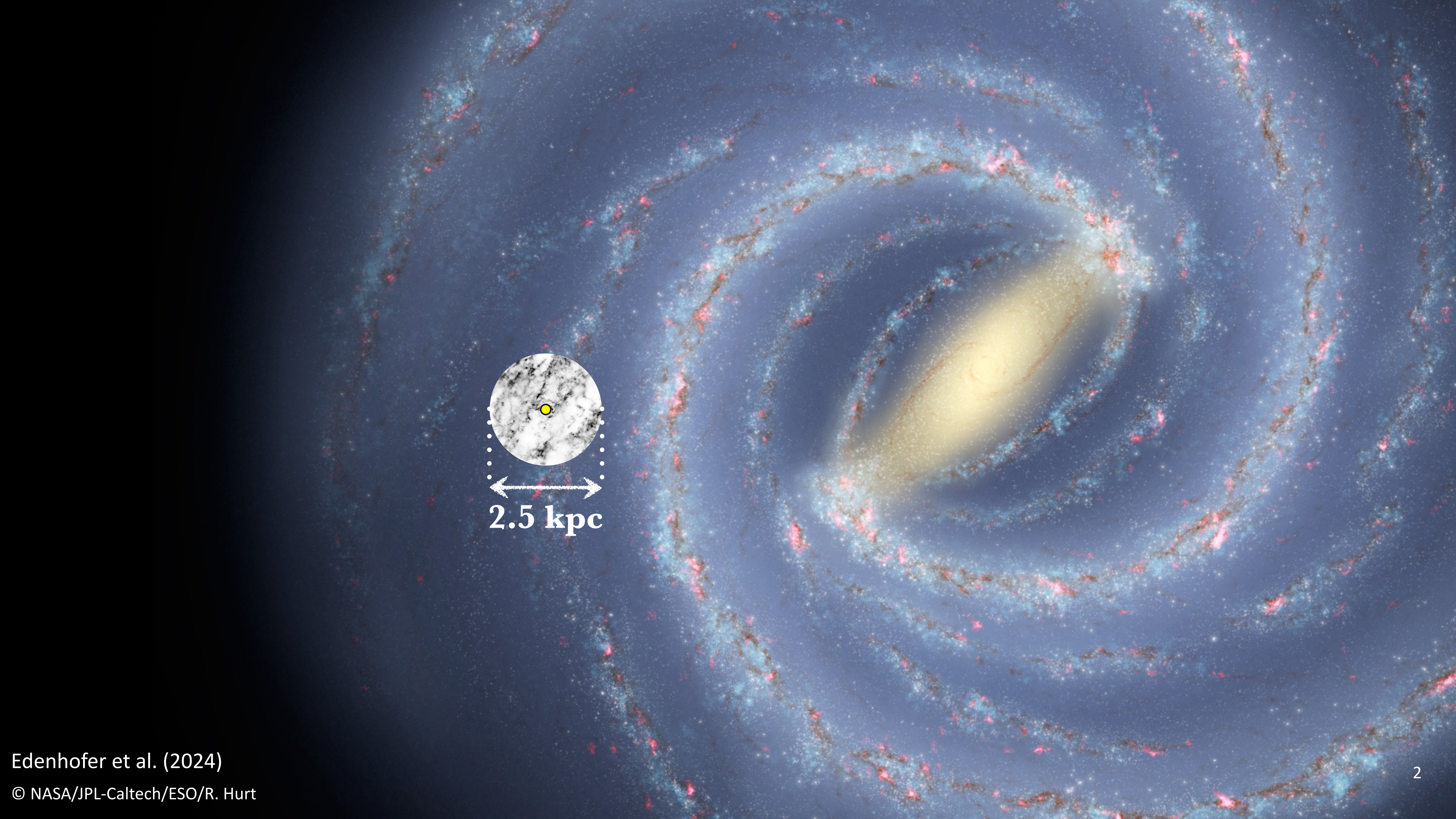


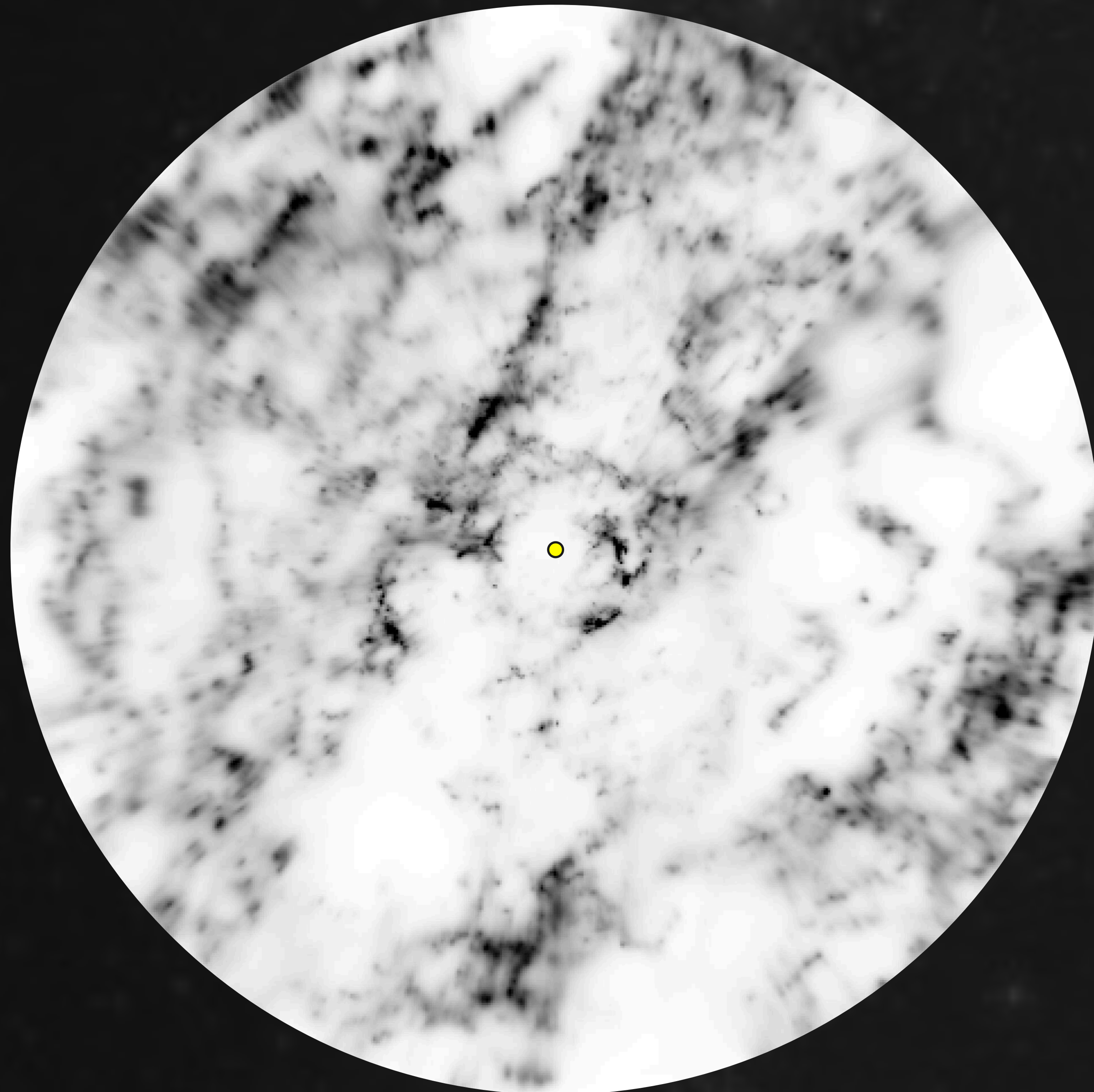
Propagating Star Formation in Sco-Cen

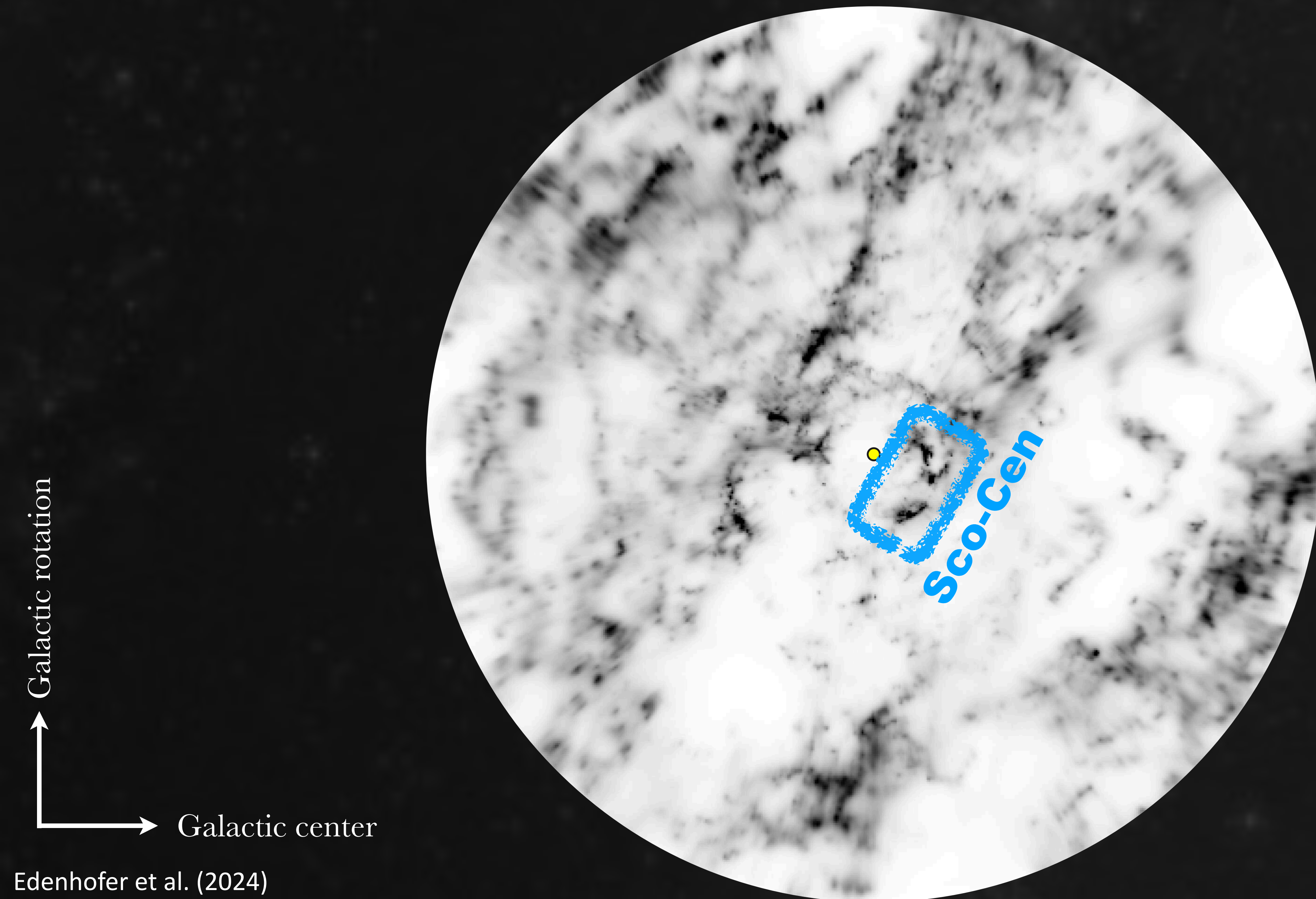
Cluster Chains as Tracers of Stellar Feedback



2.5 kpc

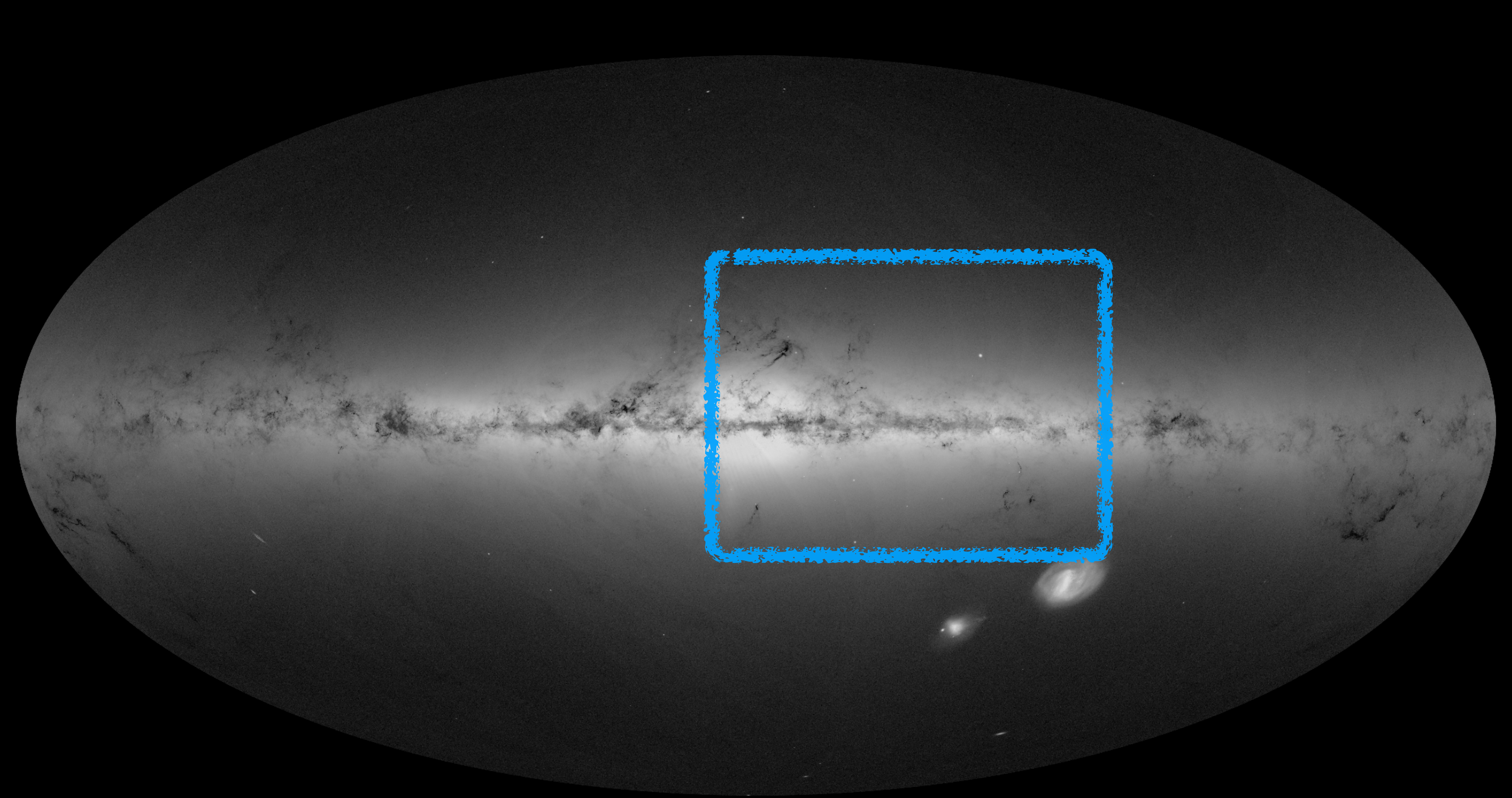
Galactic rotation
Galactic center

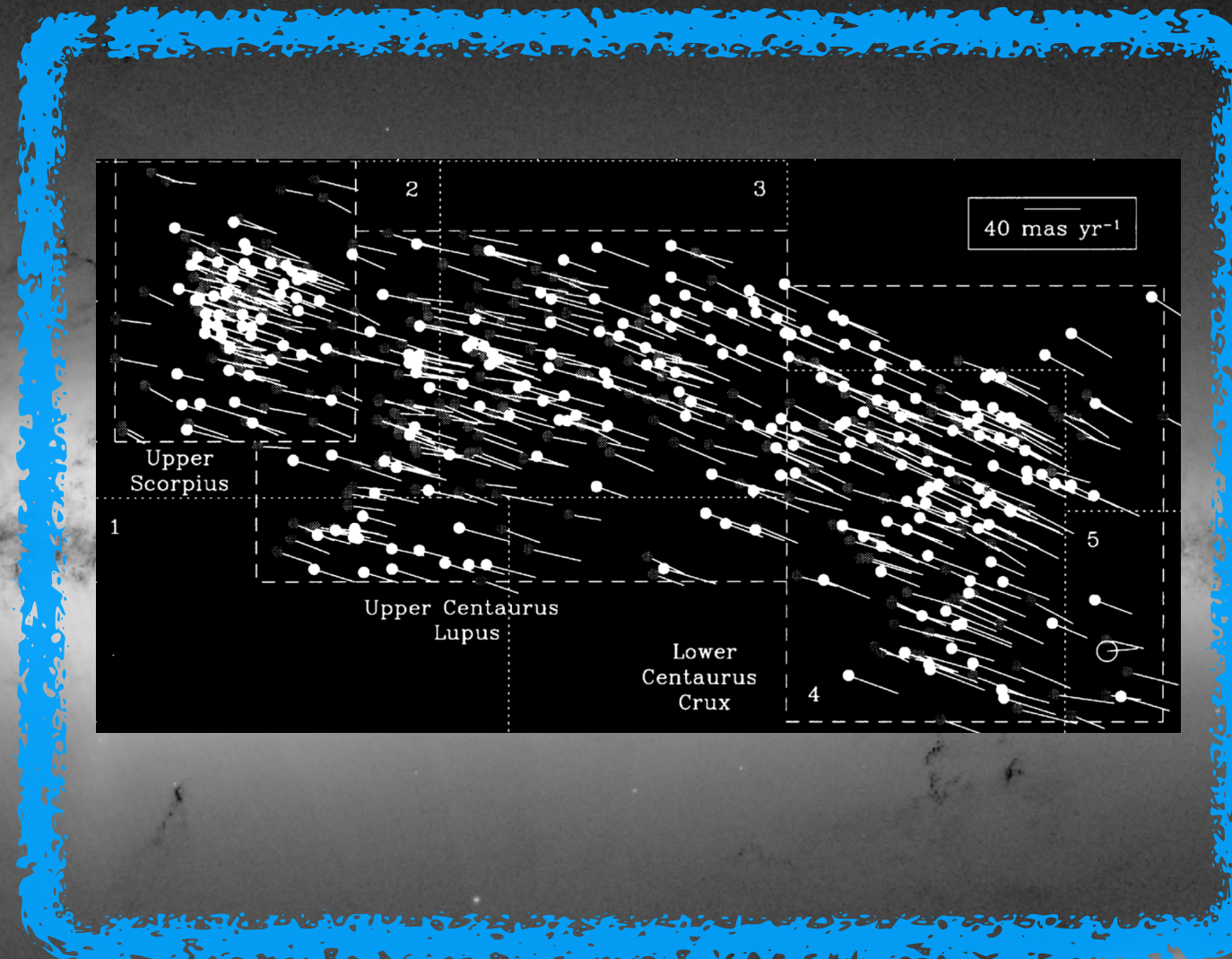
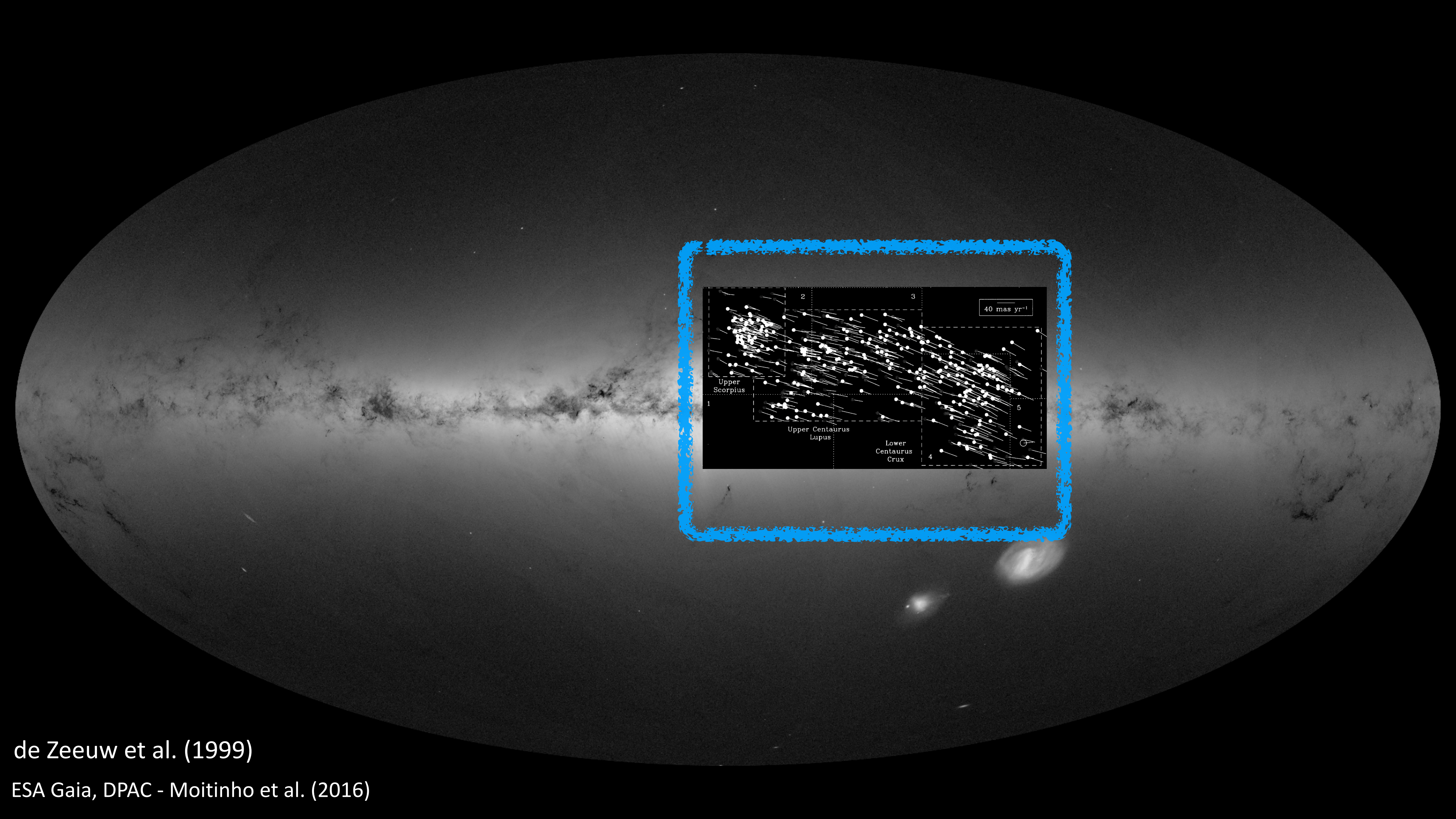




Edenhofer et al. (2024)

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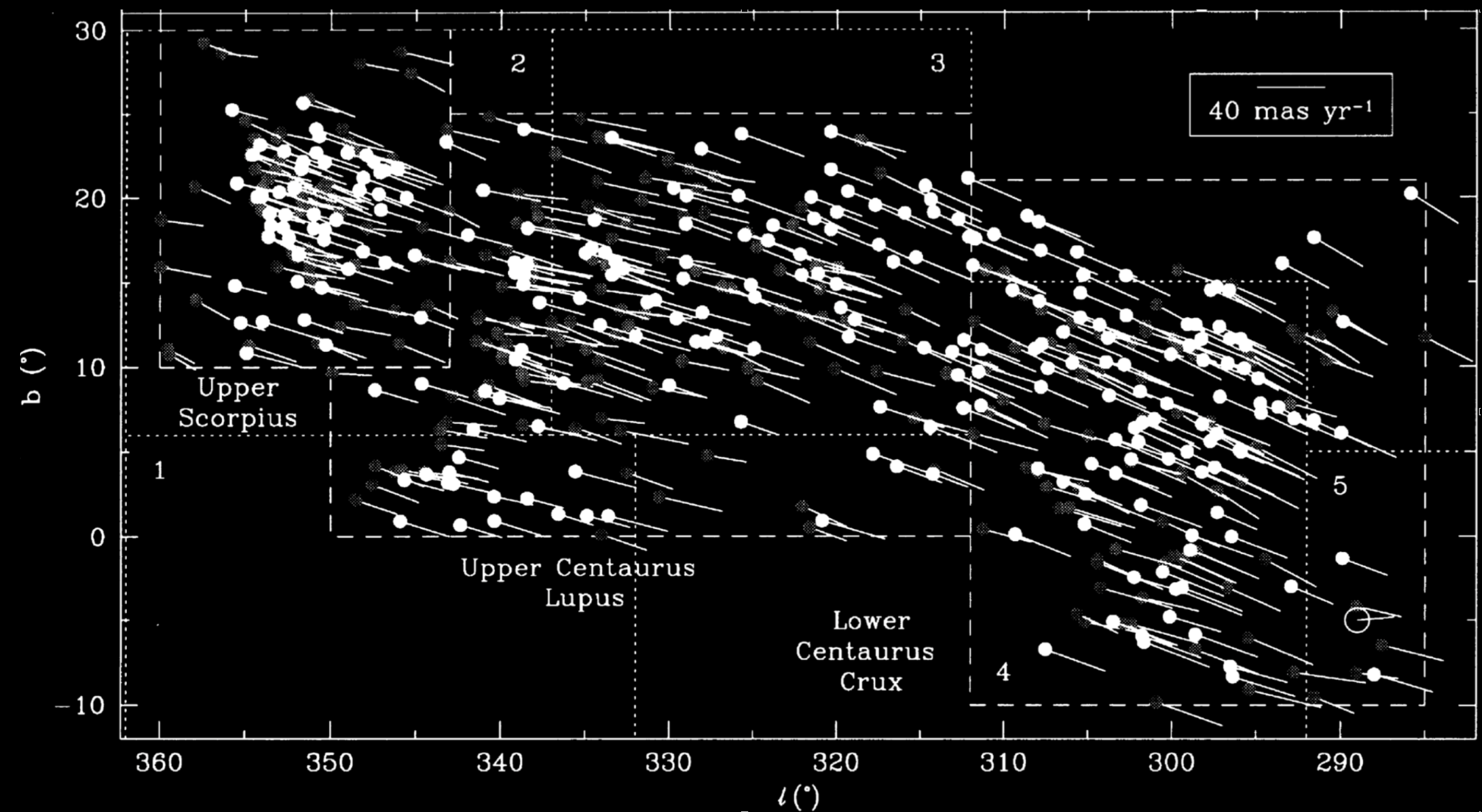
de Zeeuw et al. (1999)

ESA Gaia, DPAC - Moitinho et al. (2016)

Sco-Cen OB association

Nearest large young star laboratory

- Covers ages 1–20 Myr
- Covers mass spectrum from OB → substellar objects
- Lab for star & planet formation, and cluster evolution
e.g., Preibisch & Mamajek (2008)
- Interaction between the association and ISM
e.g., de Geus (1992)



de Zeeuw et al. (1999)

Open questions

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- Does star formation leave discernible spatio-temporal patterns, or is it a stochastic process via e.g. self-instability?

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- What are time scales associated with molecular cloud formation, star formation, and cloud dispersal and what drives their disruption?

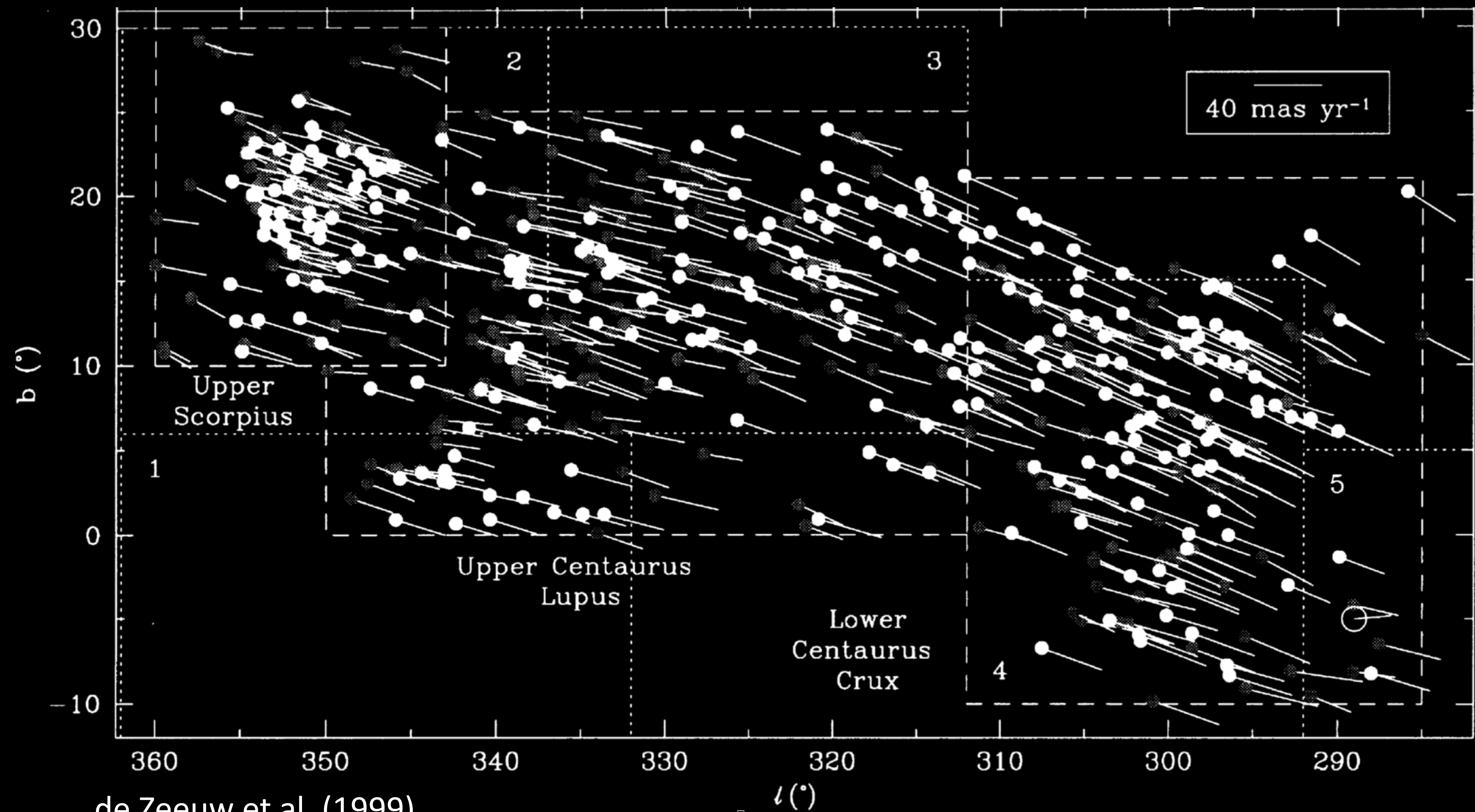
Open questions

- Does star formation leave discernible spatio-temporal patterns, or is it a stochastic process via e.g. self-instability?
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- What role does stellar feedback from massive stars (e.g., SN, winds) play in subsequent star formation?

Open questions

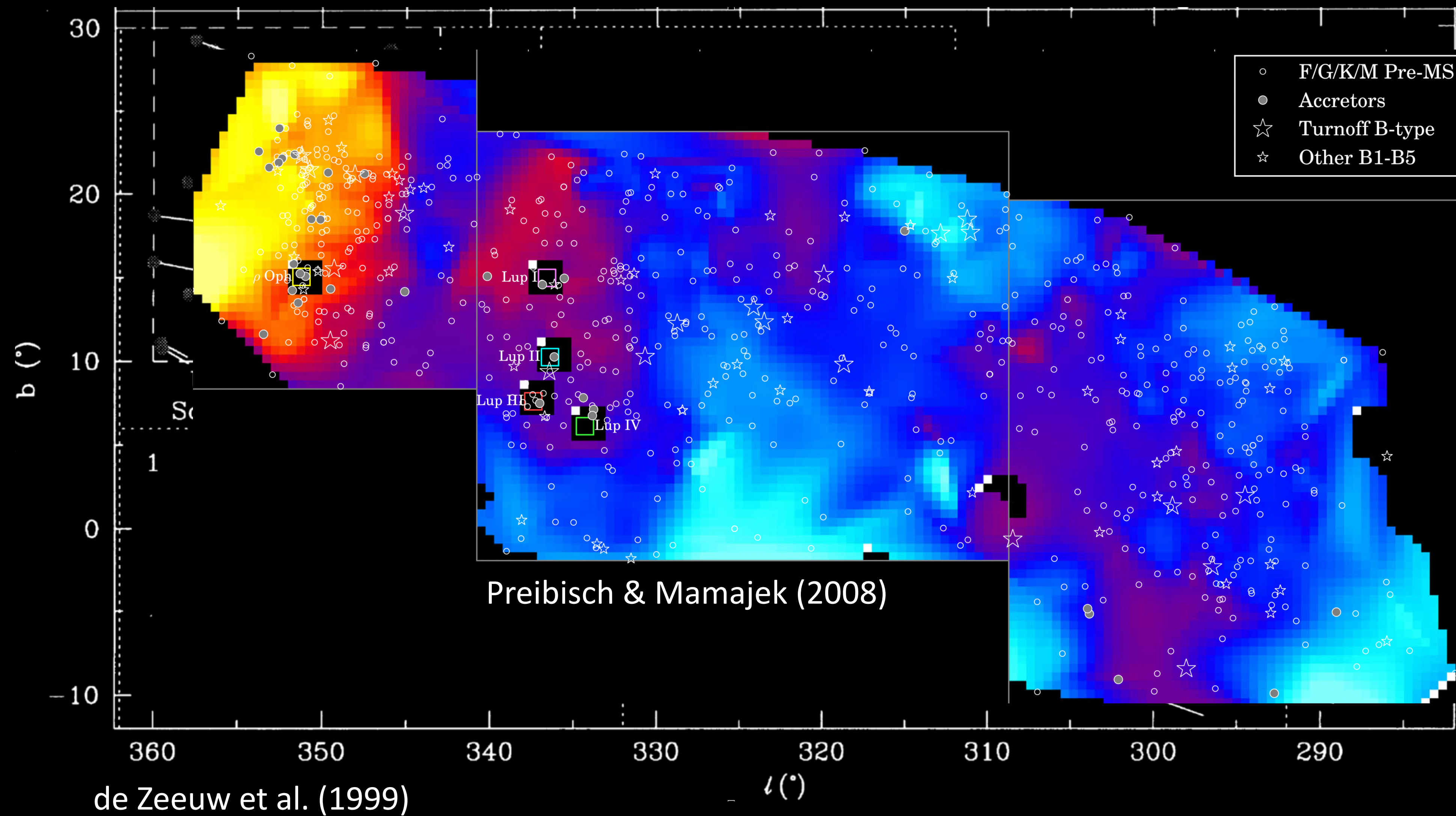
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- What role does stellar feedback from massive stars (e.g., SN, winds) play in subsequent star formation?
- What fraction of stars in OB associations can be directly attributed to feedback-triggered star formation events?

Sco-Cen: star formation history



de Zeeuw et al. (1999)

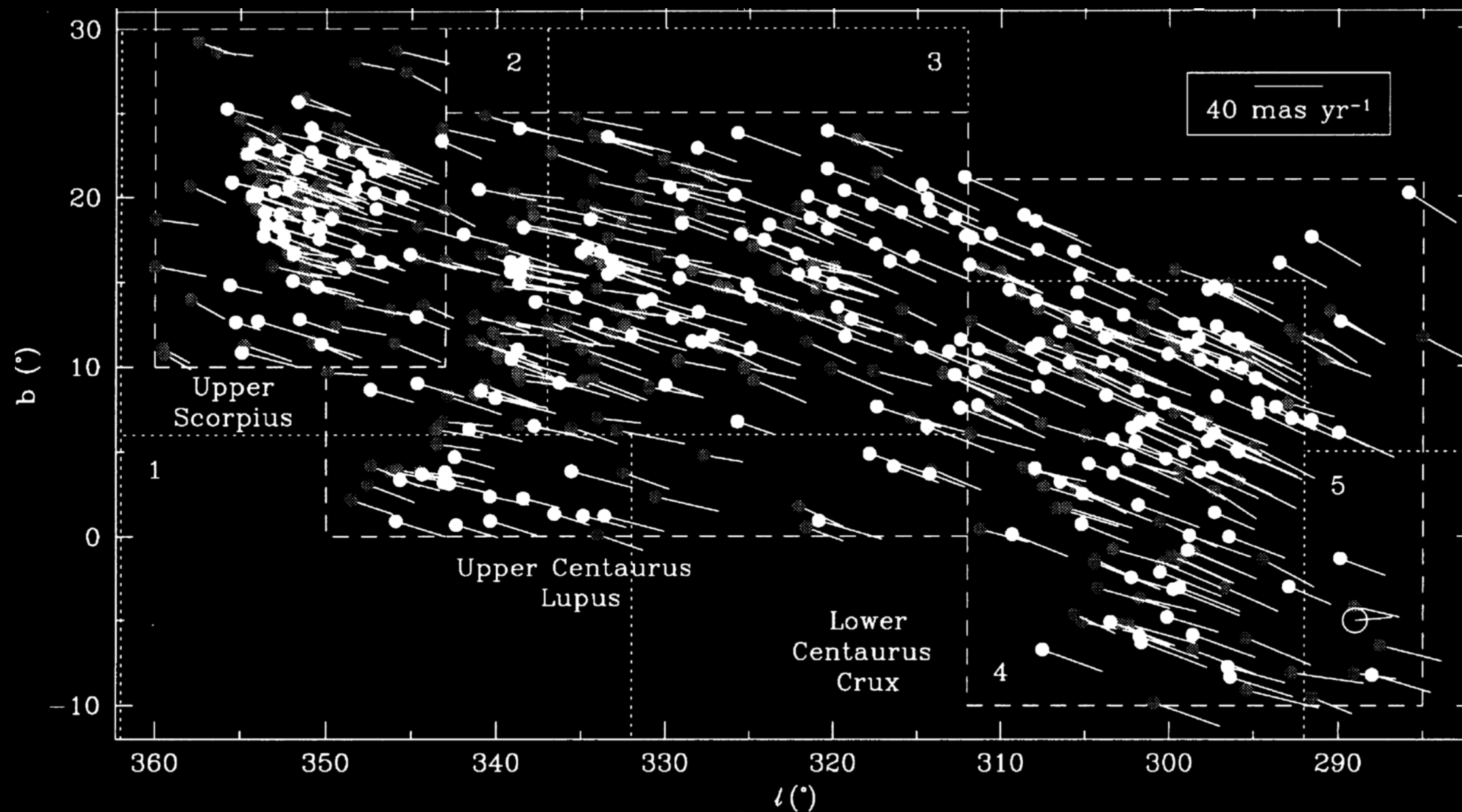
Sco-Cen: star formation history



Sco-Cen since Gaia DR2

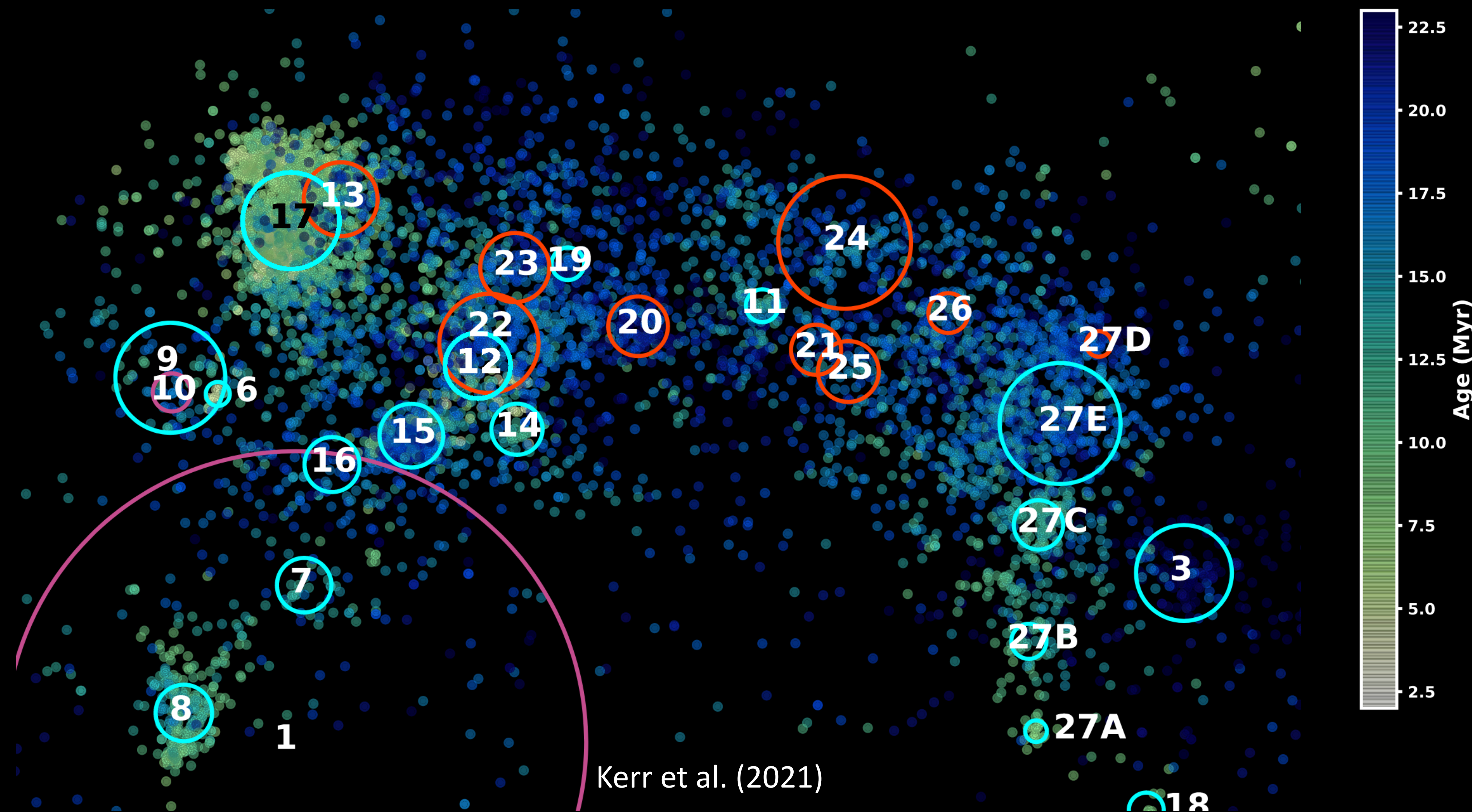
Reference	Sect.	Data	Studied area
Damiani et al. (2019) ^(e)	5.2.1	DR2	($l = 360^\circ$ to 280° , $b = 0^\circ$ to 30°) OR ($l = 315^\circ$ to 280° , $b = -10^\circ$ to 0°) FOV = 2750 deg^2 , $d < 200 \text{ pc}$
Kerr et al. (2021) ^(f)	5.2.2	DR2	The whole TLC22 stellar group TLC22 without EOM 1–5 22 EOMs of TLC22 (without EOM 1–5)
Schmitt et al. (2022) ^(g)	5.2.3	EDR3 and eROSITA	de Zeeuw et al. (1999) borders: US ($l = 343^\circ$ to 360° , $b = 10^\circ$ to 30°) OR UCL ($l = 312^\circ$ to 350° , $b = 0^\circ$ to 25°) OR LCC ($l = 285^\circ$ to 312° , $b = -10^\circ$ to 22°), FOV = 2050 deg^2 , $d \sim 60\text{--}200 \text{ pc}$
Luhman (2022)	5.2.4	EDR3	$l = 2^\circ$ to 285° , $b = -12^\circ$ to 35° , FOV = 3252 deg^2 , $d \sim 90\text{--}250 \text{ pc}$
Žerjal et al. (2023)	5.2.5	DR2	$l = 40^\circ$ to 240° , $b = -60^\circ$ to 70° , FOV = $36\,400 \text{ deg}^2$, $d \sim 83\text{--}200 \text{ pc}$
Squicciarini et al. (2021) ^(h) (only US, subsample with RVs)	5.2.6	EDR3	$\alpha = 236^\circ$ to 251° , $\delta = -29^\circ$ to -16° FOV = 195 deg^2 , $d \sim 125\text{--}175 \text{ pc}$
Miret-Roig et al. (2022a) ⁽ⁱ⁾ (only US, subsample with RVs)	5.2.7	DR3	$\alpha = 235^\circ$ to 252° , $\delta = -30^\circ$ to -17° FOV = 221 deg^2 , $d \sim 80\text{--}200 \text{ pc}$
Briceño-Morales & Chanamé (2023) ^(j) (only US, subsample with RVs)	5.2.8	EDR3	$l = 343^\circ$ to 360° , $b = 10^\circ$ to 30° FOV = 340 deg^2 , $d < 200 \text{ pc}$

Post Gaia star formation history



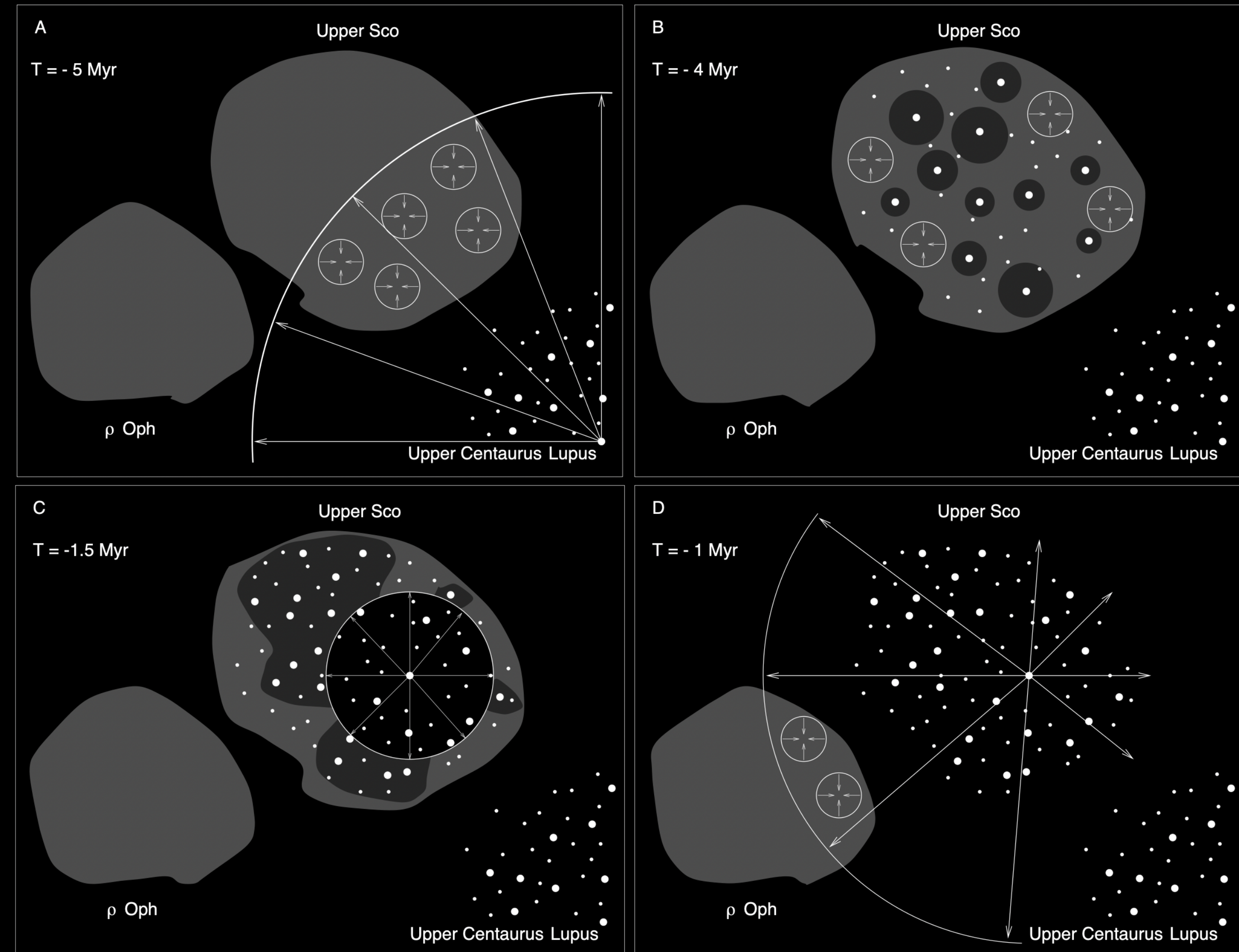
de Zeeuw et al. (1999)

Post Gaia star formation history



Open questions

- “*Star formation histories of associations [...] so far have failed to reveal simple patterns of star formation propagation (e.g., triggering)*”
Wright et al (2022)

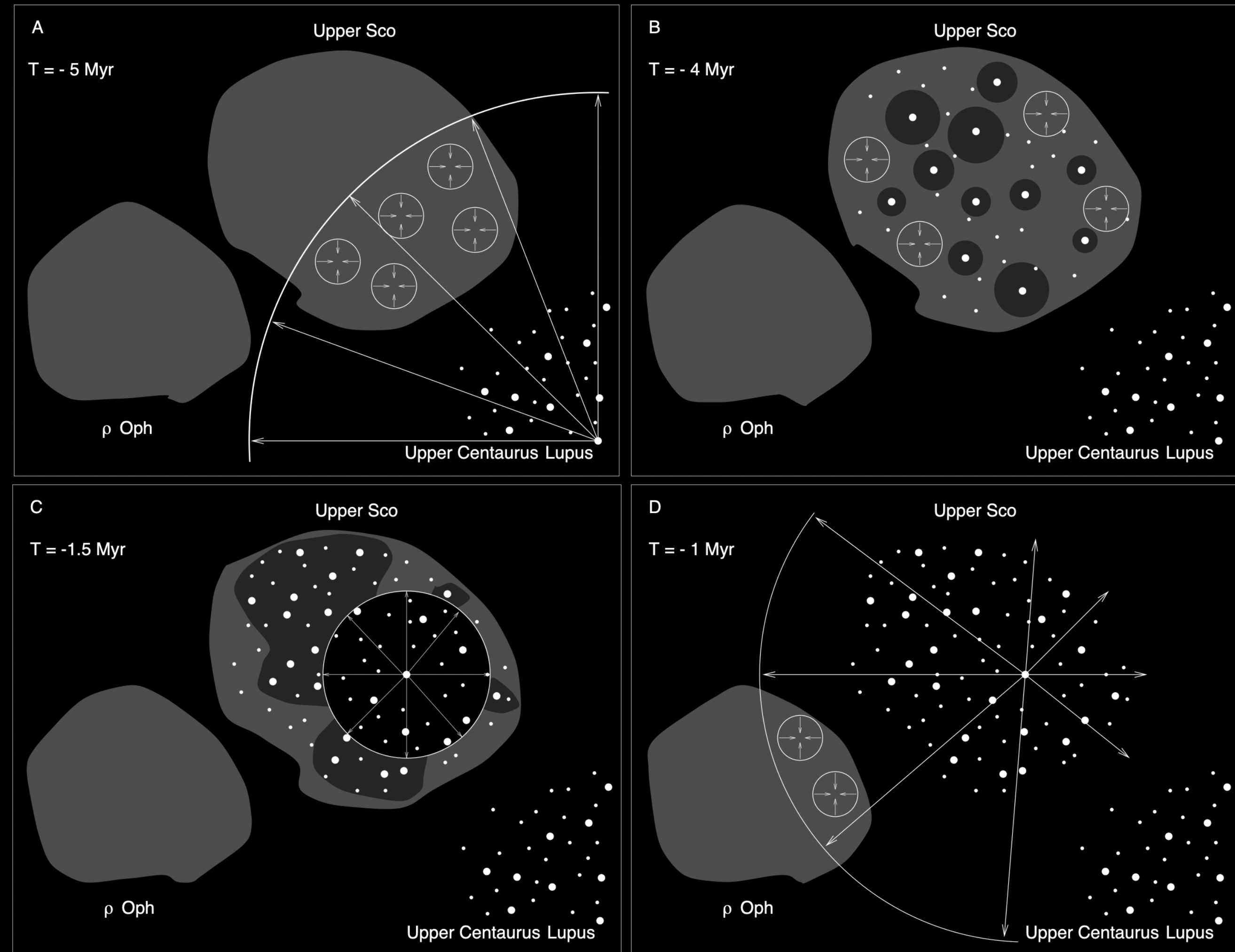


Preibisch & Mamajek (2008)

Open questions

- “*Star formation histories of associations [...] so far have failed to reveal simple patterns of star formation propagation (e.g., triggering)*”
Wright et al (2022)

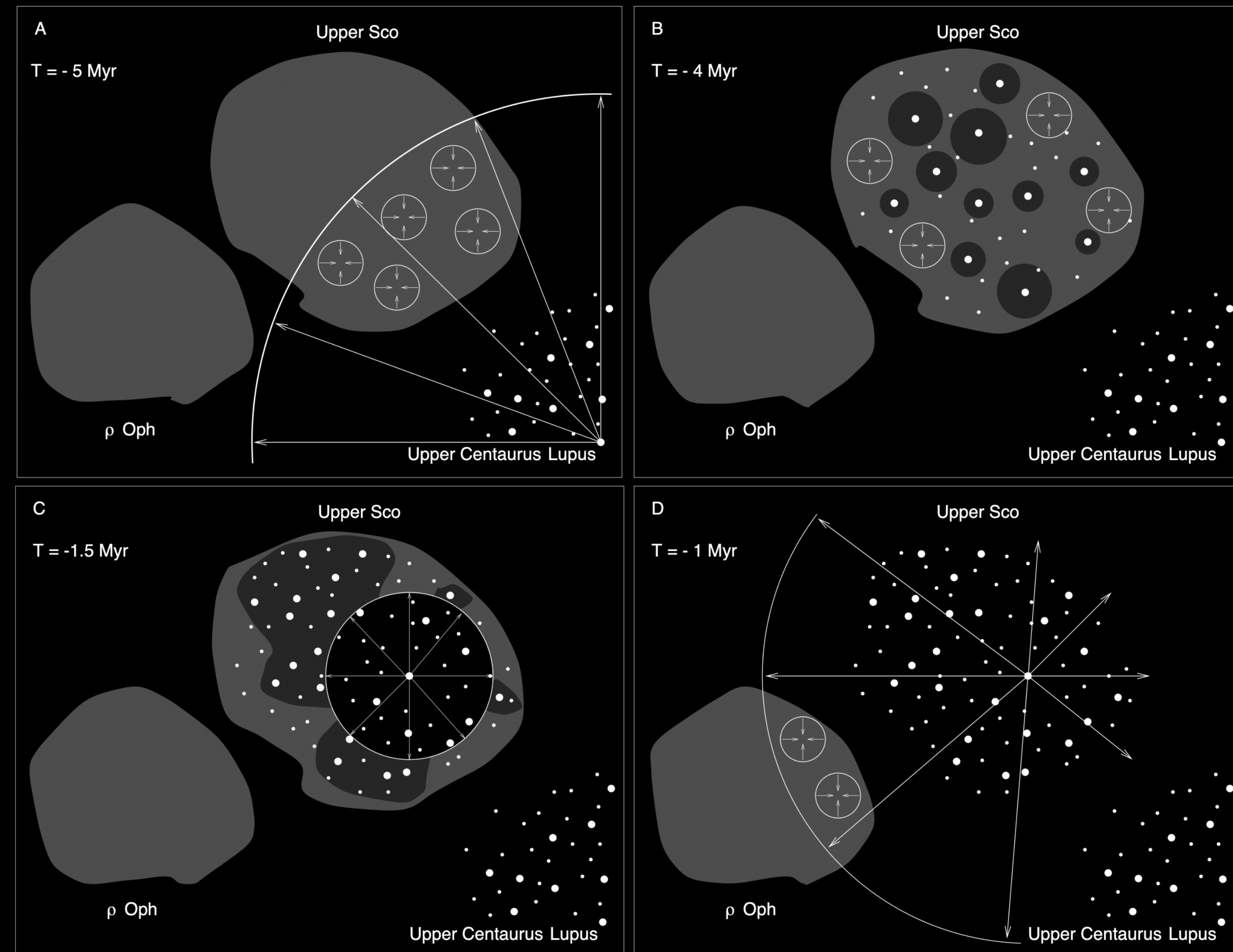
- ▶ Stellar associations quickly disperse — low density



Preibisch & Mamajek (2008)

Open questions

- “*Star formation histories of associations [...] so far have failed to reveal simple patterns of star formation propagation (e.g., triggering)*”
Wright et al (2022)
 - ▶ Stellar associations quickly disperse — low density
 - ▶ Formed from same molecular cloud complex — velocities & age differences small



Preibisch & Mamajek (2008)

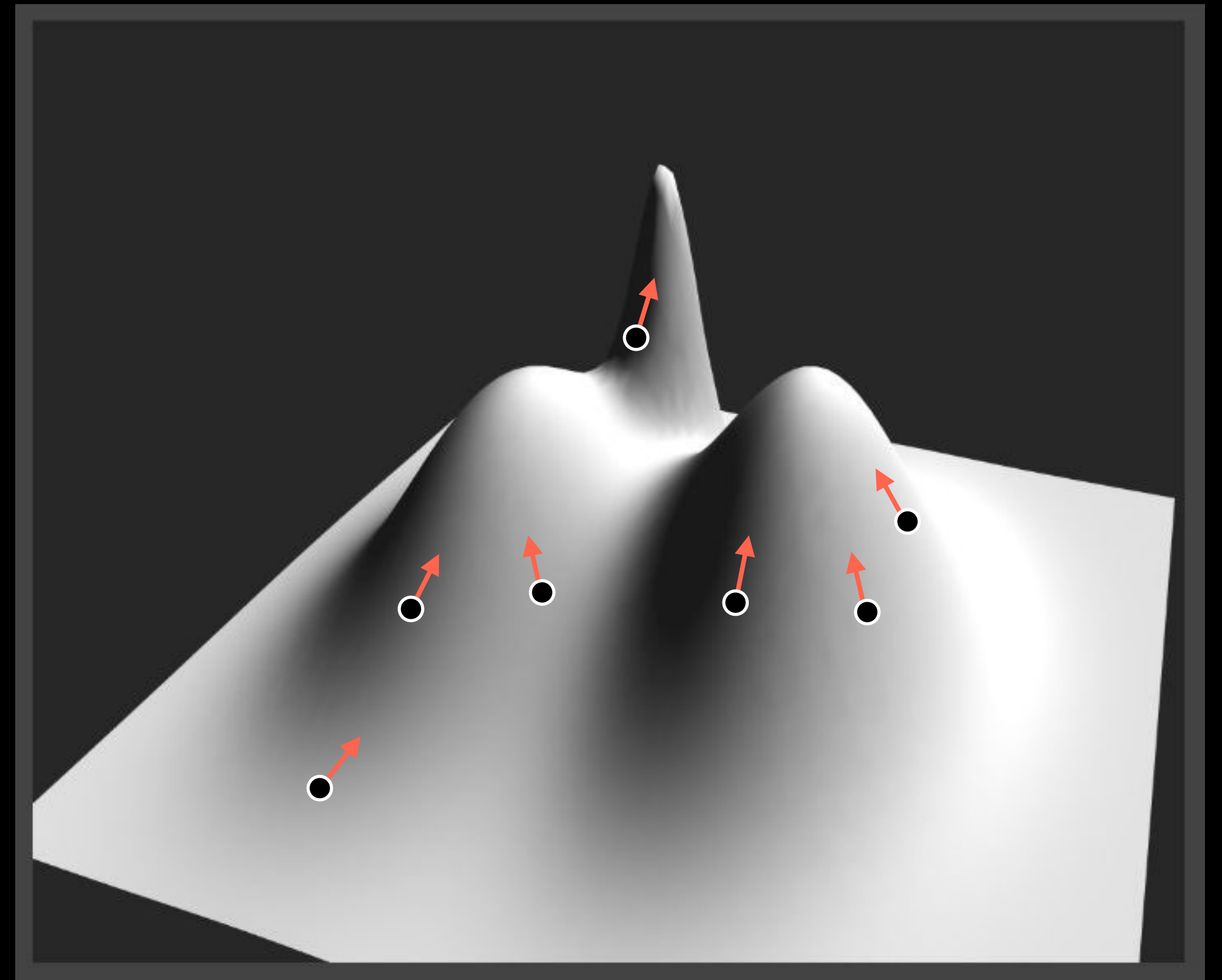
Goal: Apply *SigMA*

Recap: Density based clustering

Nonparametric, density-based clustering

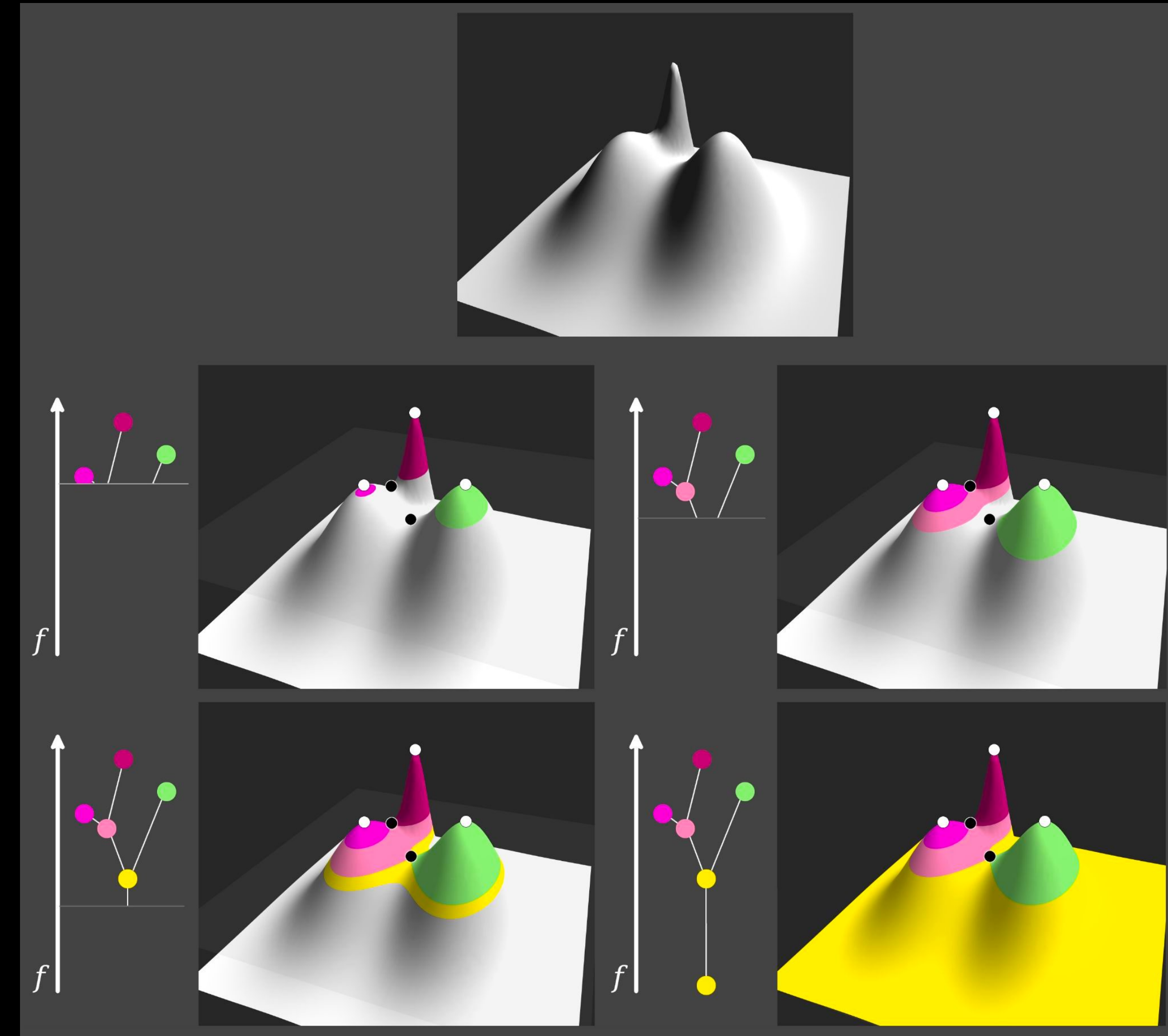
Problem definition

- **Wishart (1969) cluster definition**
 - \mathbf{x}_i associated with modes of f
 - Propagate \mathbf{x}_i along ∇f

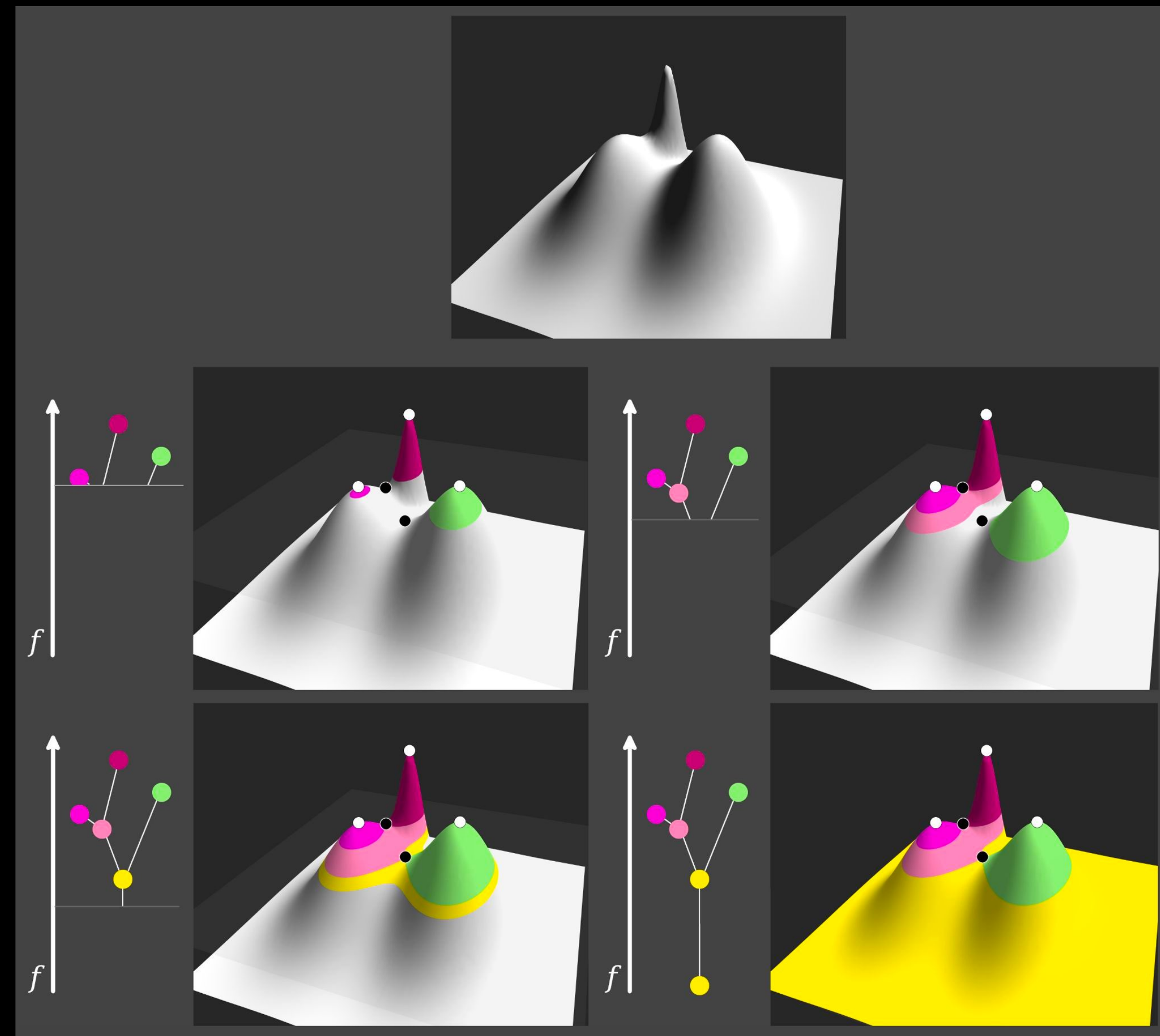


Nonparametric, density-based clustering

- Level set: $L(\lambda) = \{f(\mathbf{x}) \geq \lambda\}$
- **Hartigan (1975) cluster definition**
 - Connected components of $L(\lambda)$
 - Cluster tree: vary $\lambda: \infty \rightarrow -\infty$

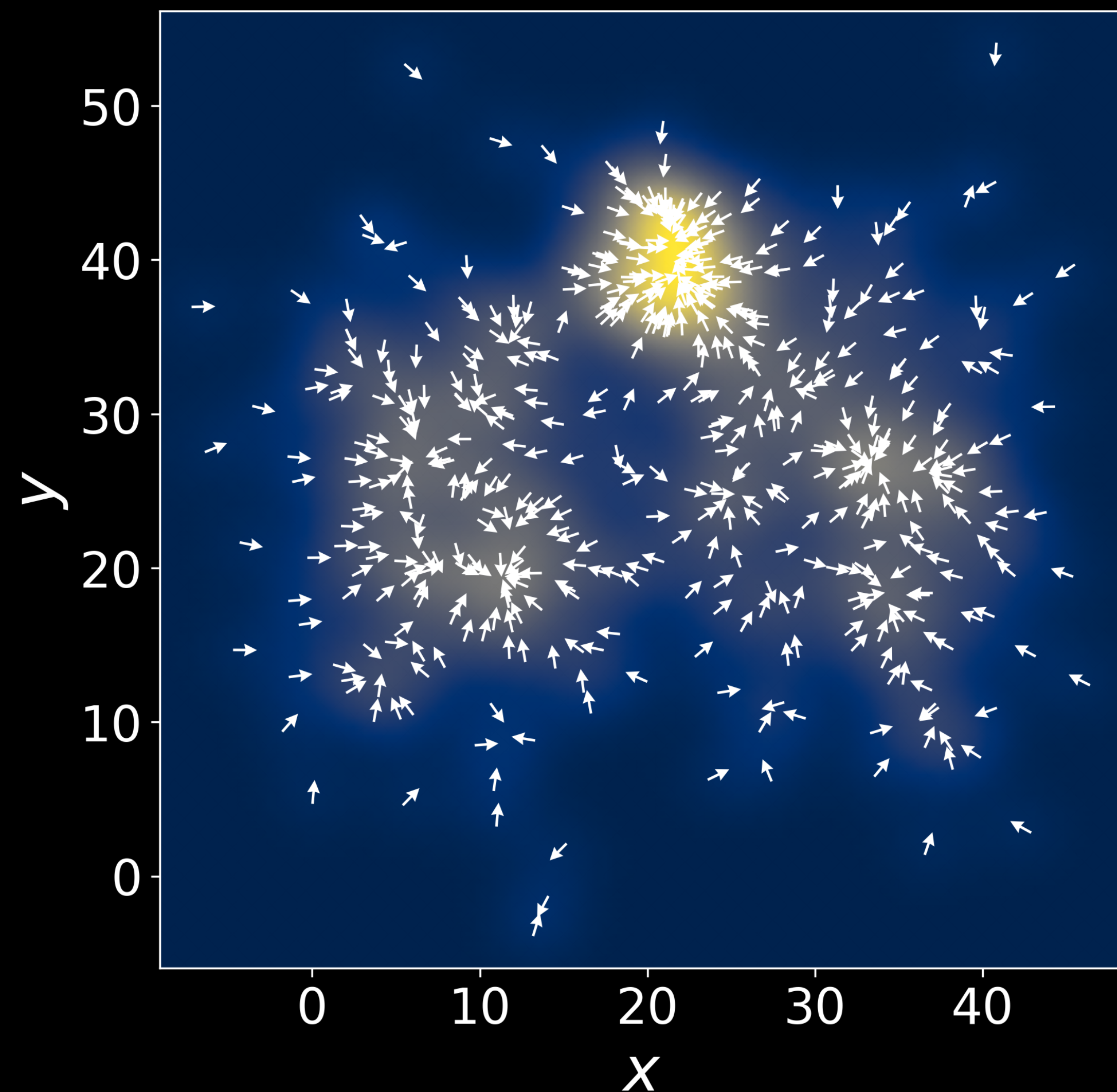
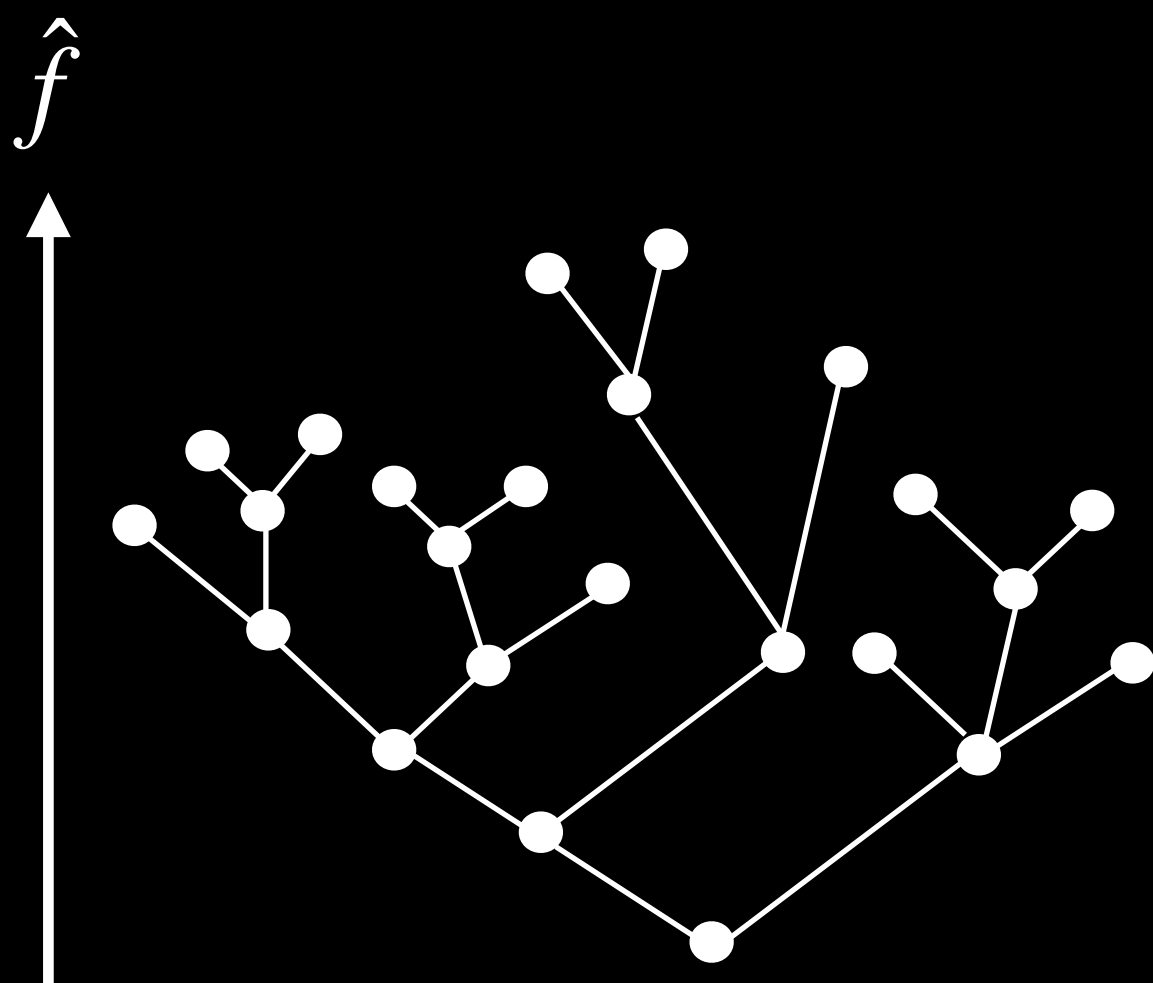


Reality Estimate density from data



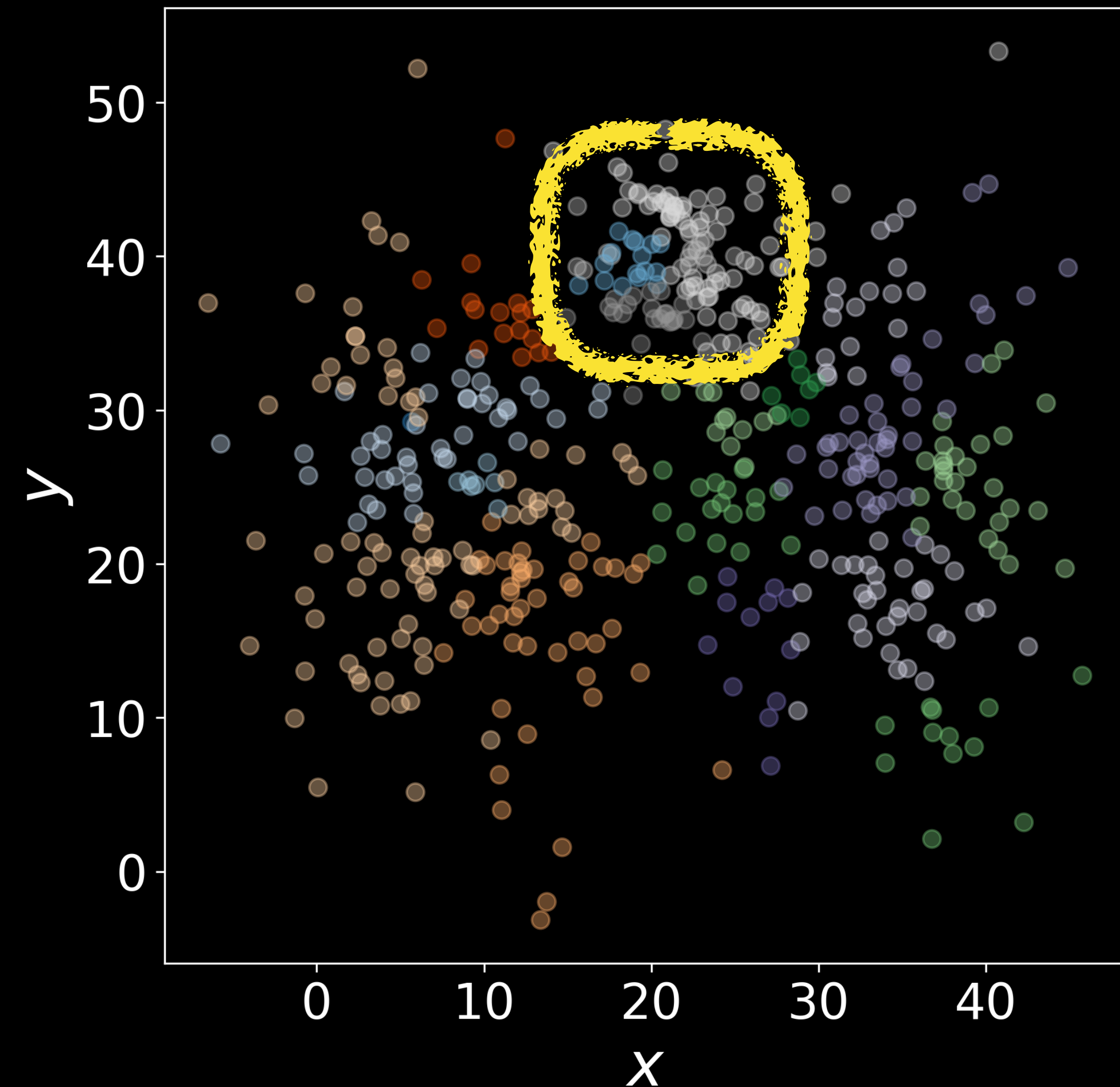
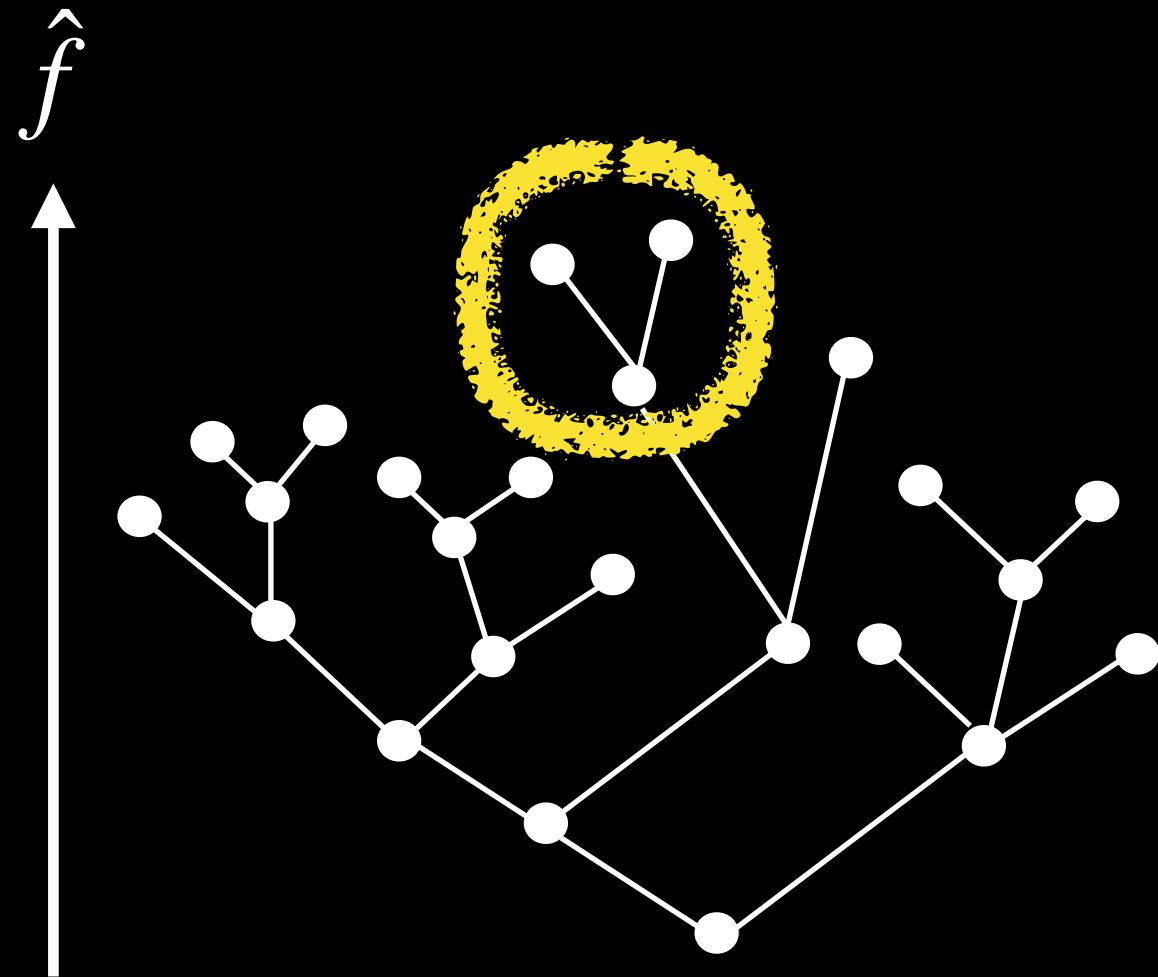
Clustering pipeline: SigMA

1. Gradient ascent step — cluster tree



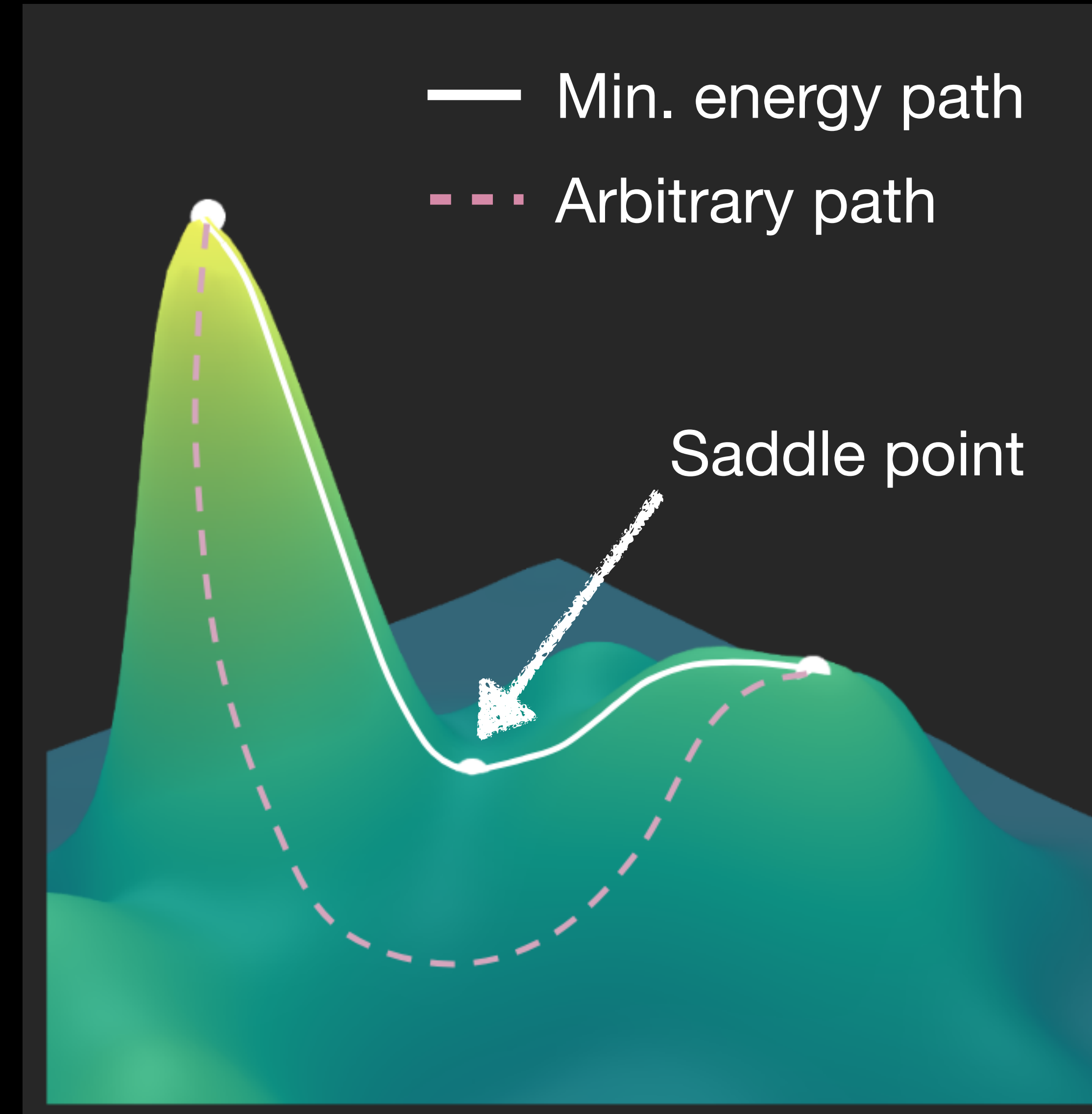
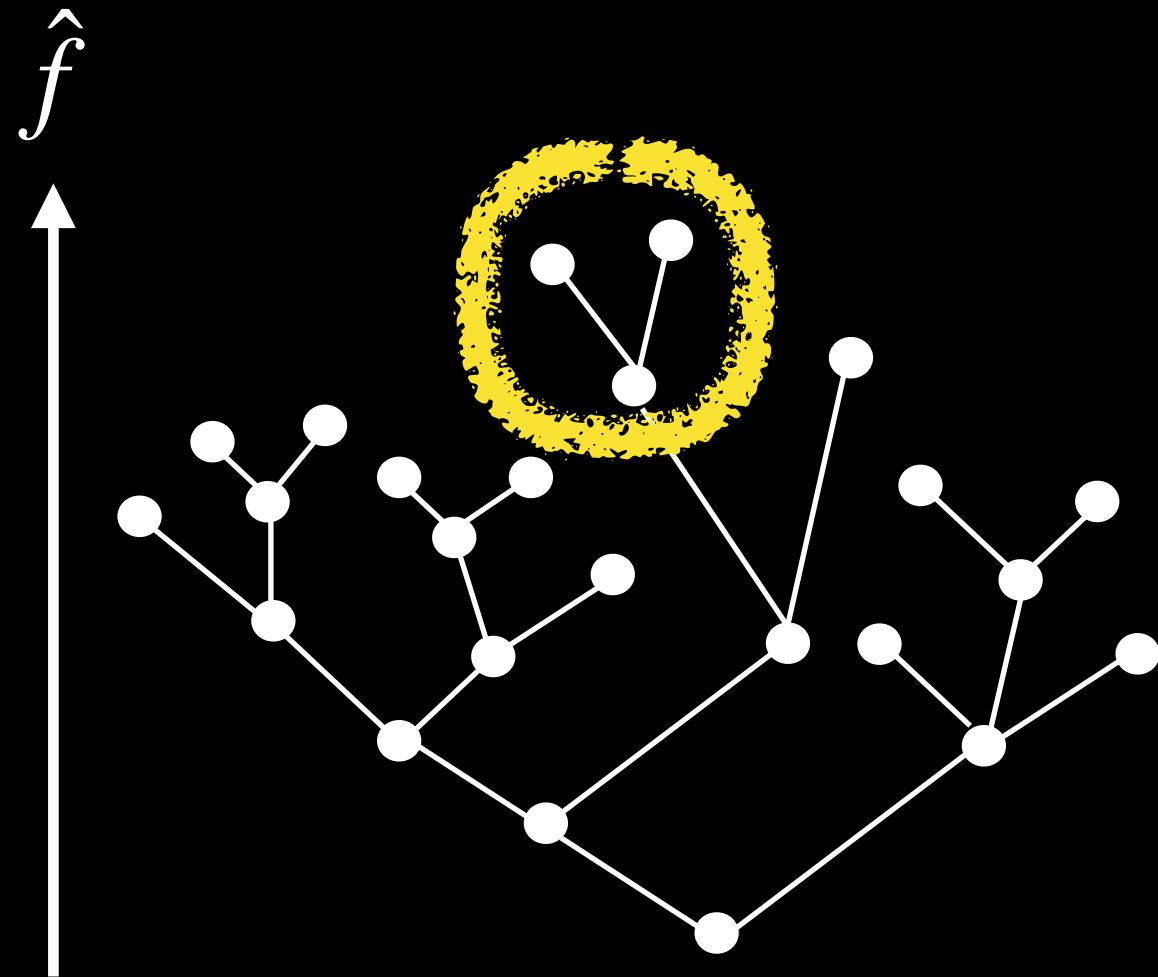
Clustering pipeline: SigMA

1. Gradient ascent step
2. Scan saddle points: $\max \hat{f} \rightarrow \min \hat{f}$



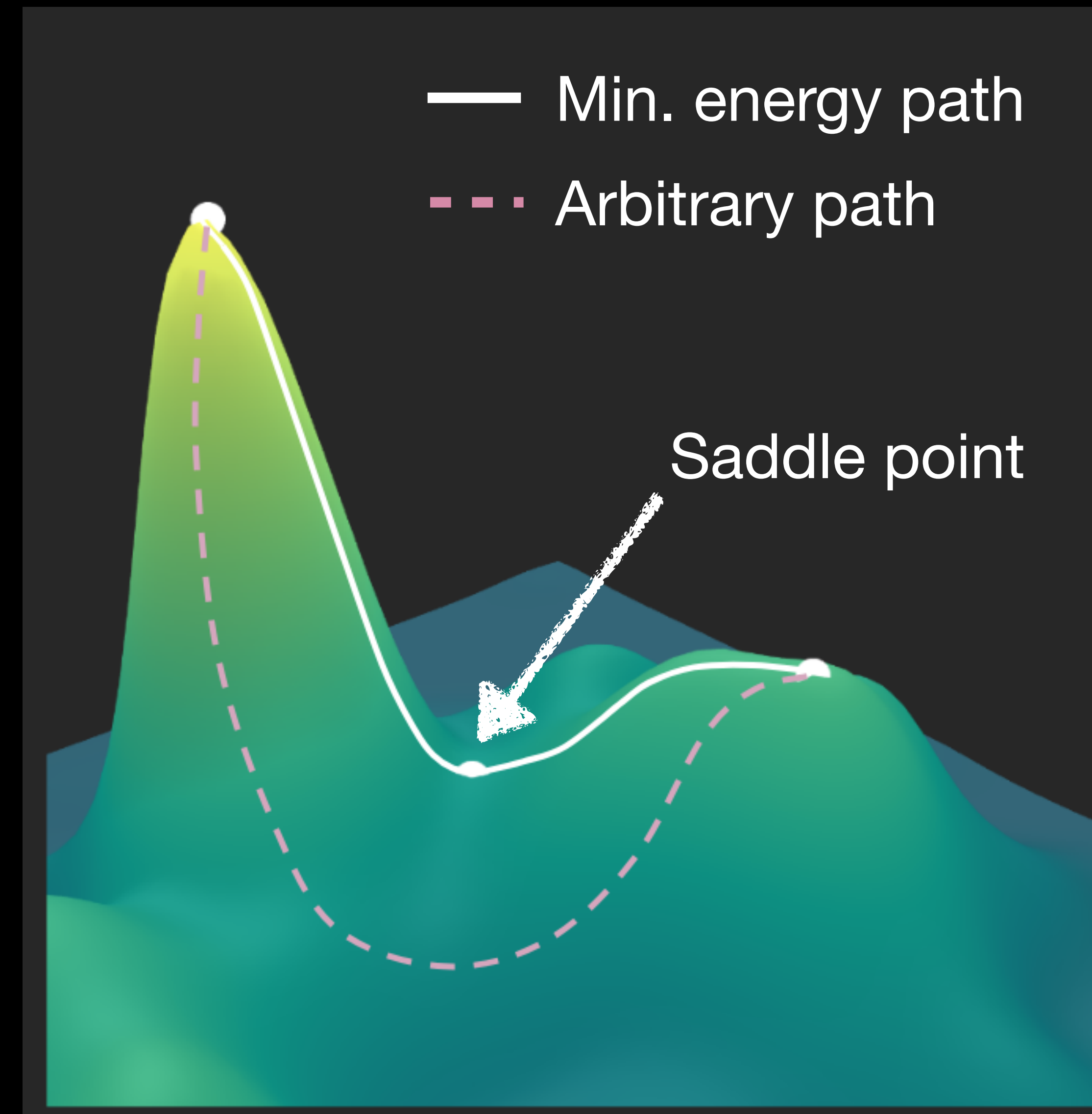
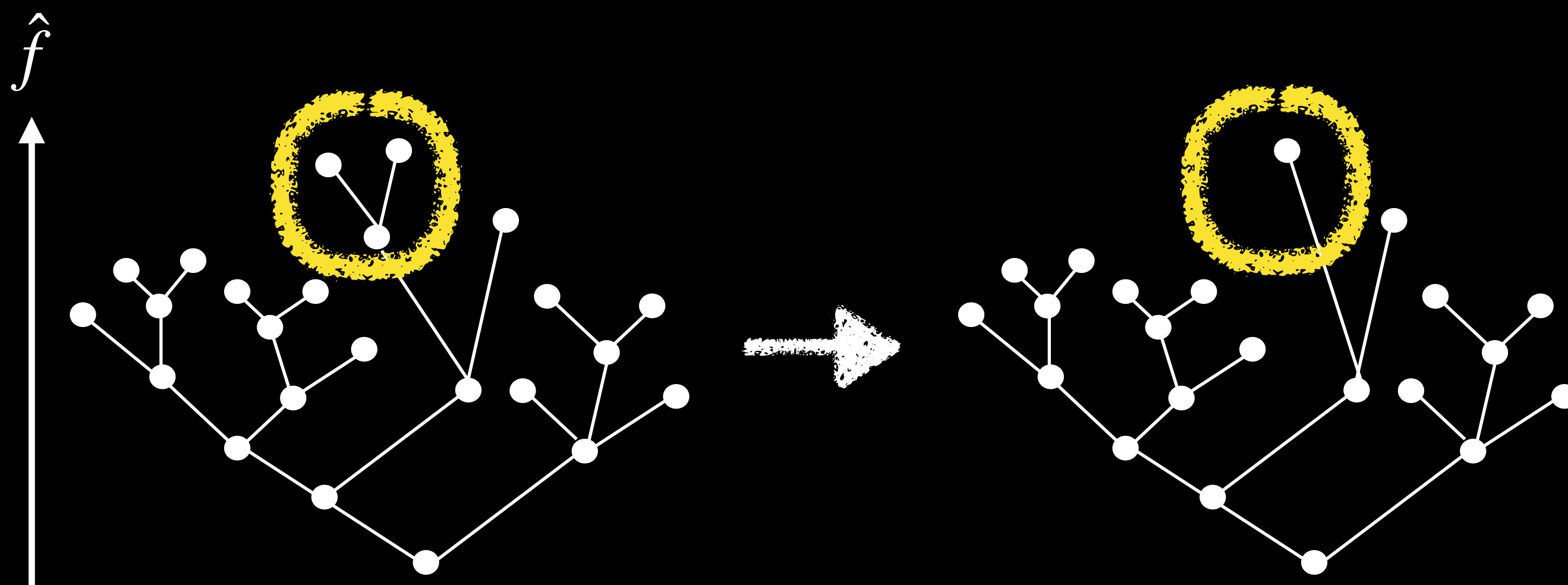
Clustering pipeline: SigMA

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 - A. Test modality between modes



Clustering pipeline: SigMA

1. Gradient ascent step
2. Scan saddle points: $\max \hat{f} \rightarrow \min \hat{f}$
 - A. Test modality between modes
 - B. If H_0 cannot be rejected — merge



Clustering pipeline: SigMA

1. Gradient ascent step

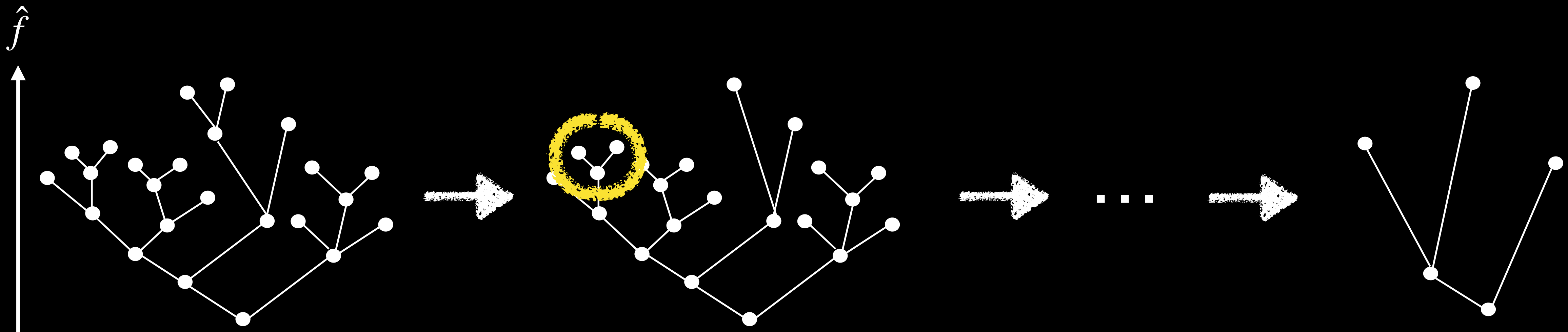
2. Scan saddle points: $\max \hat{f} \rightarrow \min \hat{f}$

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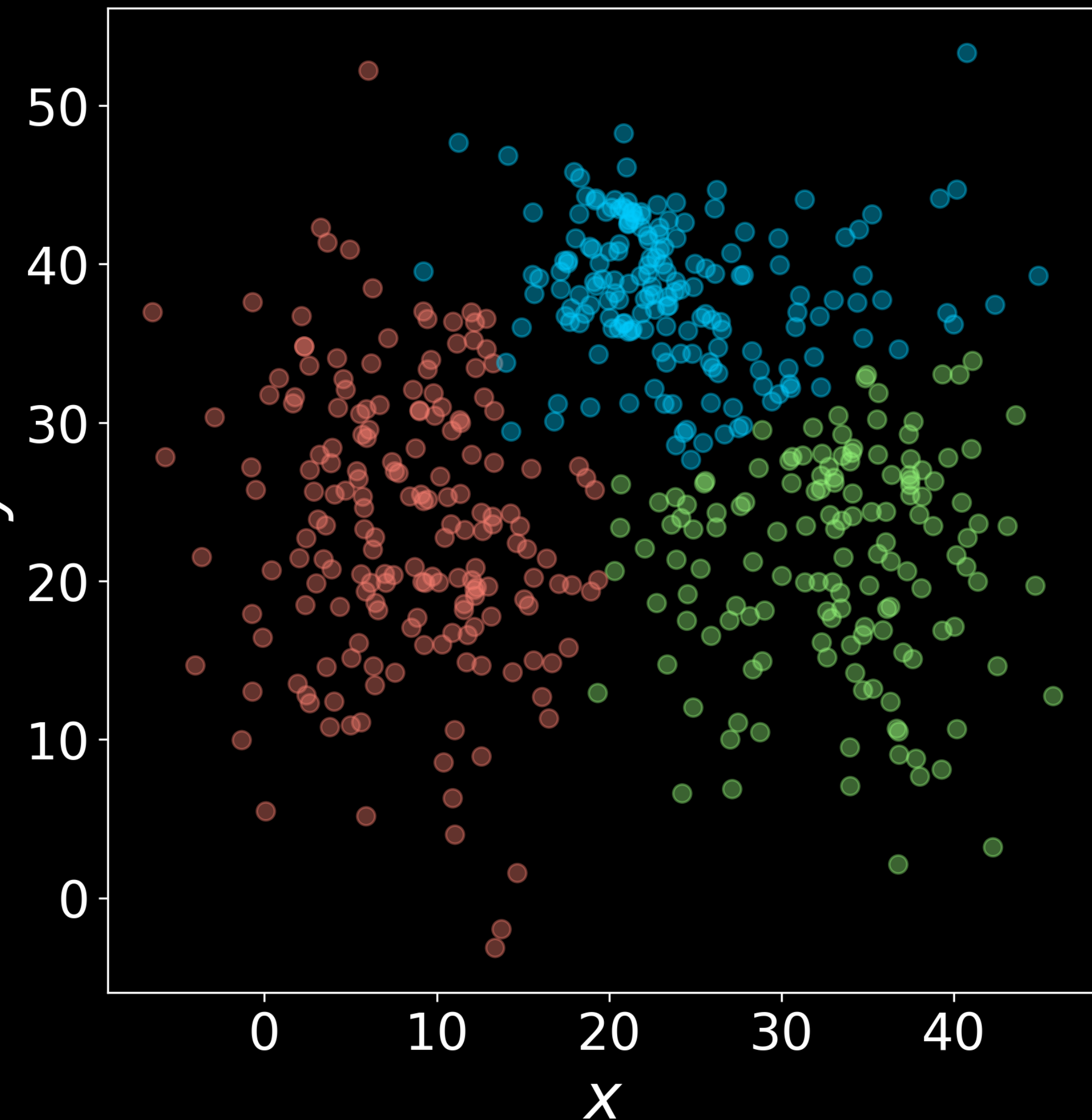
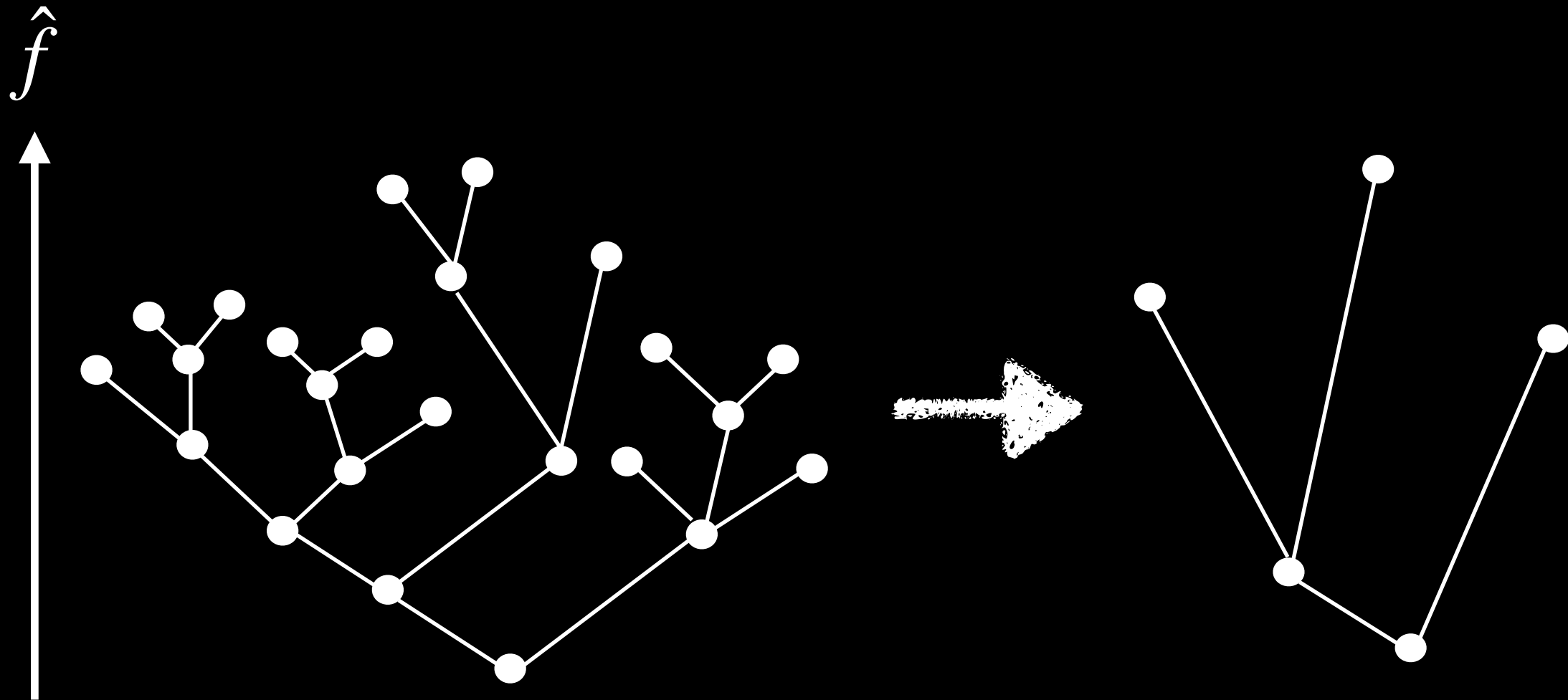


Next saddle point

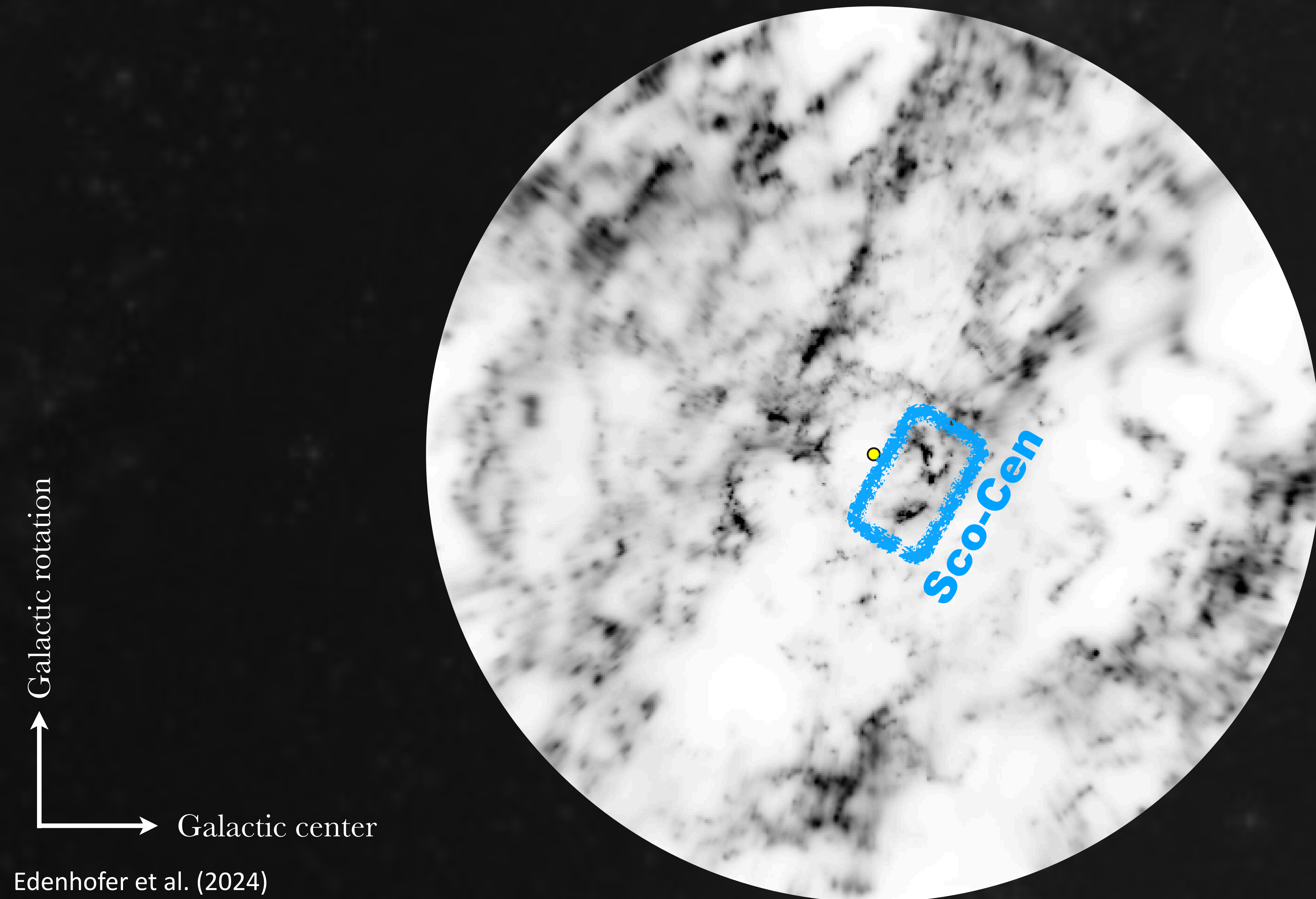


Clustering pipeline: SigMA

1. Gradient ascent step
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 - A. Test modality between modes
 - B. If H_0 cannot be rejected — merge \rightarrow

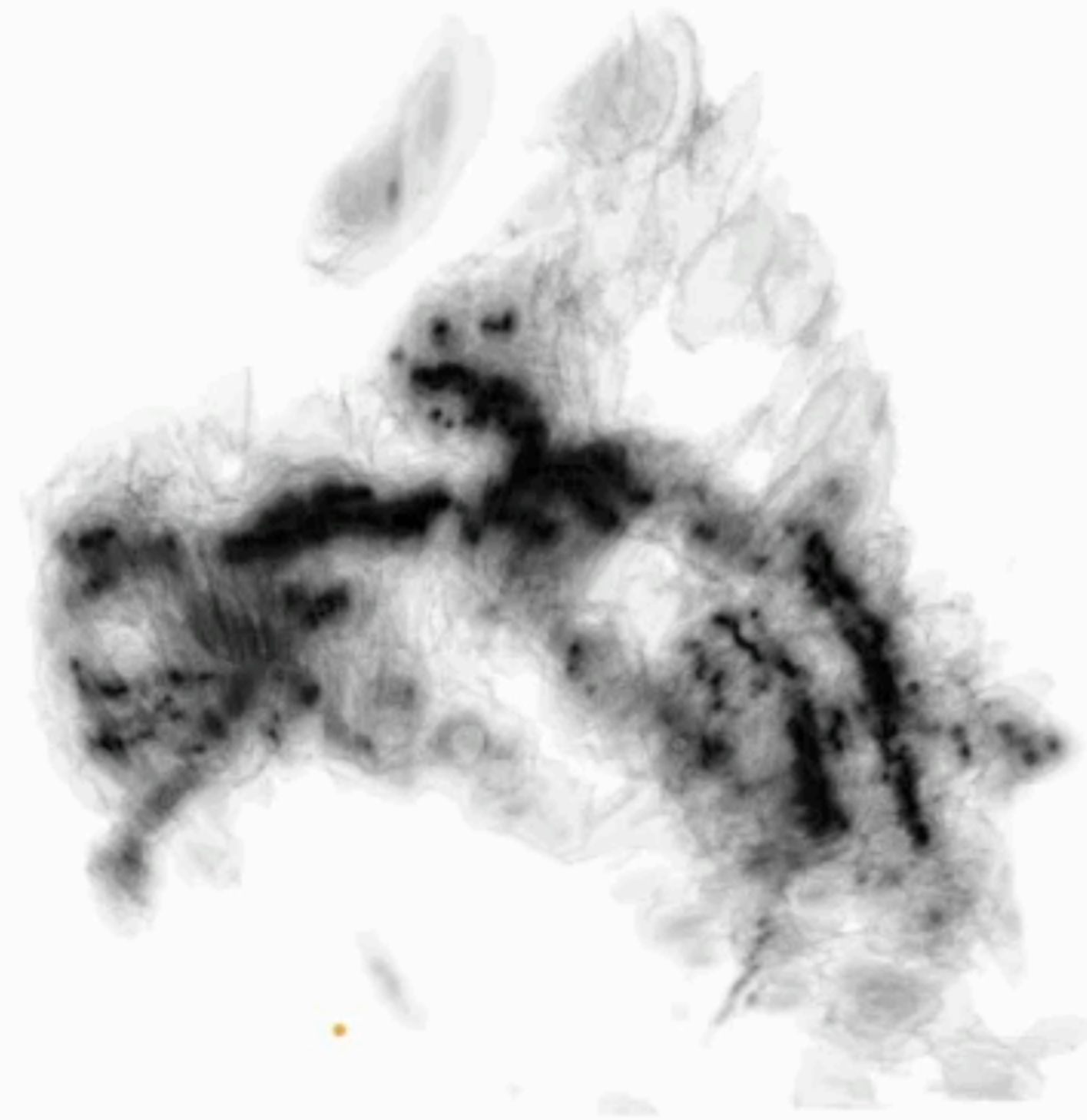


Results



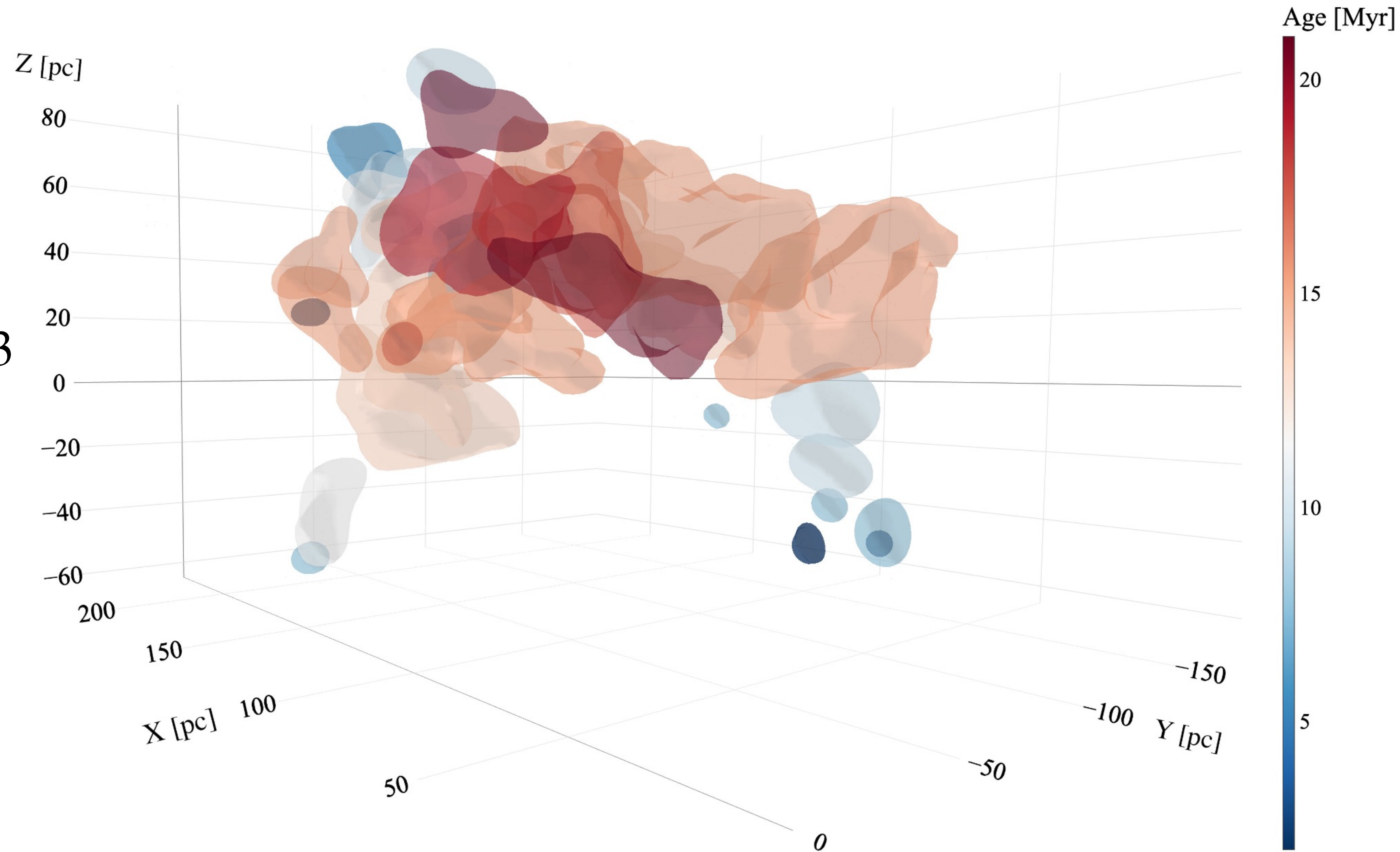
Edenhofer et al. (2024)

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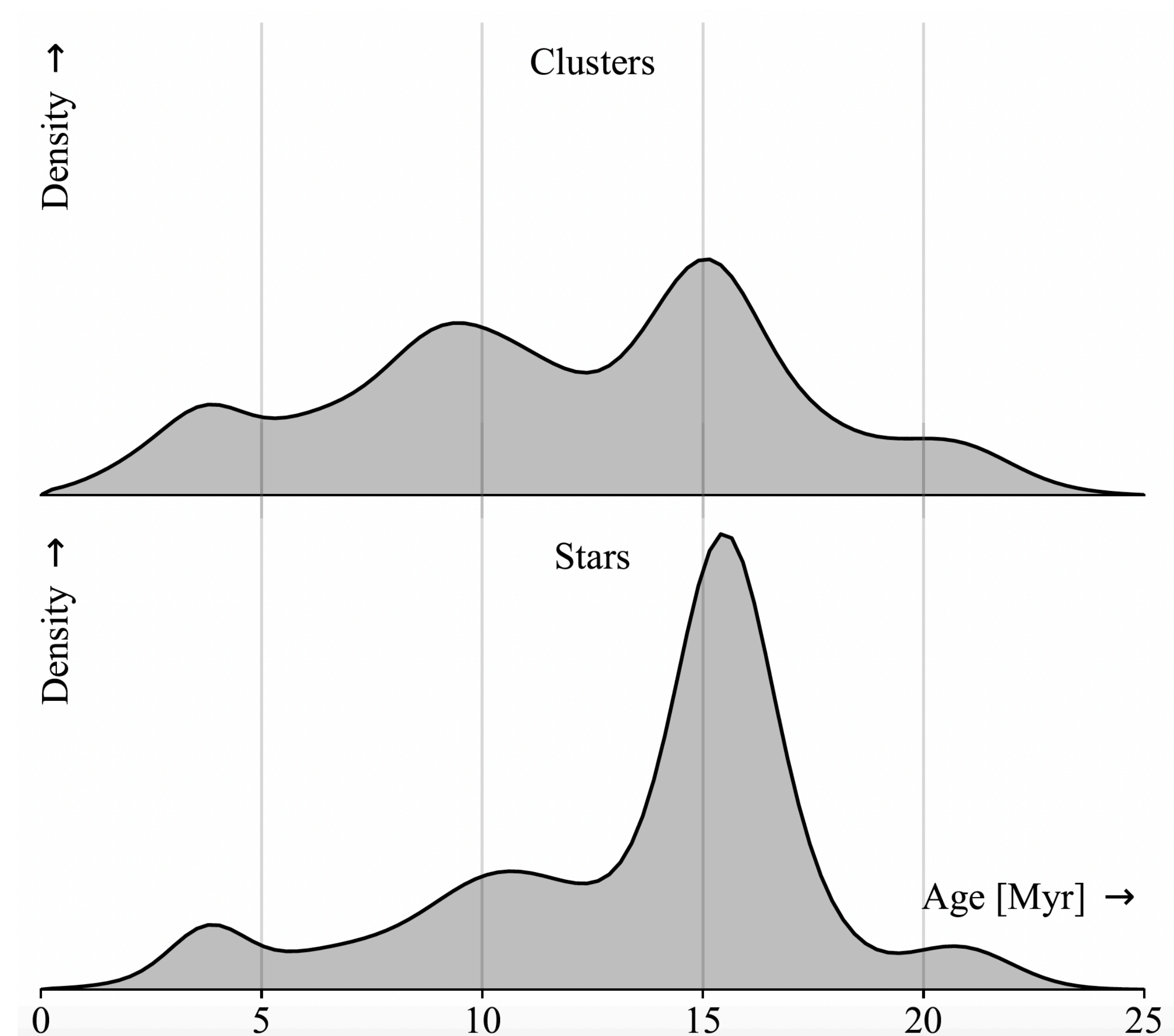
Results in Sco-Cen

- New substructure
- Resolution
 - $\Delta v \sim 0.5 \text{ km s}^{-1}$
 - $0.01 \text{ sources pc}^{-3}$
 - $\sigma_{3D} \sim 1 \text{ km s}^{-1}$
- High-res spatio-temporal map
 - Age gradients



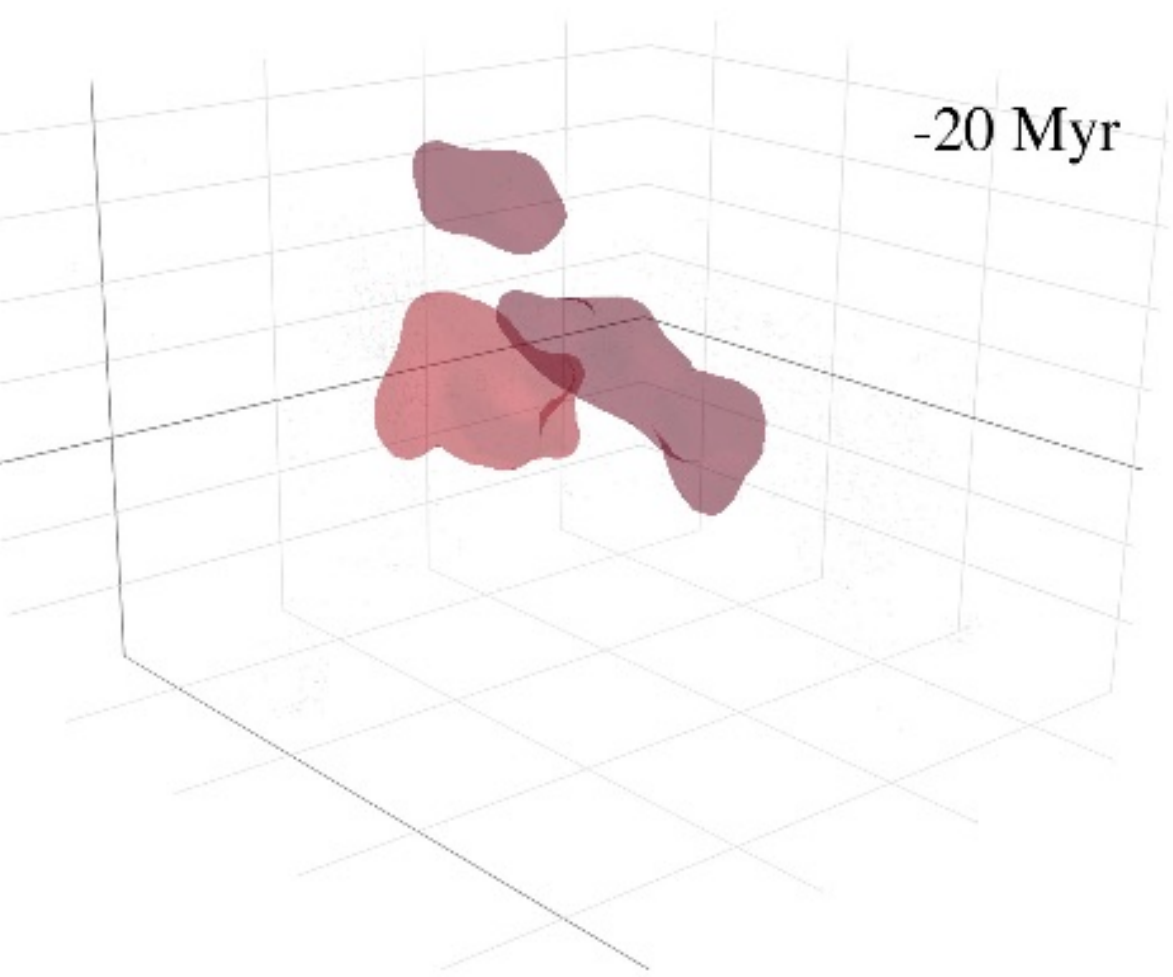
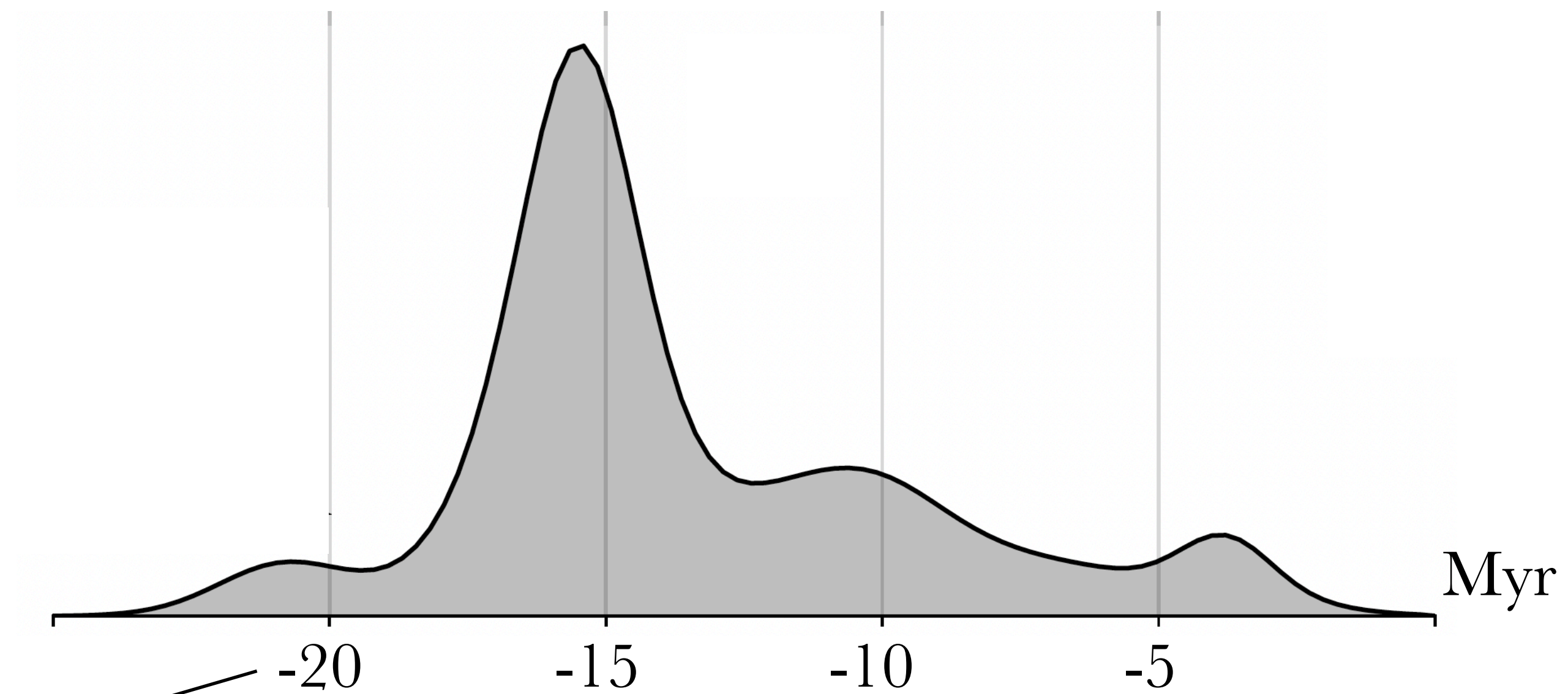
Buildup of Sco-Cen

Four episodes of star formation



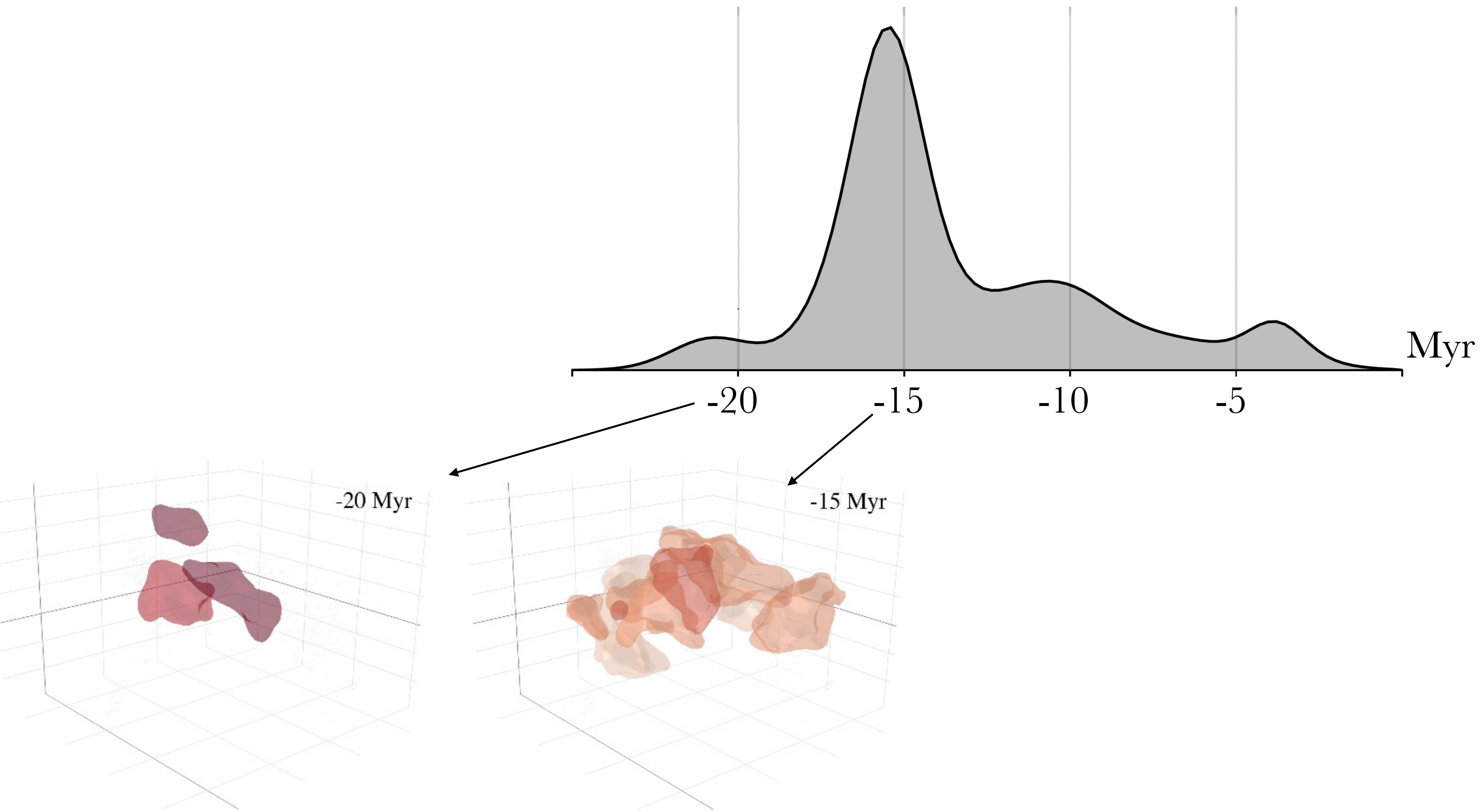
Buildup of Sco-Cen

Initial onset of SF



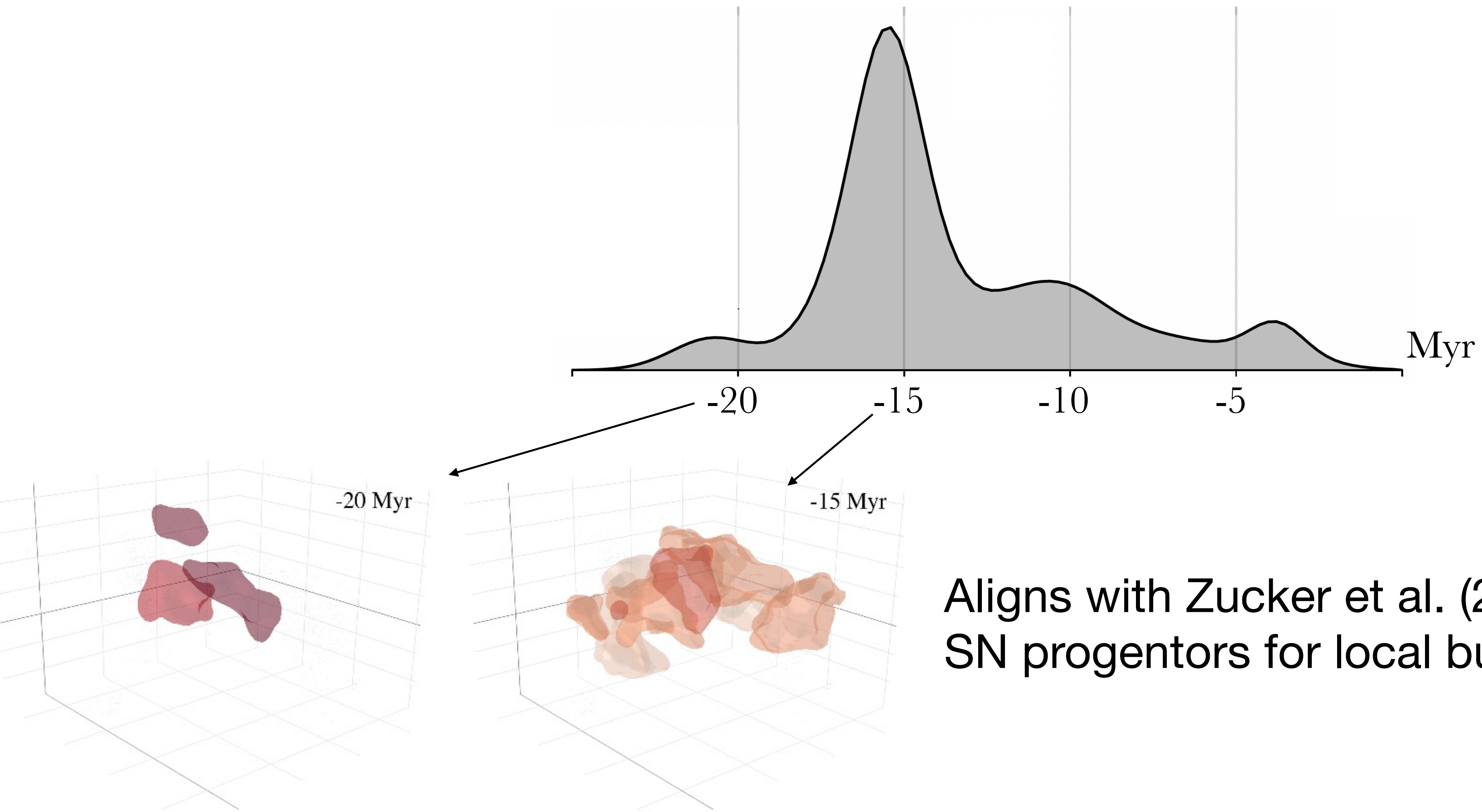
Buildup of Sco-Cen

Maximum SF/CF rate



Buildup of Sco-Cen

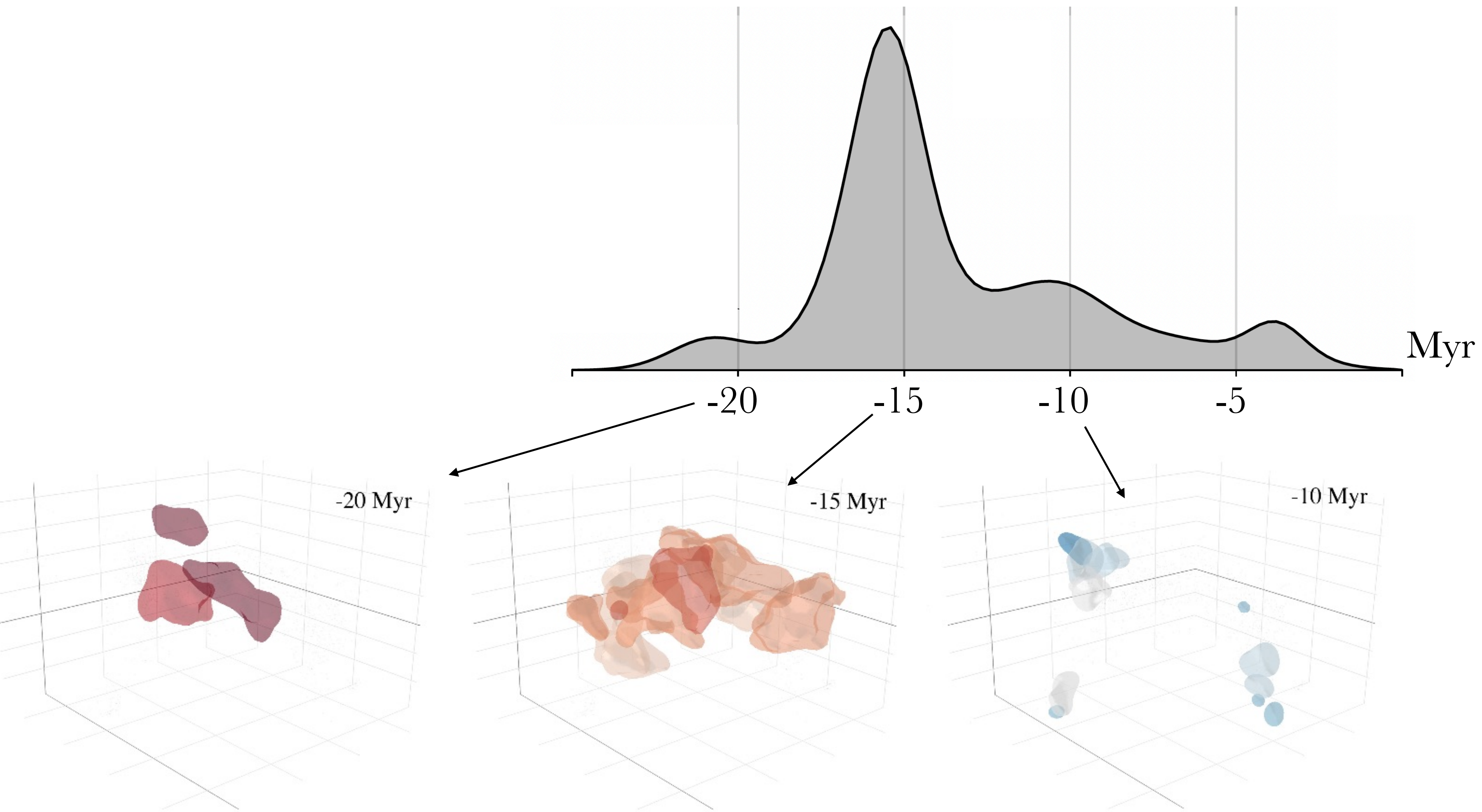
Maximum SF/CF rate



Aligns with Zucker et al. (2022)
SN progenitors for local bubble formation

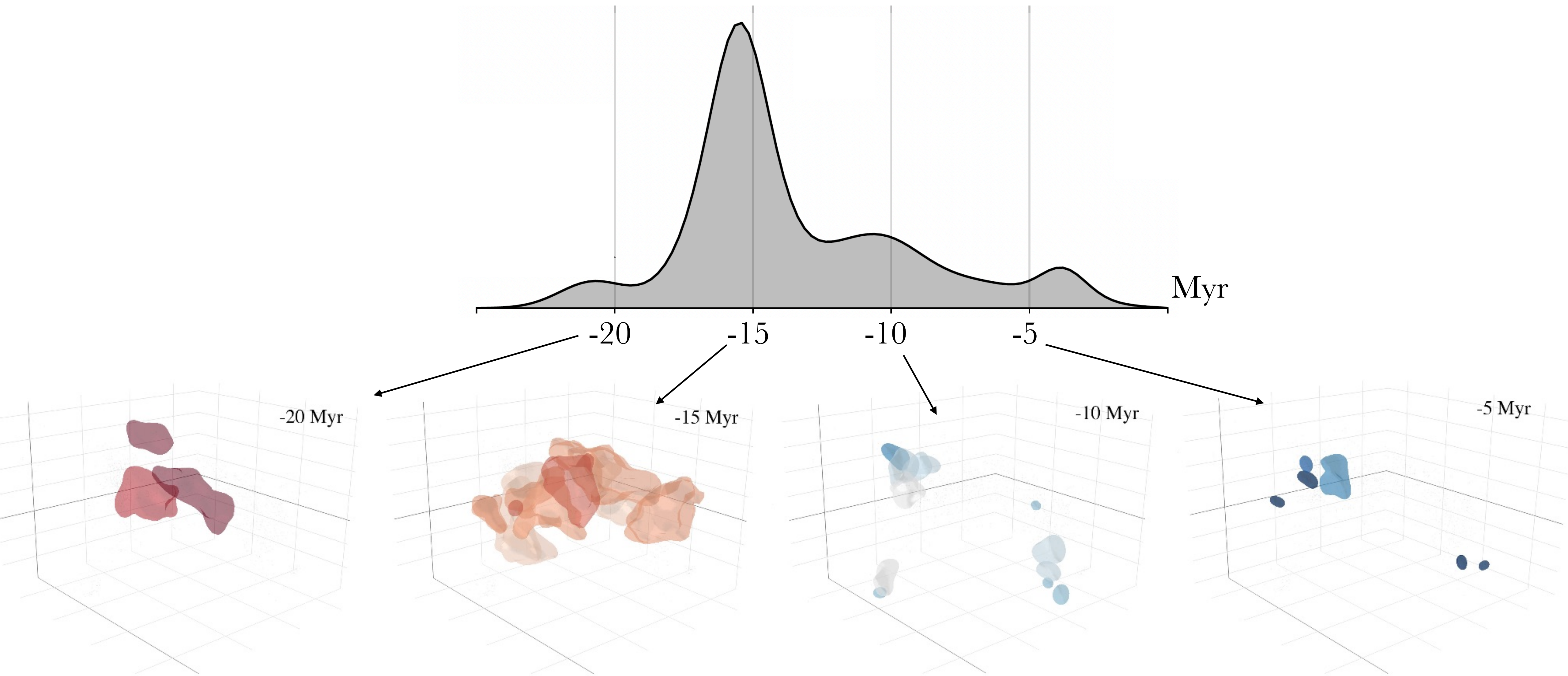
Buildup of Sco-Cen

USco & cluster chains



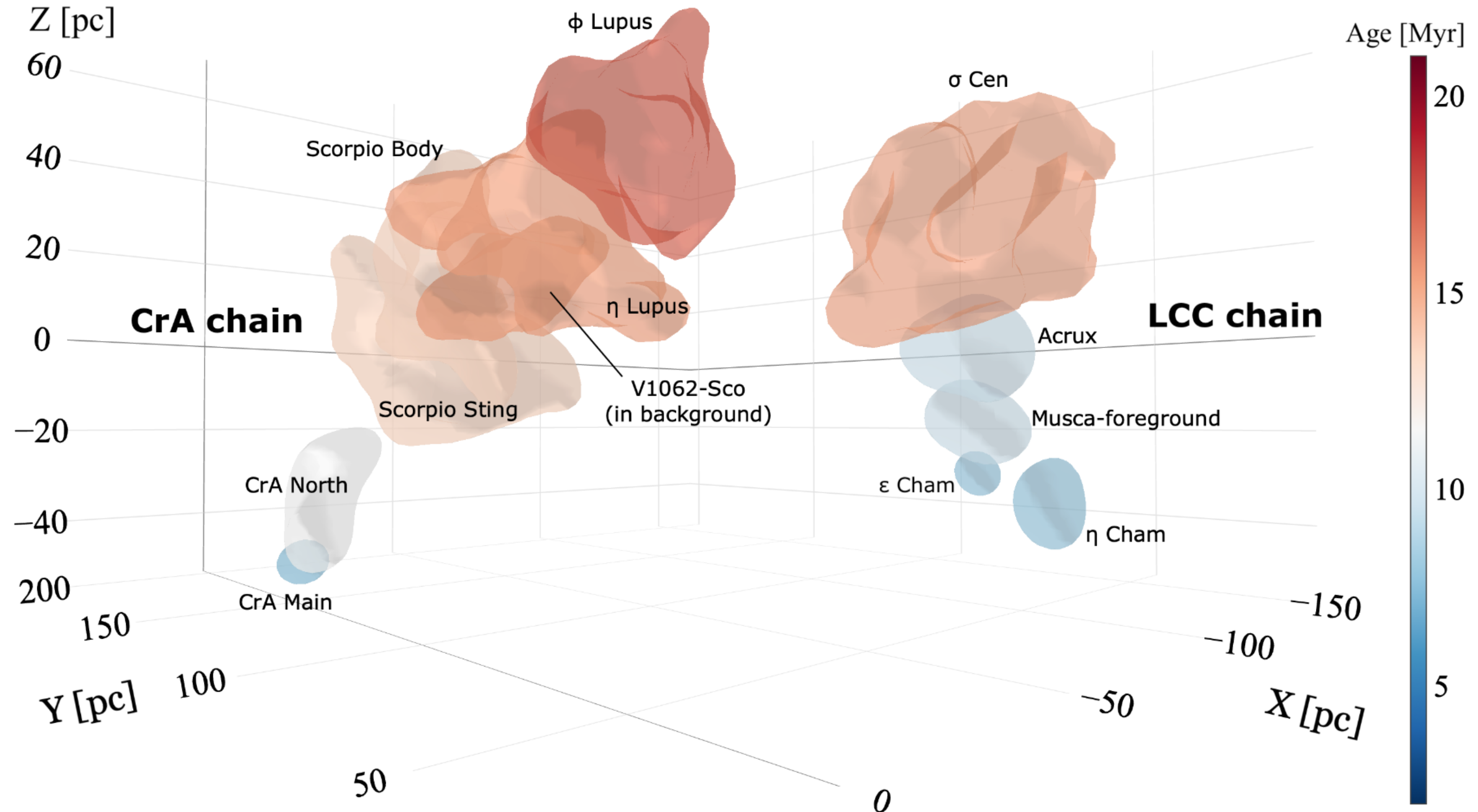
Buildup of Sco-Cen

Recent star formation



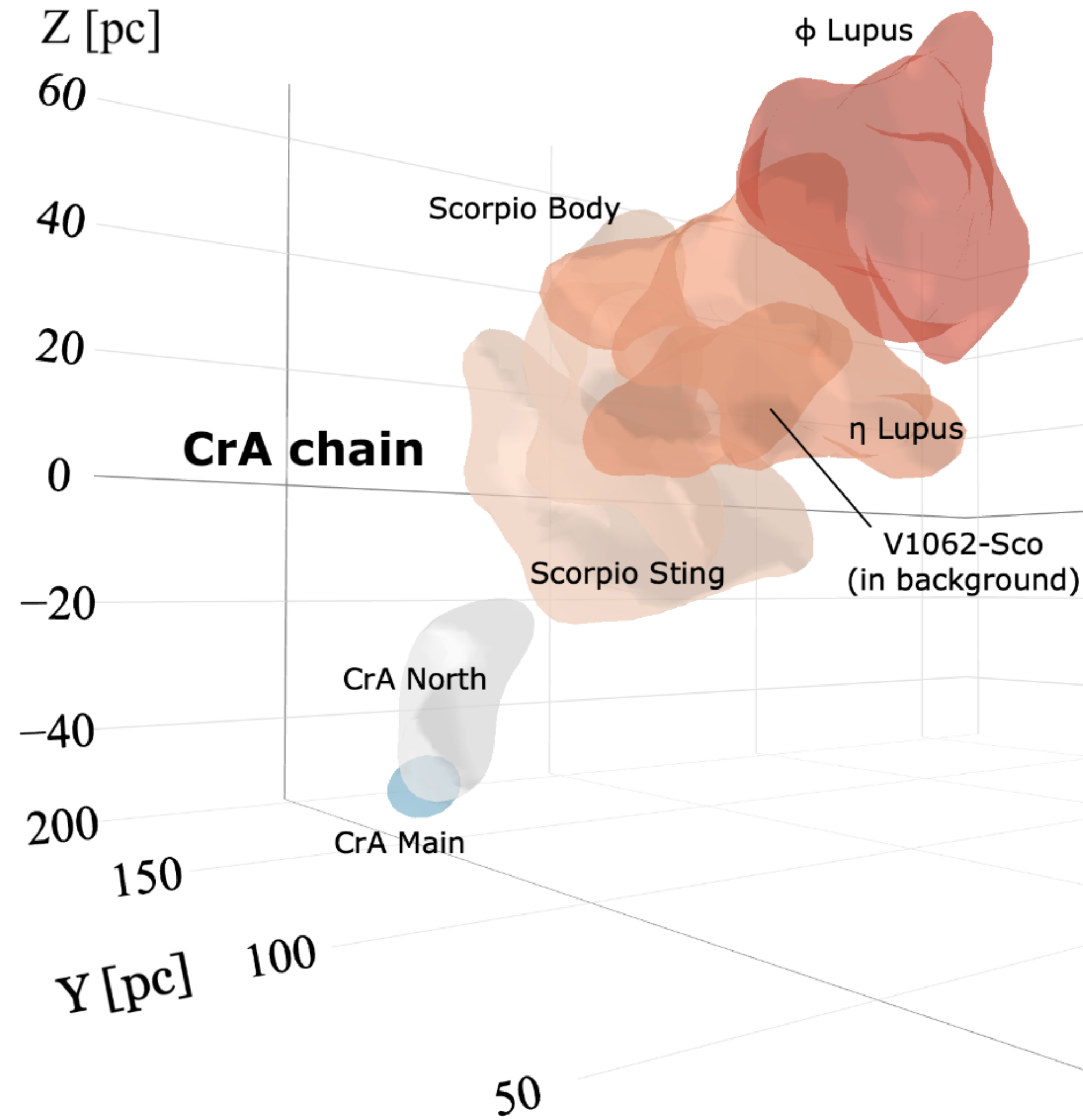
Star formation progression

100 pc cluster chains



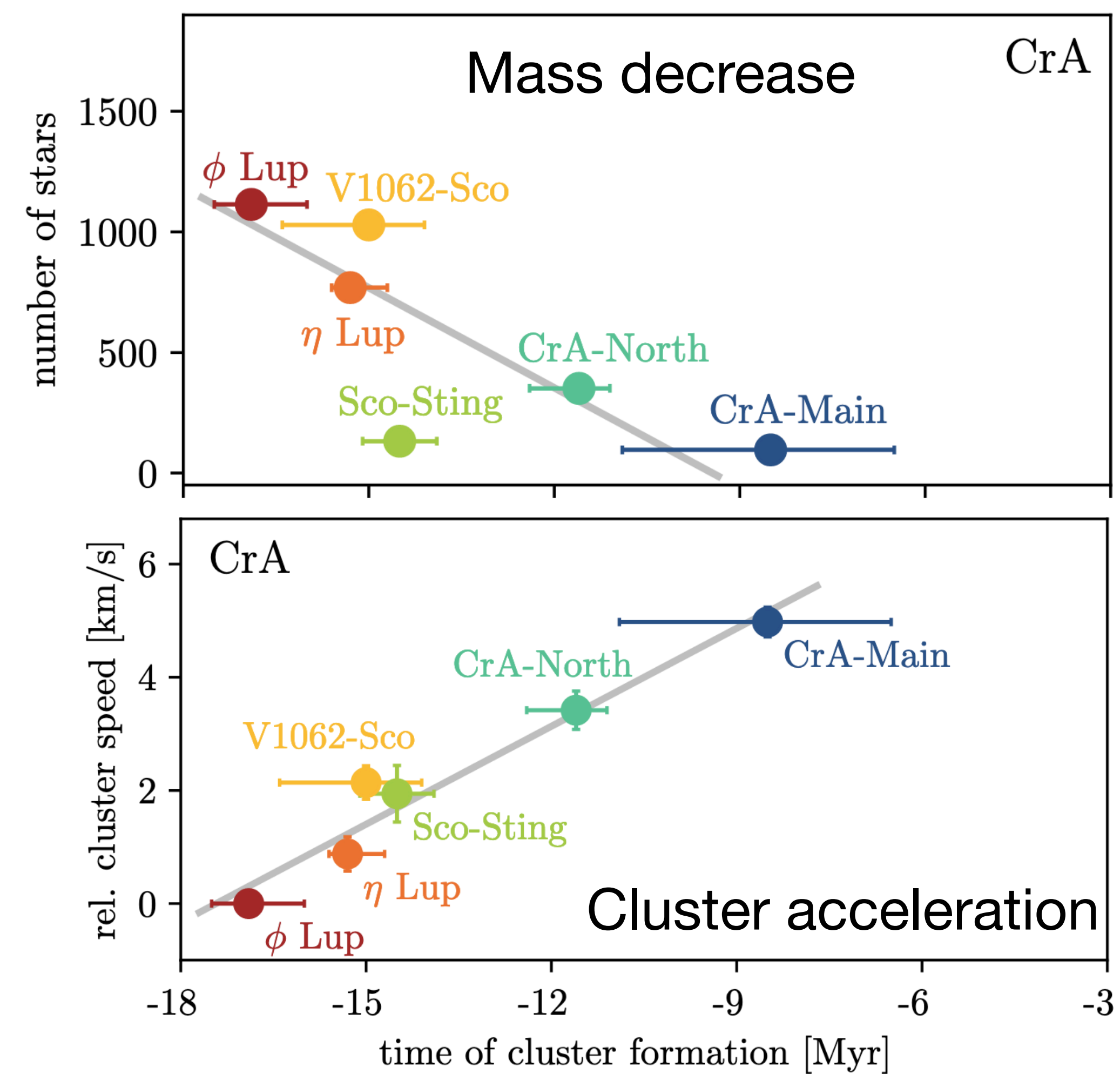
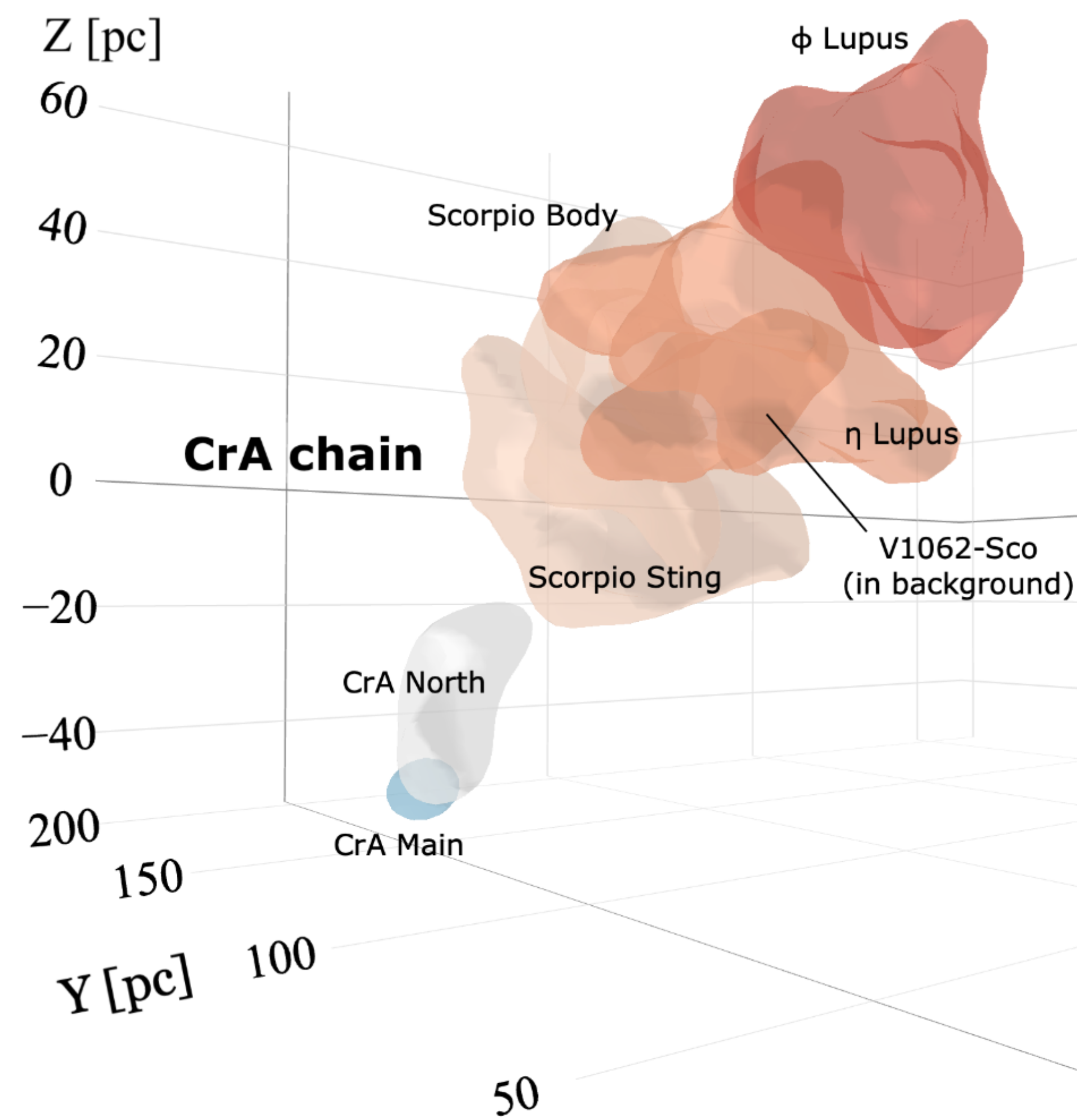
Star formation progression

100 pc cluster chains



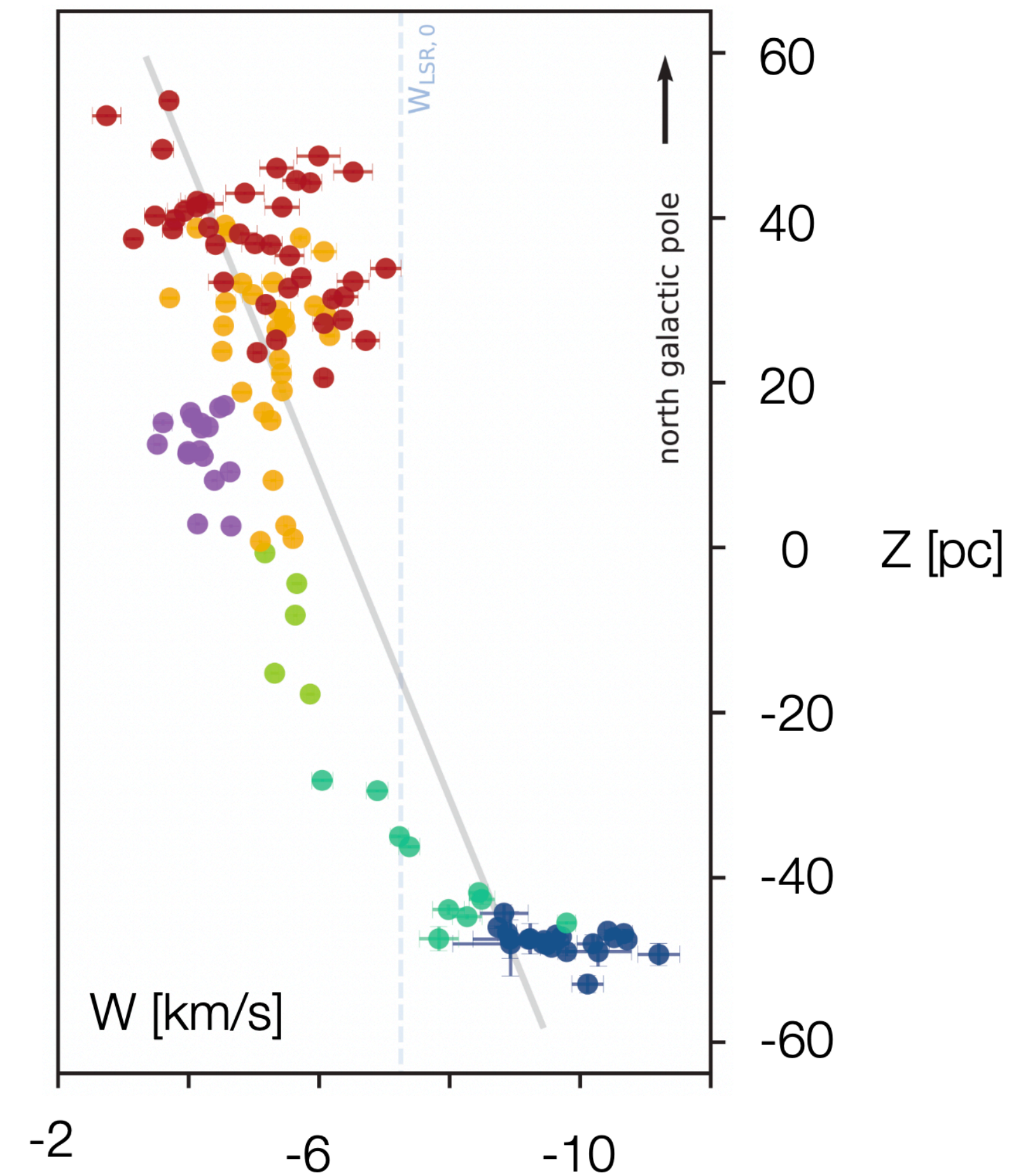
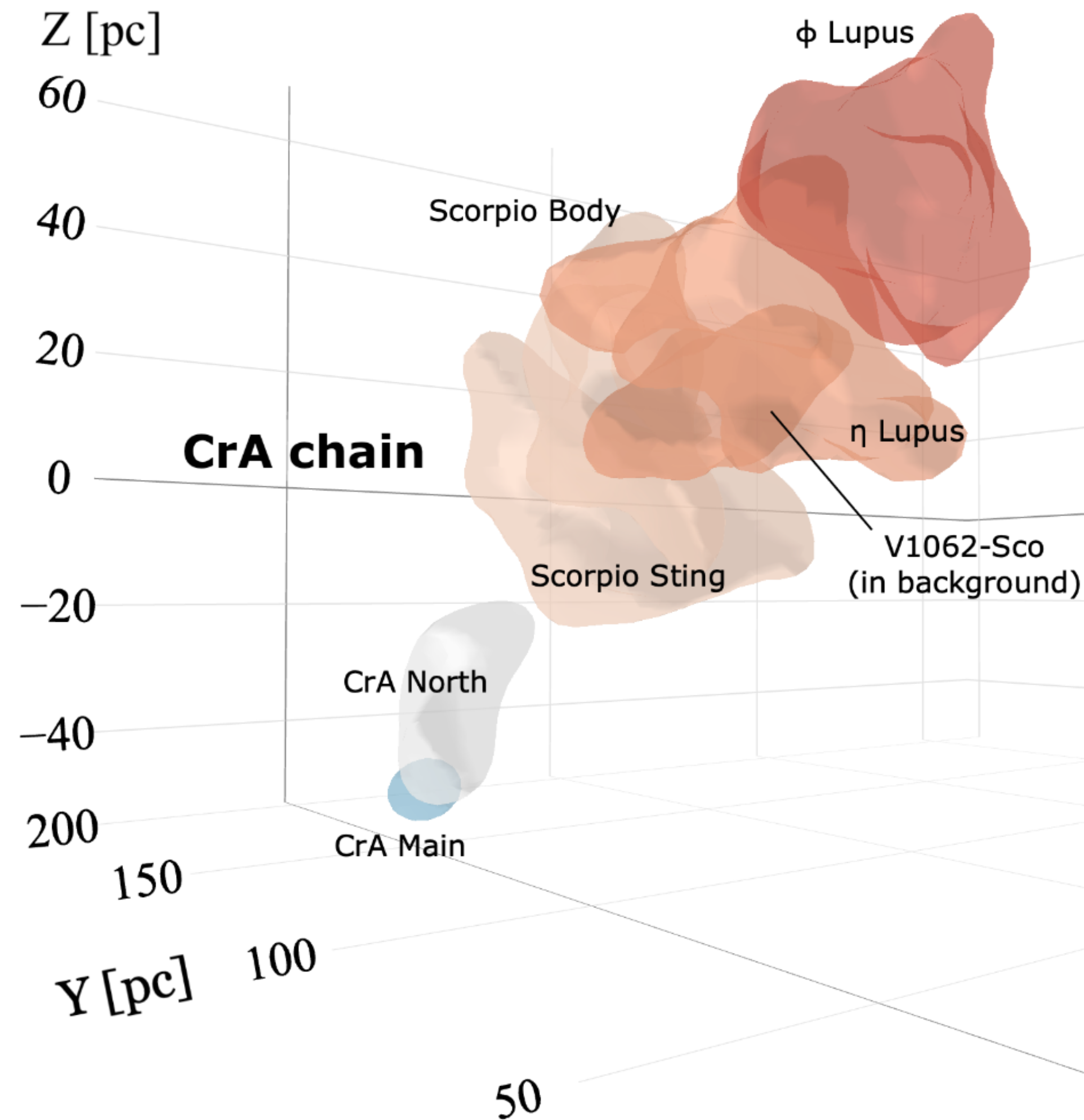
Star formation progression

100 pc cluster chains



Star formation progression

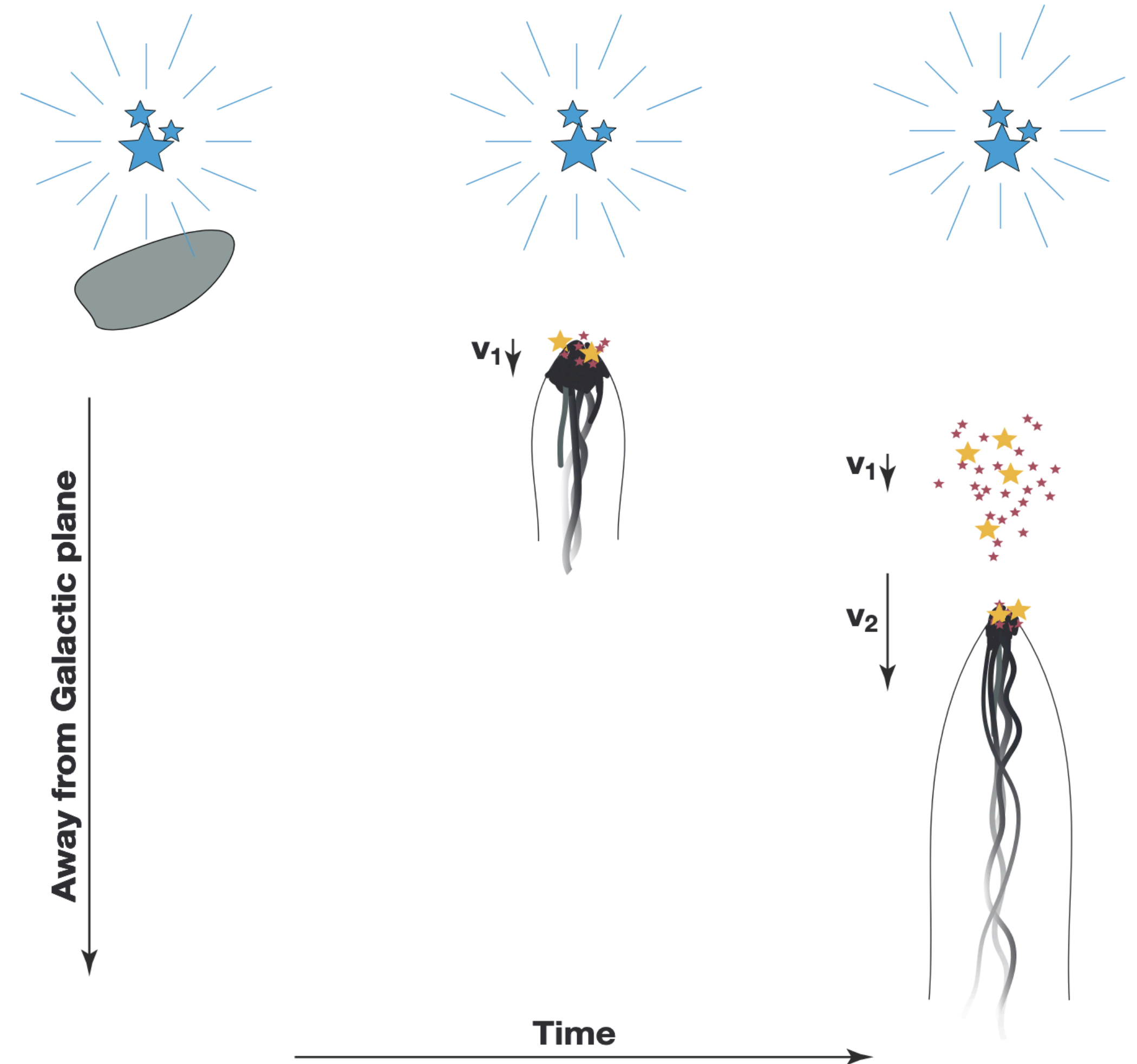
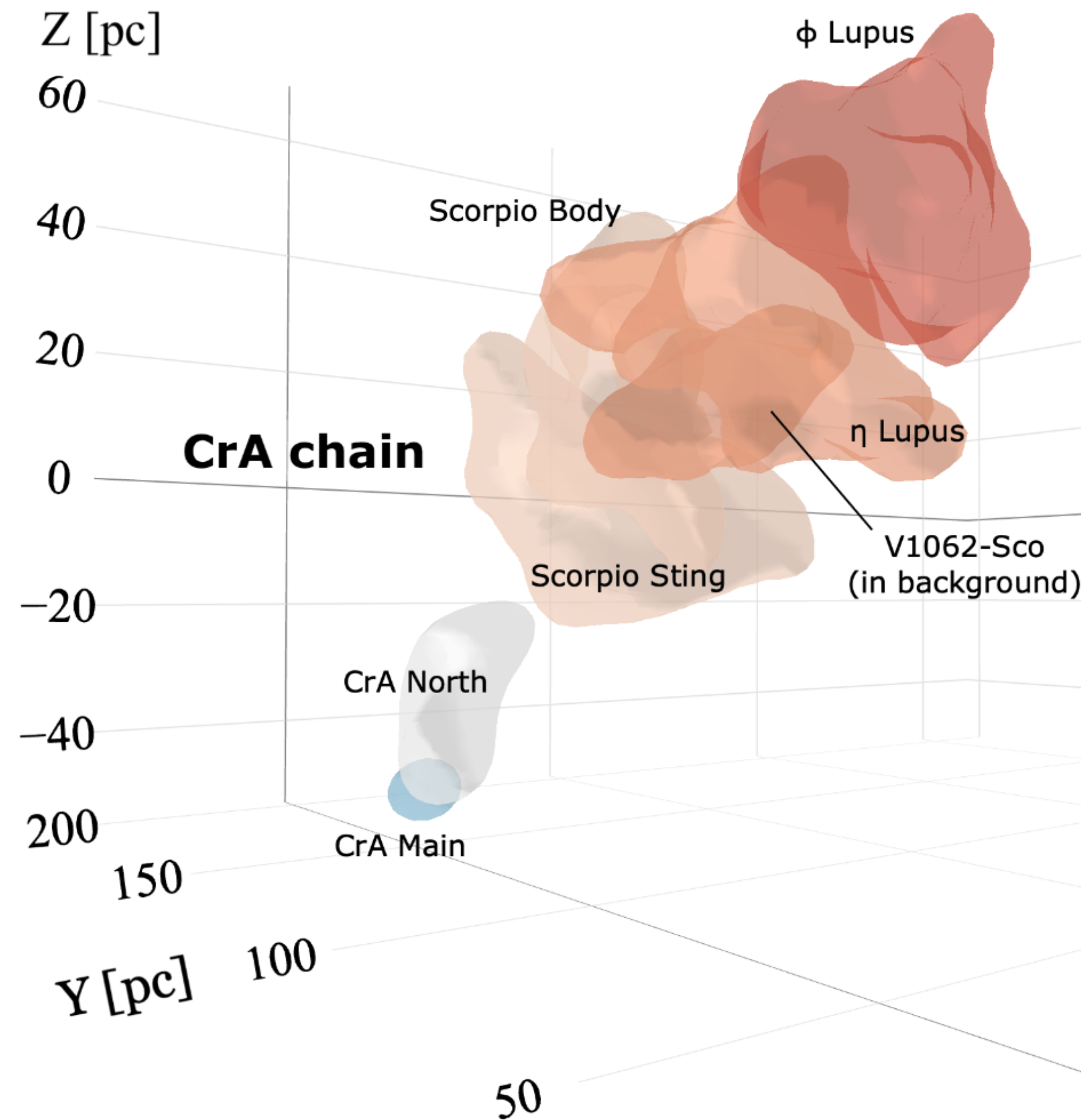
100 pc cluster chains



Posch et al. (2023)

Star formation progression

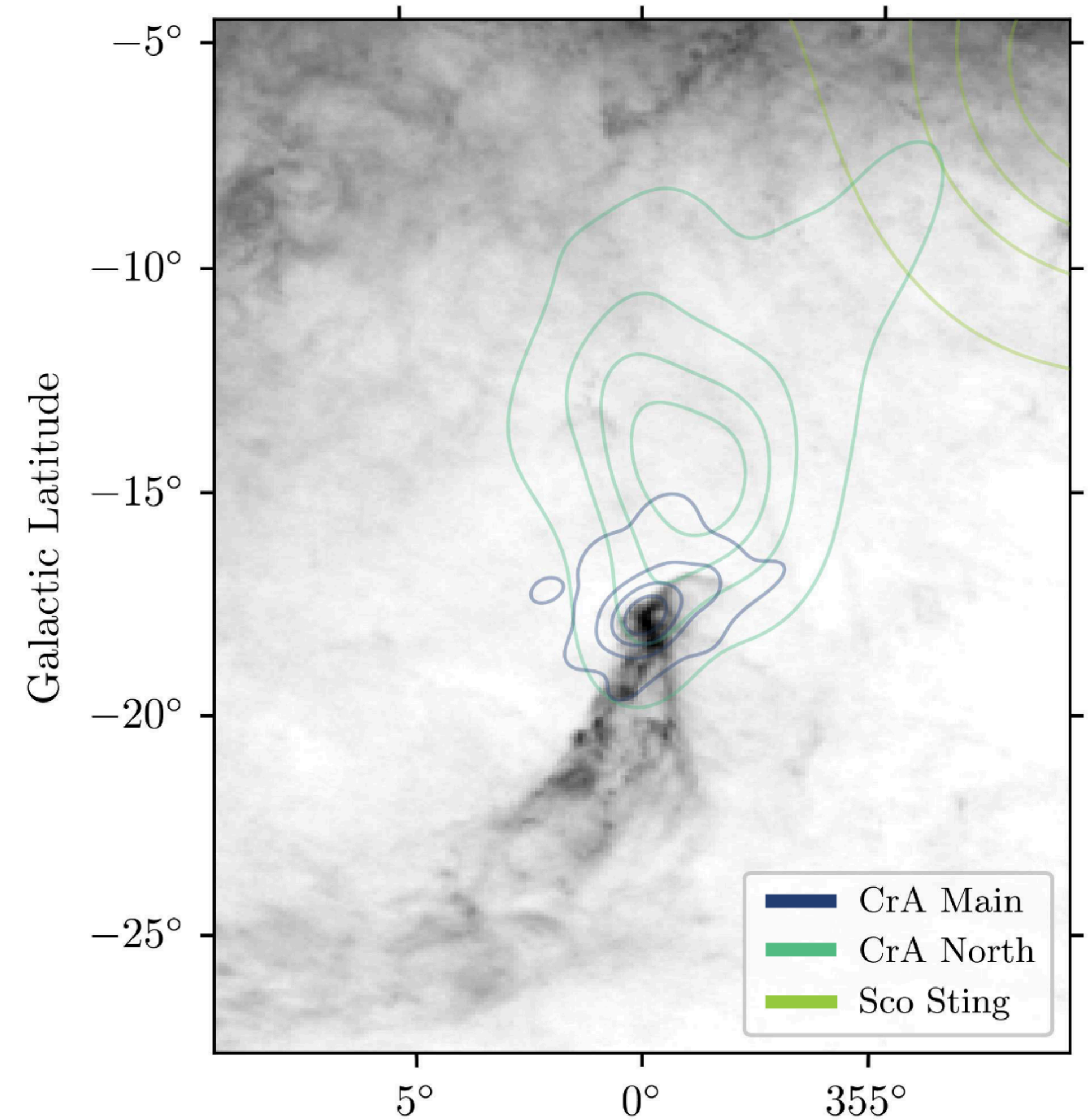
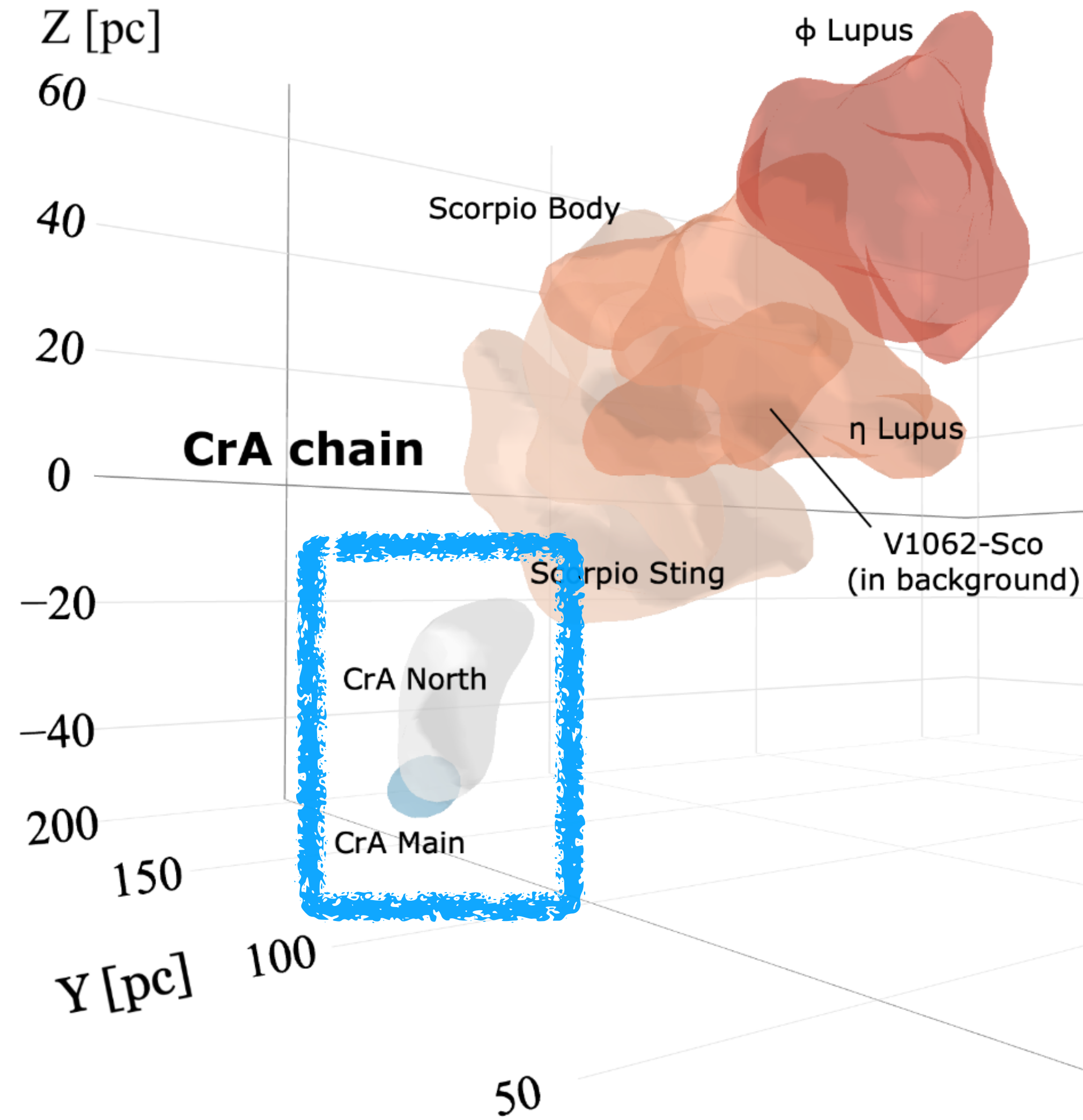
100 pc cluster chains



Posch et al. (2023)

Residual gas clouds

Cometary morphologies, containing embedded YSOs



Posch et al. (2023) Galactic Longitude

Signs of star formation propagation

- Inside-out formation: older massive clusters in center and younger low mass ones toward the outskirts

Signs of star formation propagation

- Inside-out formation: older massive clusters in center and younger low mass ones toward the outskirts
- Velocity imprints of feedback on younger next gen clusters

Signs of star formation propagation

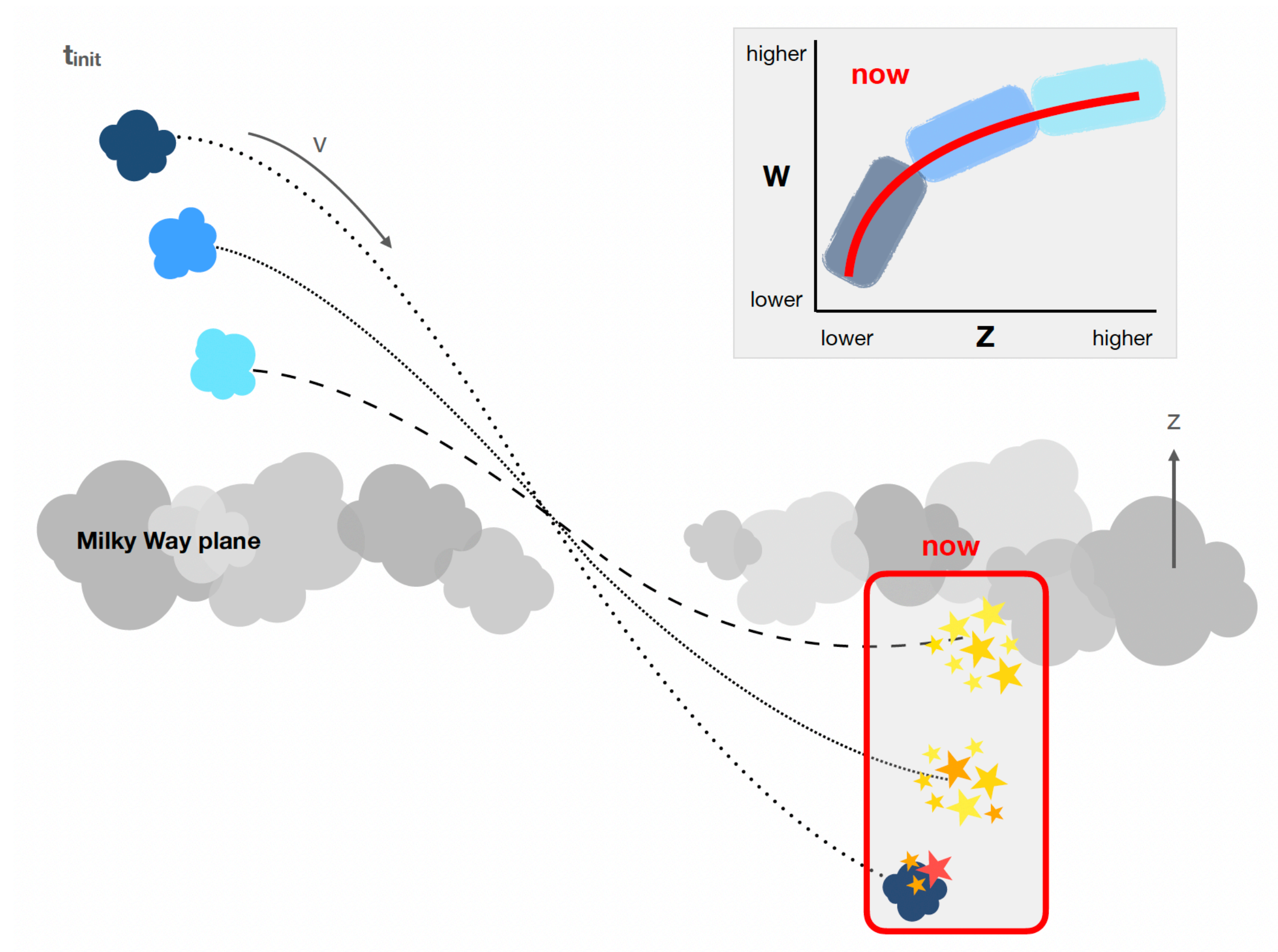
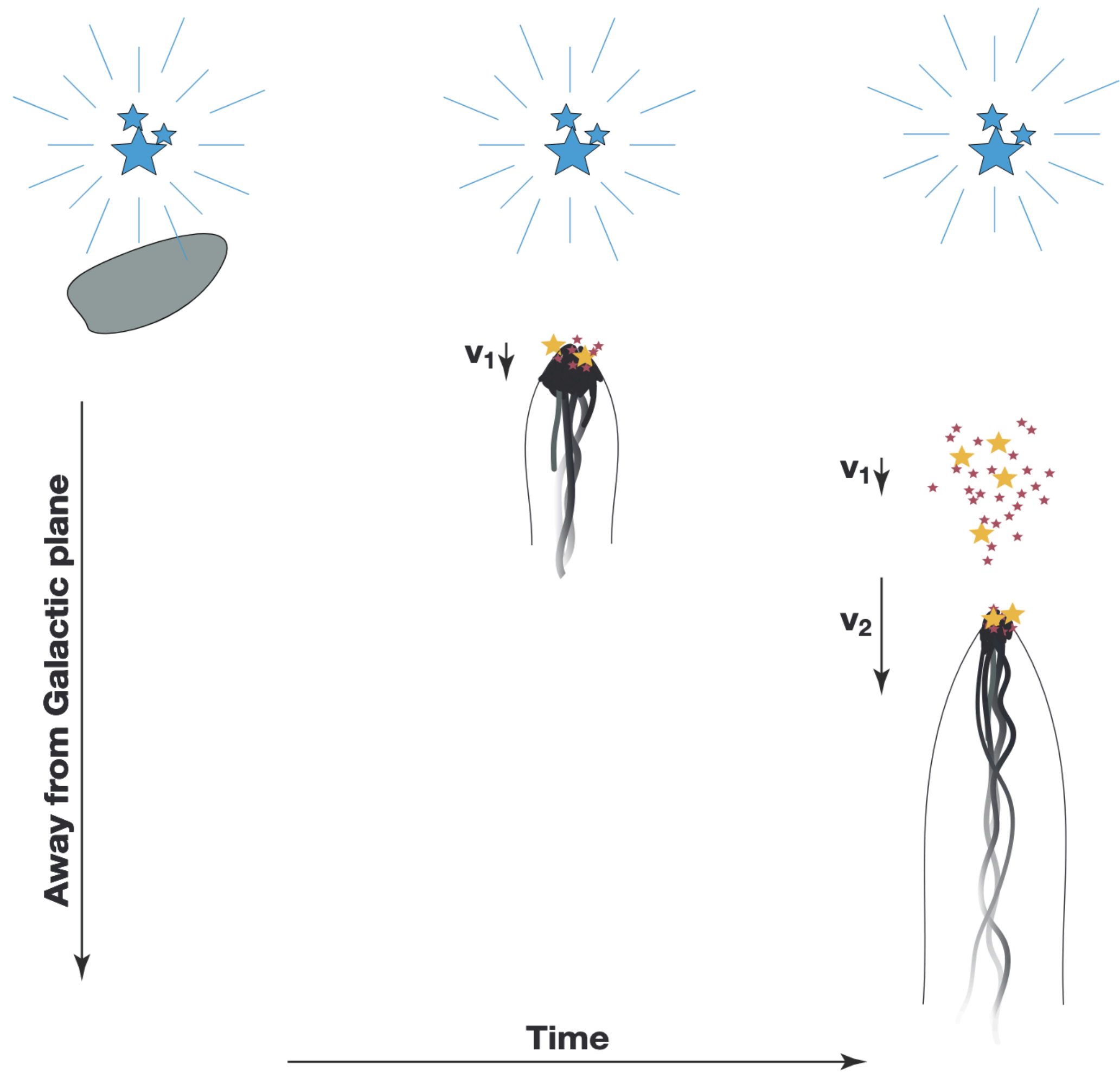
- Inside-out formation: older massive clusters in center and younger low mass ones toward the outskirts
- Velocity imprints of feedback on younger next gen clusters
- Residual gas clouds show compression & shaping from feedback

Signs of star formation propagation

- Inside-out formation: older massive clusters in center and younger low mass ones toward the outskirts
- Velocity imprints of feedback on younger next gen clusters
- Residual gas clouds show compression & shaping from feedback
- ~40% of Sco-Cen formed through triggered star formation, with 35% located in cluster chains

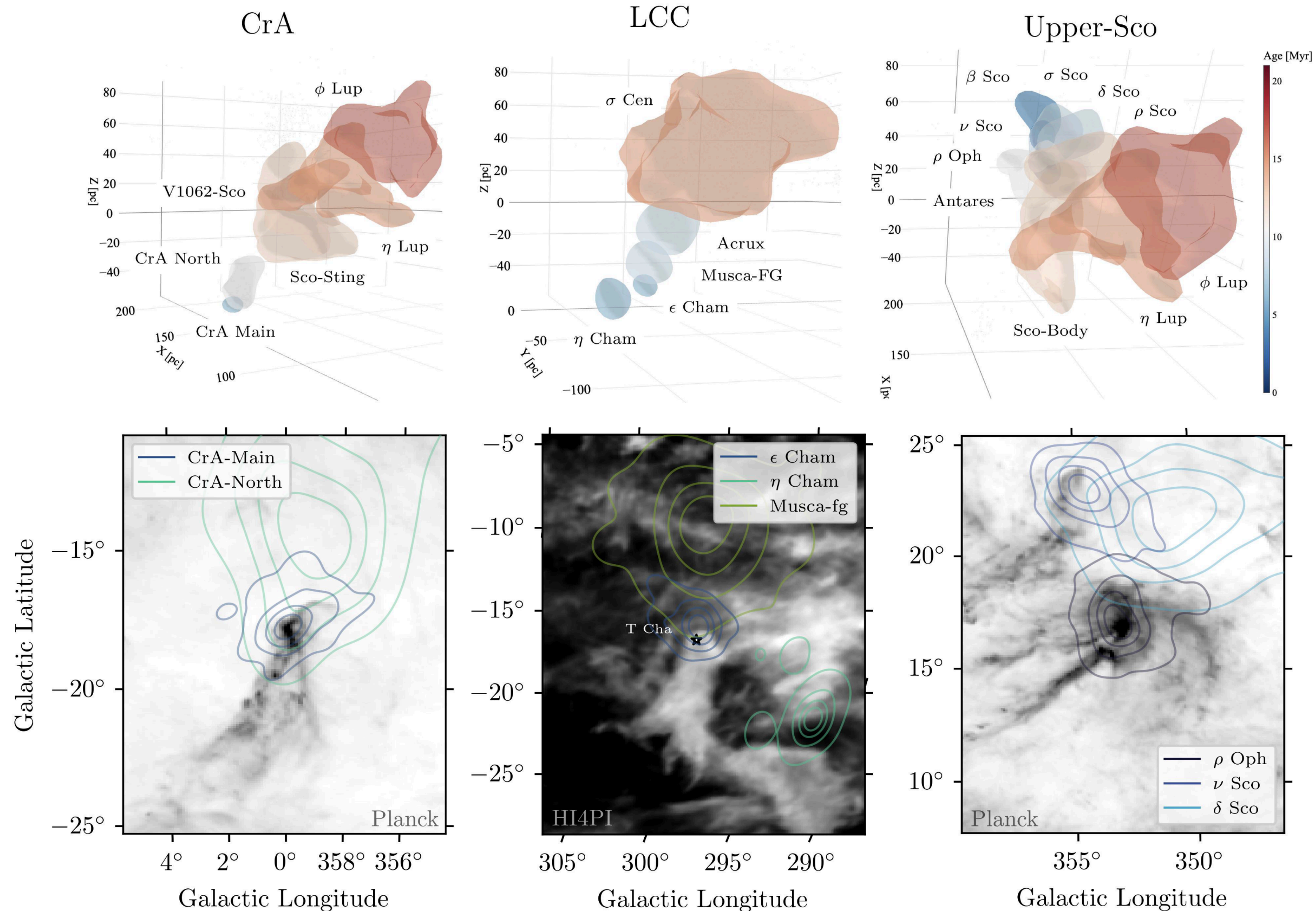
Thank you!

Backup



Residual gas clouds

Cometary morphologies, containing embedded YSOs



Momentum analysis

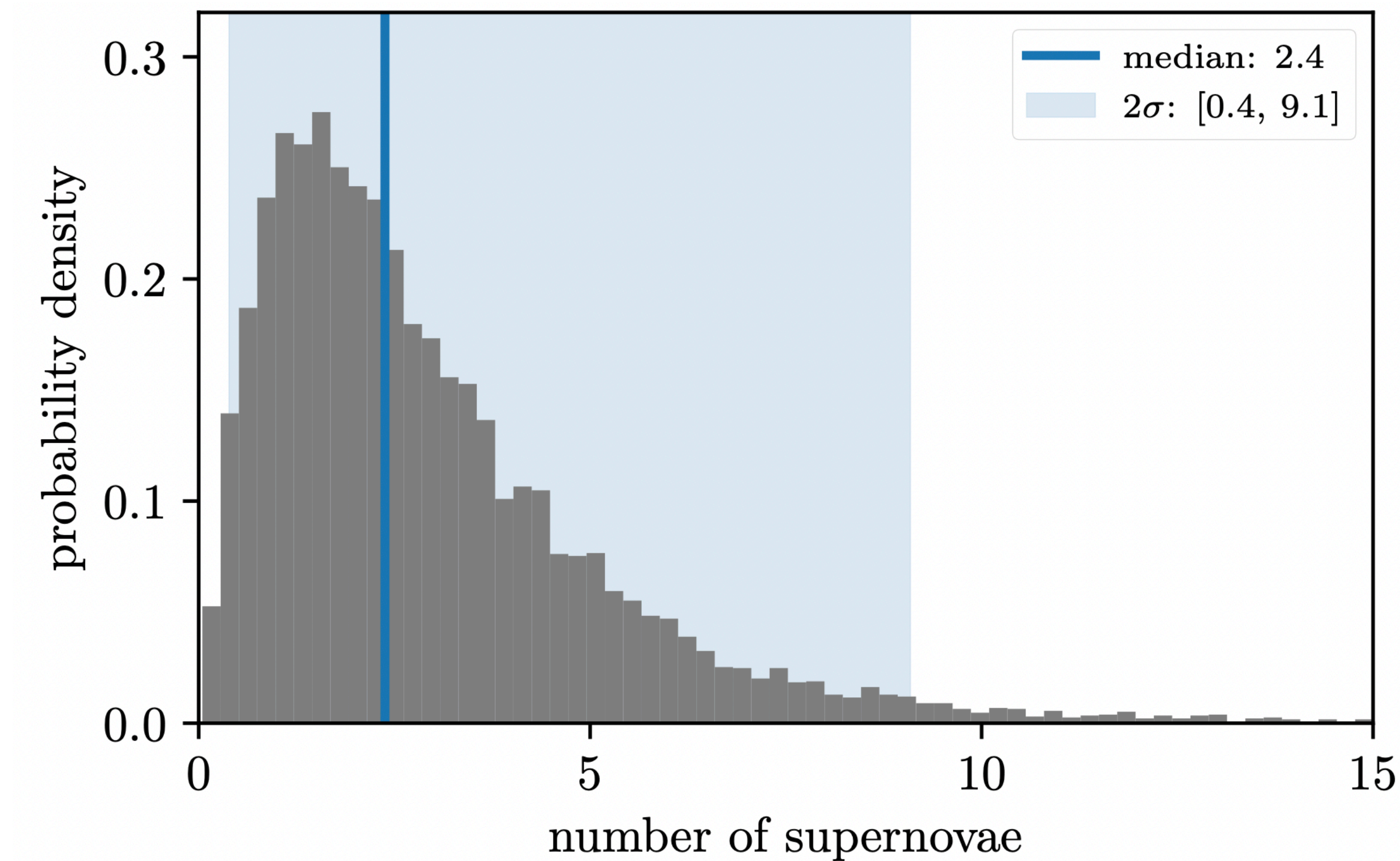


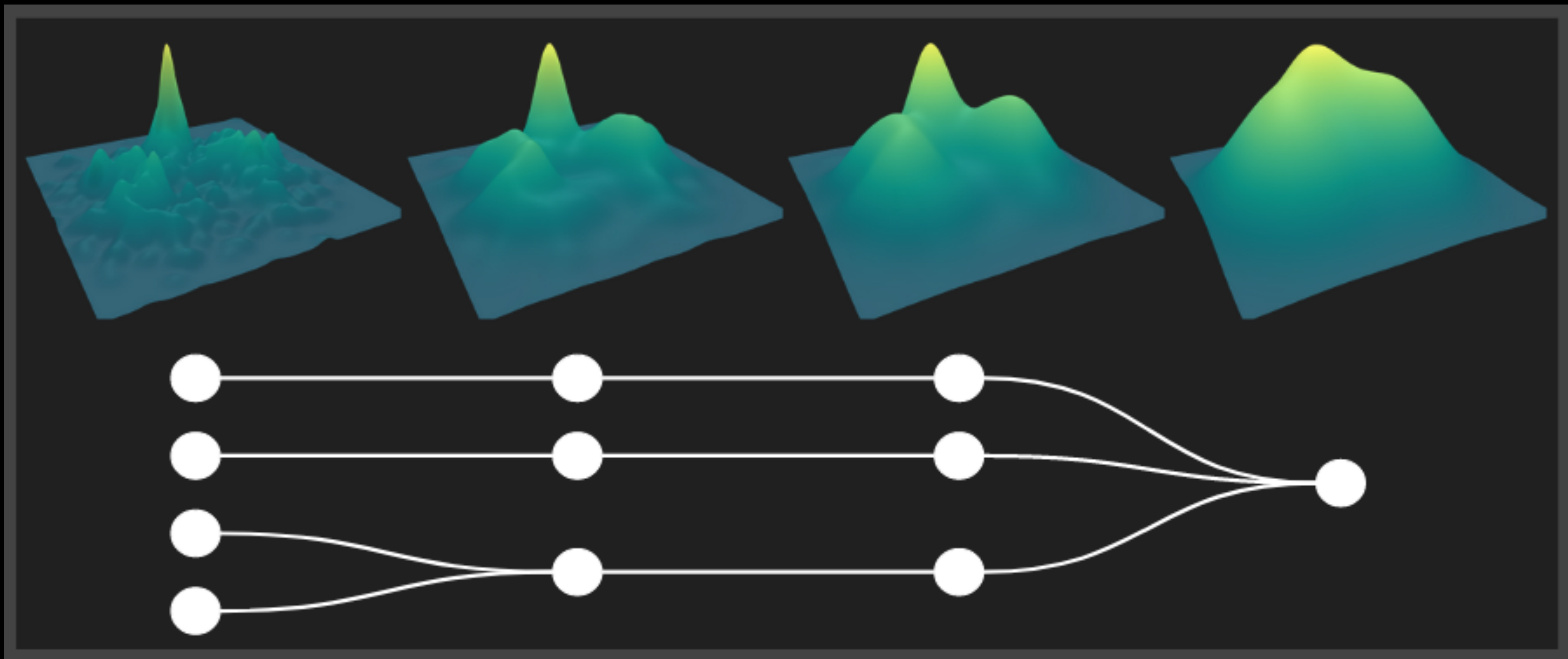
Fig. C.1. Probability distribution of the number of SN explosions needed to explain the current momentum of the CrA molecular cloud. The median number of SNe necessary is about two, with 95% of values lying between 0.4 and 9.1.

How to set parameters?

$\text{SigMA}(k, \alpha)$

Choosing k

$$\hat{T}_n(t) \sim \mathcal{N}(0,1) \iff \log N < k < N^{4/(4+p)}$$



Choosing α

- Many hypotheses tests increases chance of false positives
 - Limit proportion of **false positives** among all positives
 - Apply **Benjamini & Hochberg procedure**
- ➡ Data driven way of choosing significance α

Problem #1

Distance metric

Distance metric

- Mixed meaning of dimensions
- 3 positional features
 - In Cartesian space
- 2 velocity features
 - Measurements “on sky”
 - spherical coordinates

Problem #2

Uncertainties

Time complexity

Density computation
(k-d tree)



mode & saddle
search (union find)



$$\mathcal{O}(p N \log N) + \mathcal{O}(p N \log N) + \mathcal{O}(N k) + \mathcal{O}(|\mathcal{S}|)$$



Graph construction



Cluster tree
pruning

Robustness of $\hat{T}_n(t)$

