

Title: Astrometric weak lensing from Dark Matter substructures

Speakers: Cristina Mondino

Series: Particle Physics

Date: July 30, 2019 - 1:00 PM

URL: <http://pirsa.org/19070000>

Abstract: It has been recently pointed out that variable weak gravitational lensing effects on the motion of background stars can be used to probe nonluminous structures inside the Milky Way halo. I will describe one possible detection strategy targeting collapsed dark matter structures in the mass range from million to billion solar masses. The data analysis technique will be discussed in detail with an application to the second data release of Gaia.

Dark Matter

What do we know about DM?

- Gravitational interaction
- Other interactions (if any) are small
- Cold, pressureless fluid

The SM does not provide a DM candidate



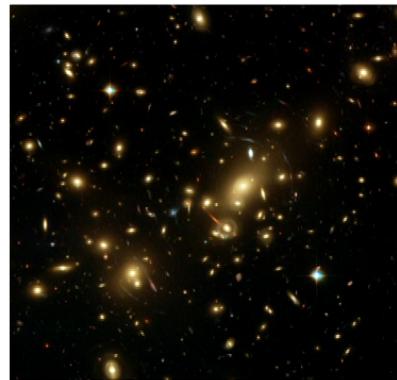
Variety of New
Physics solutions

Gravitational probes

Why?

- DM interacts gravitationally
- Apply to a wide variety of models
- New information about DM properties (self-interaction, cusp/core)

Abell 2218



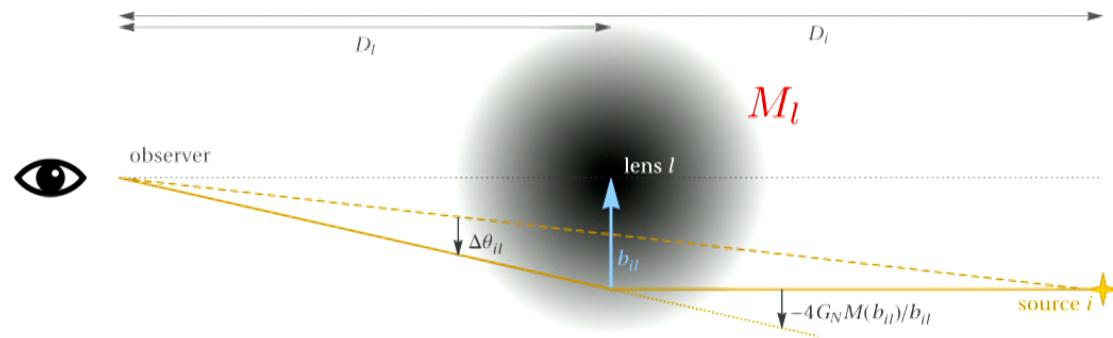
Bullet Cluster



Outline

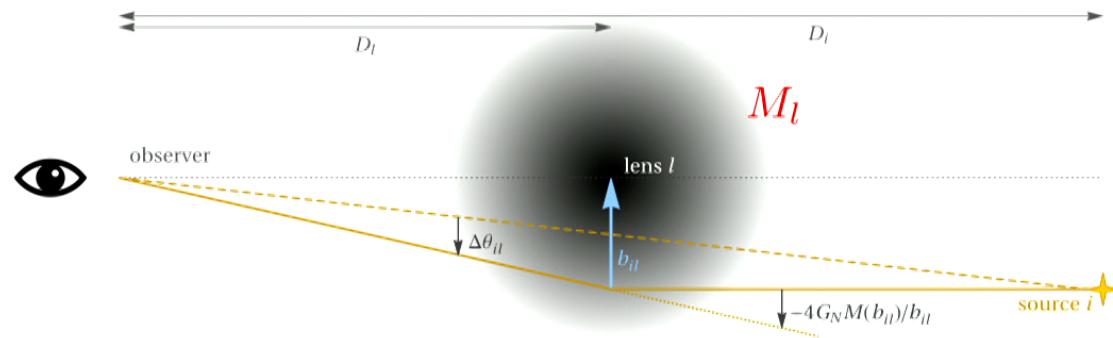
1. Astrometric weak lensing: lens targets
2. Precision astrometry
3. Template method and results

Astrometric weak lensing



- One resolved image
- “Large” impact parameter

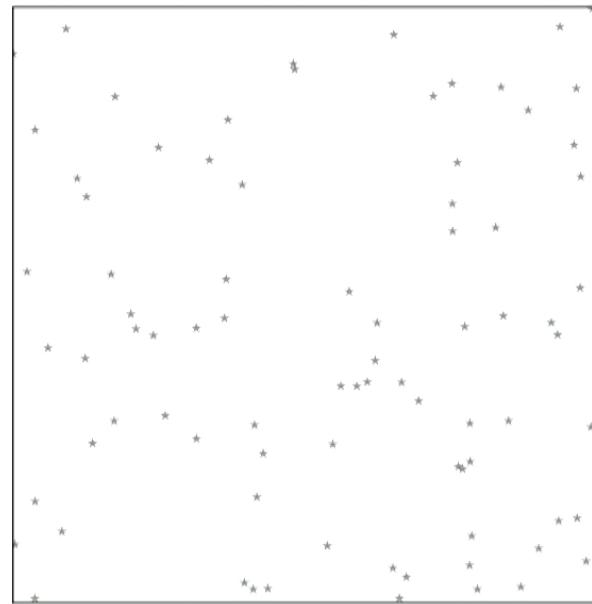
Astrometric weak lensing



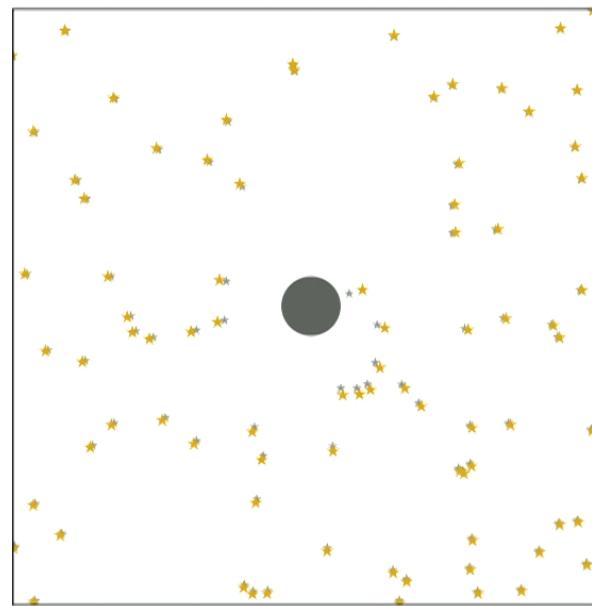
$$\Delta\theta_{il} = - \left(1 - \frac{D_l}{D_i}\right) \frac{4G_N M_l (b_{il})}{b_{il}} \hat{\mathbf{b}}_{il}$$

$$\Delta\theta_{il} \sim 40 \text{ mas} \left[\frac{M_l}{10^6 M_\odot} \right] \left[\frac{1 \text{ pc}}{b_{il}} \right] \text{ Maybe large enough to detect it?}$$

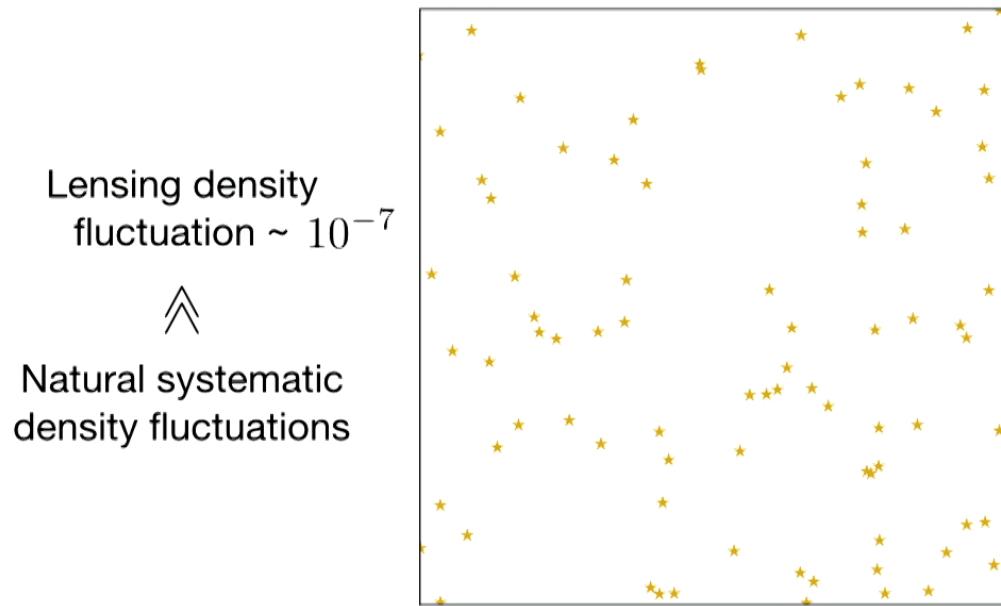
Astrometric weak lensing



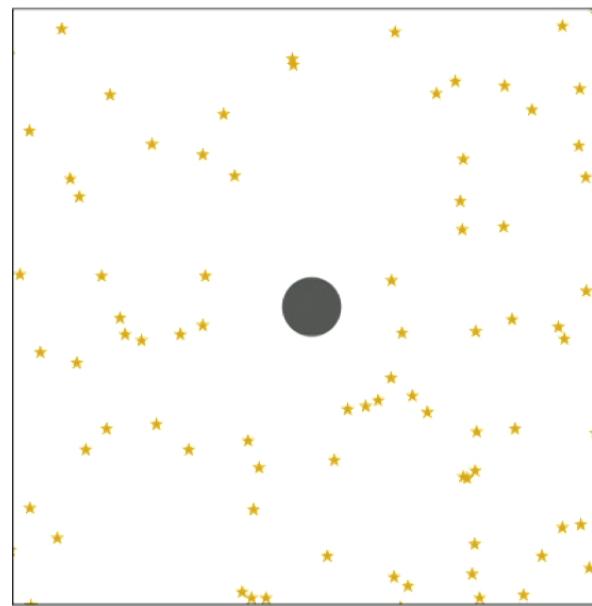
Astrometric weak lensing



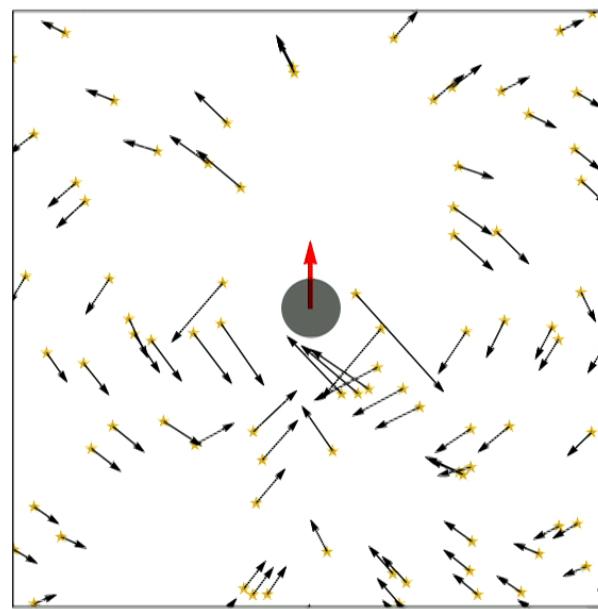
Astrometric weak lensing



Time-domain astrometric lensing

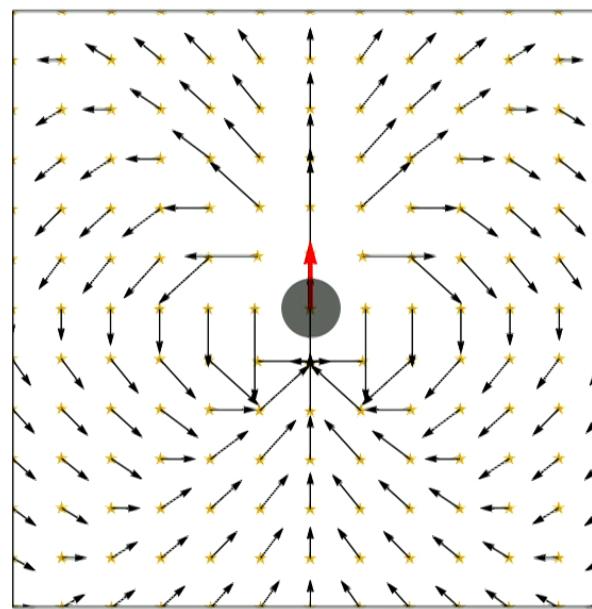


Time-domain astrometric lensing



Time-domain astrometric lensing

Observable:
Local velocity
template



K.V. Tilburg, A.M. Taki, N. Weiner
Halometry from Astrometry

Time-domain astrometric lensing

Motion of the lens during
the observation of the source



Impact parameter changes with time

$$\frac{\Delta b_{il}}{b_{il}} \ll 1$$

$$\Delta \dot{\theta}_{il} \sim \frac{4G_N M_l v_{il}}{b_{il}^2}$$

$$\Delta \dot{\theta}_{il} \sim 10 \frac{\mu\text{as}}{\text{y}} \left[\frac{M_l}{10^6 M_\odot} \right] \left[\frac{(1 \text{ pc})^2}{b_{il}^2} \right] \left[\frac{v_{il}}{10^{-3} c} \right]$$

Below current
experimental
precision

Time-domain astrometric lensing

Motion of the lens during
the observation of the source → Impact parameter changes with time
 $\frac{\Delta b_{il}}{b_{il}} \ll 1$

$$\Delta\dot{\theta}_{il} \sim \frac{4G_N M_l v_{il}}{b_{il}^2}$$

$$\Delta\dot{\theta}_{il} \sim 10 \frac{\mu\text{as}}{\text{y}} \left[\frac{M_l}{10^6 M_\odot} \right] \left[\frac{(1 \text{ pc})^2}{b_{il}^2} \right] \left[\frac{v_{il}}{10^{-3}c} \right]$$

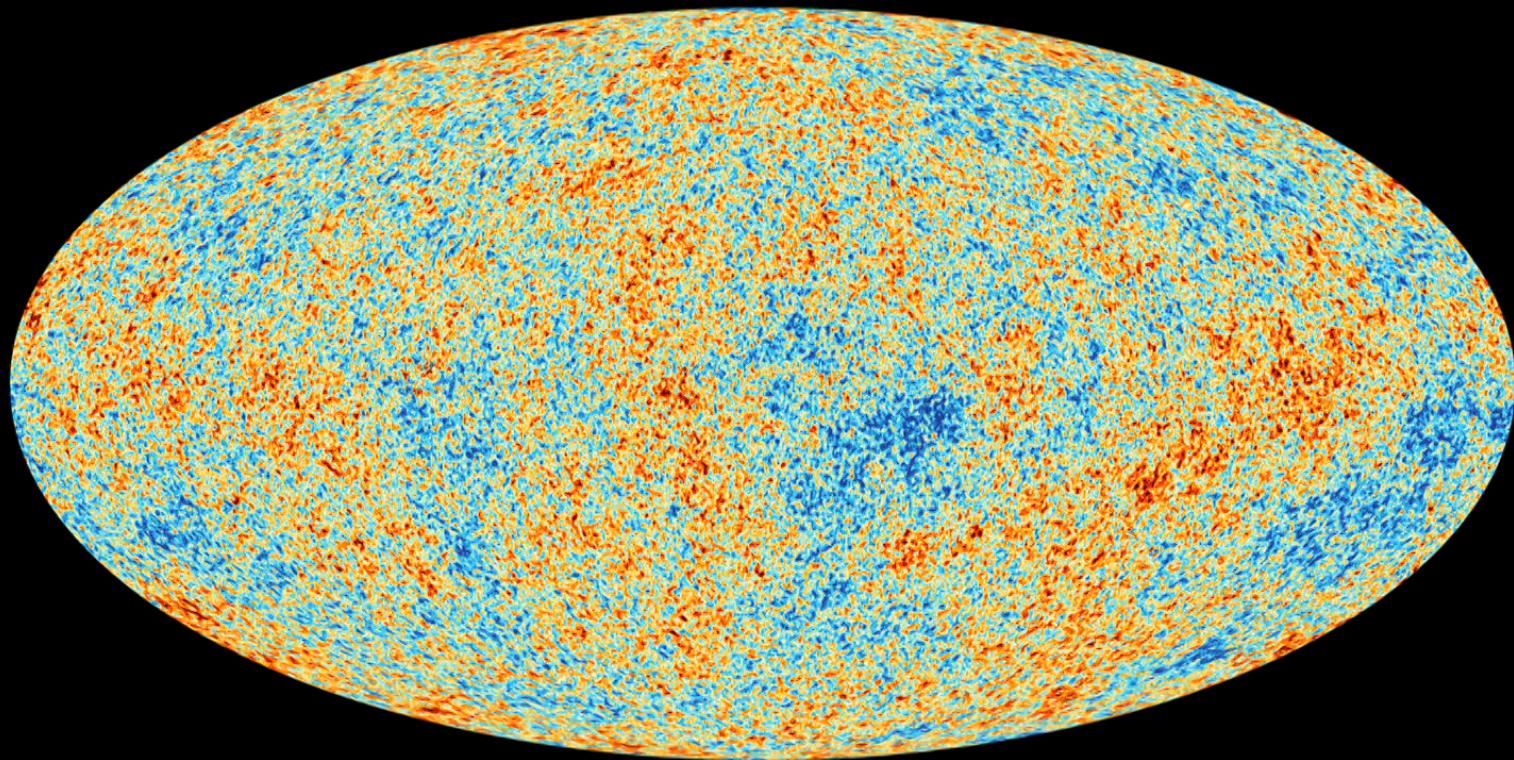
Below current
experimental
precision

but

- can be detected in **aggregate**
- precision will get better with time

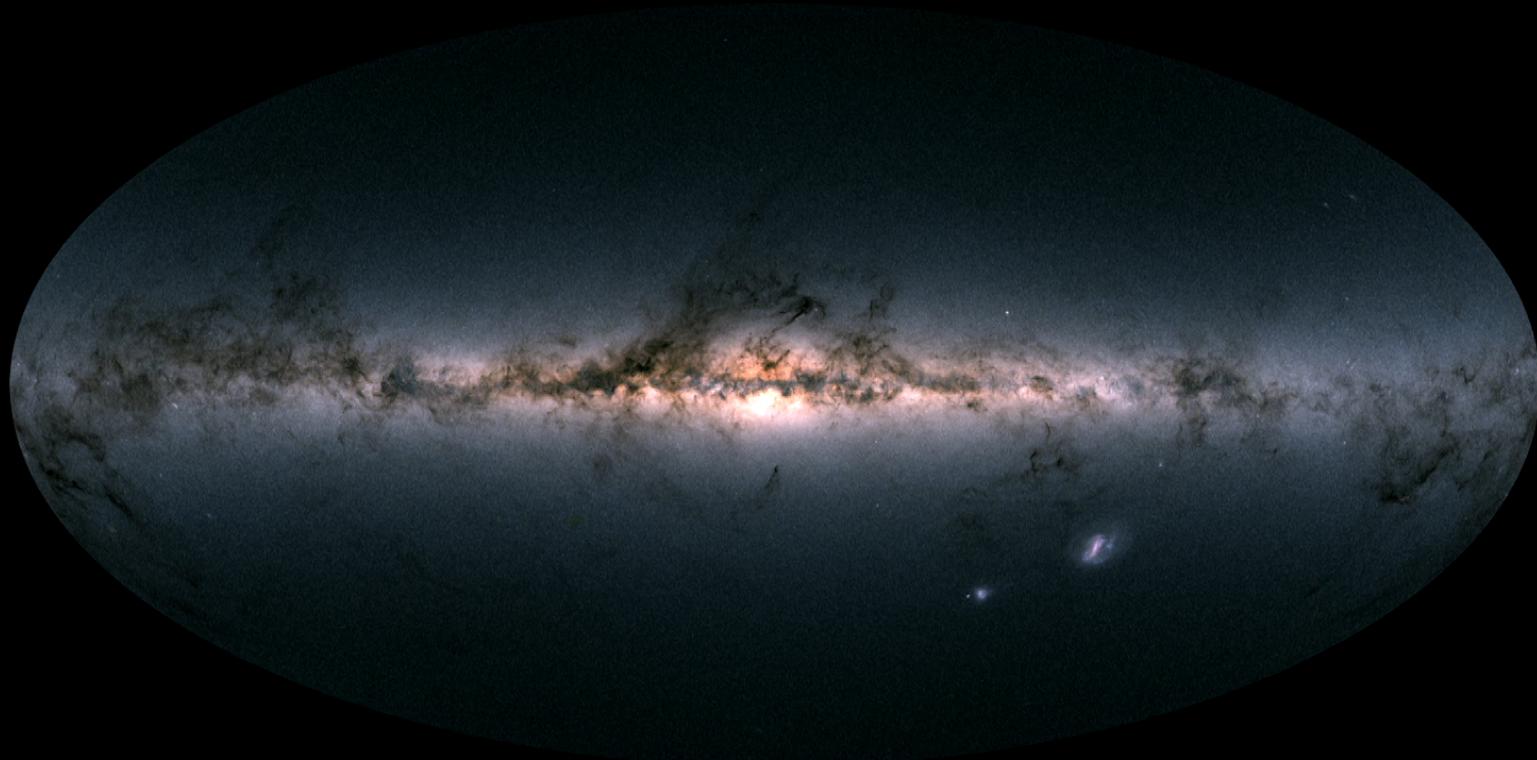
K.V. Tilburg, A.M. Taki, N. Weiner
Halometry from Astrometry

CMB Temperature Fluctuations



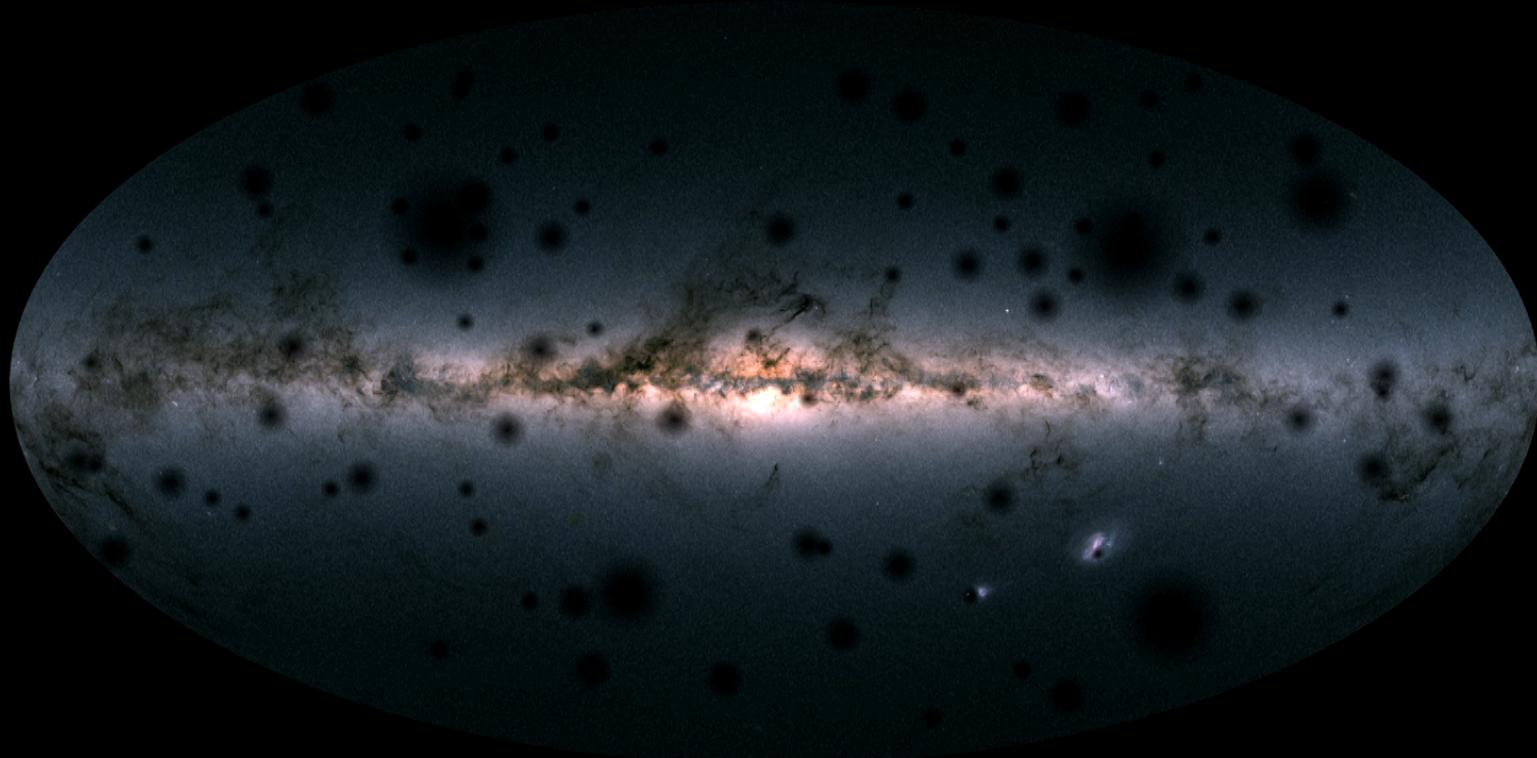
Planck

DM Density Fluctuations



ESA Gaia

DM Density Fluctuations



ESA Gaia

Lensing from DM substructure

Challenge:

For extended subhalos, the angular deflection is suppressed by the lens size

Solution:

Use high statistics and correlated effects!

K.V. Tilburg, A.M. Taki, N. Weiner
Halometry from Astrometry

Precision astrometry

ESA Gaia

- 1.7 billion stars
- velocities for 1.3 billion stars
- $\mathcal{O}(100 \mu\text{as})$ precision

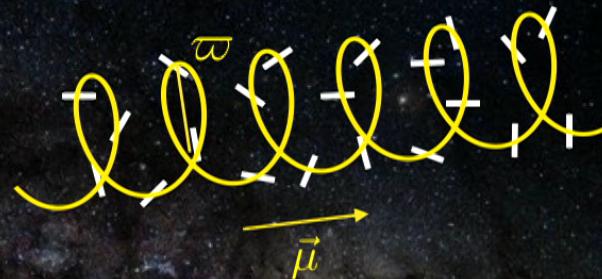
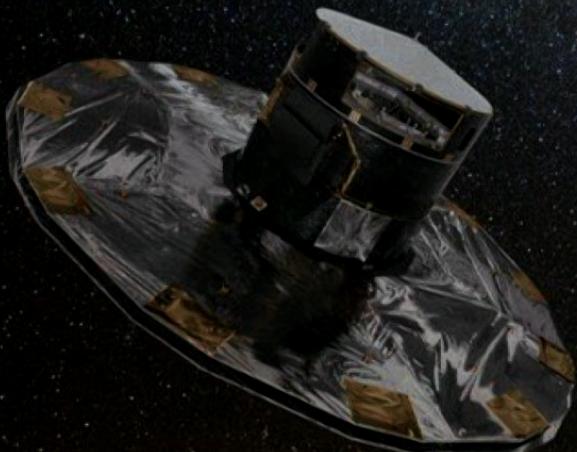


Repeated single star observations

Precision astrometry

ESA Gaia

- DR2 ~ 1 year ago
- 1.7 billion stars
- velocities for 1.3 billion stars
- $\mathcal{O}(100 \mu\text{as})$ precision



Repeated single star observations



5 parameters astrometric solution:

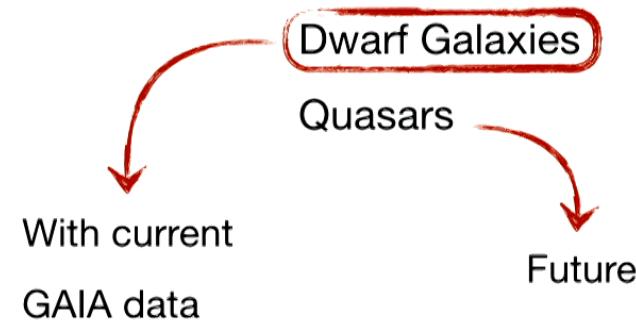
- 2d position
- 2d velocity $\vec{\mu}$
- parallax ϖ

Stellar targets

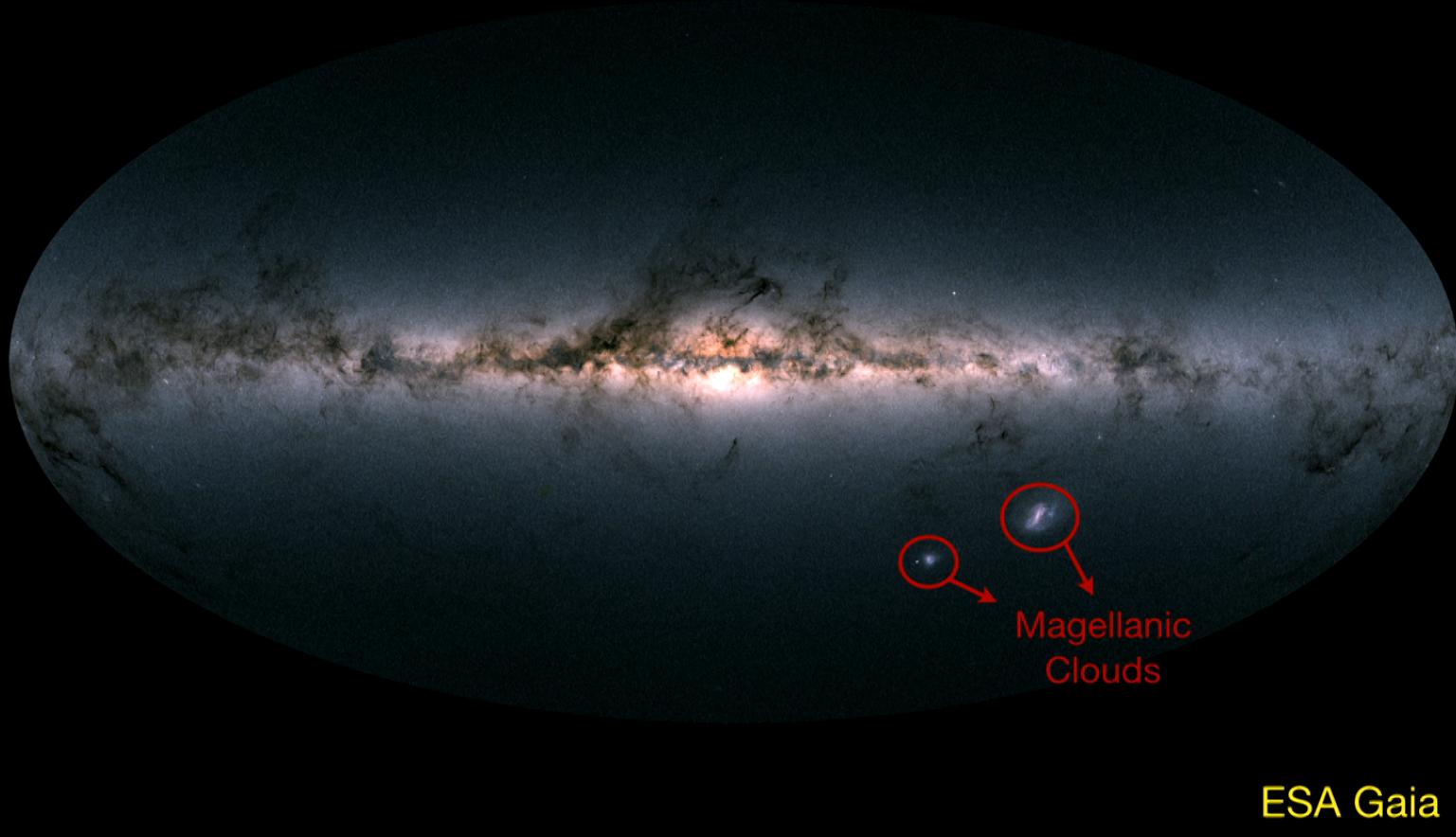
- Small intrinsic proper motion dispersion
 - A lot of DM along the line of sight
 - High number density
- } Objects which are far away:
Dwarf Galaxies
Quasars

Stellar targets

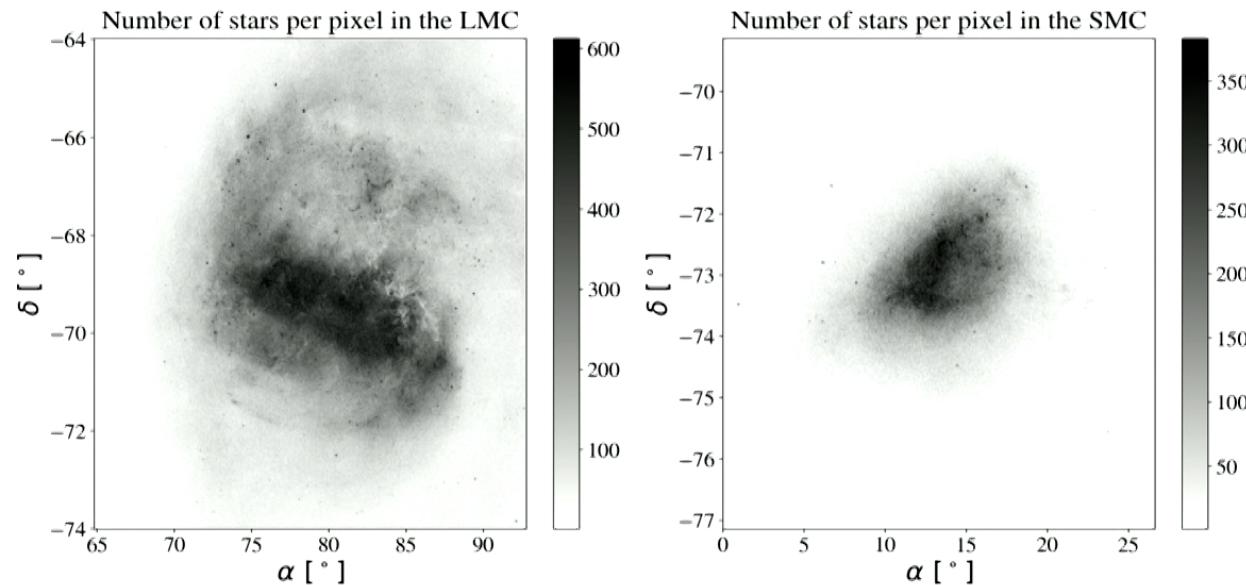
- Small intrinsic proper motion dispersion
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Stellar targets



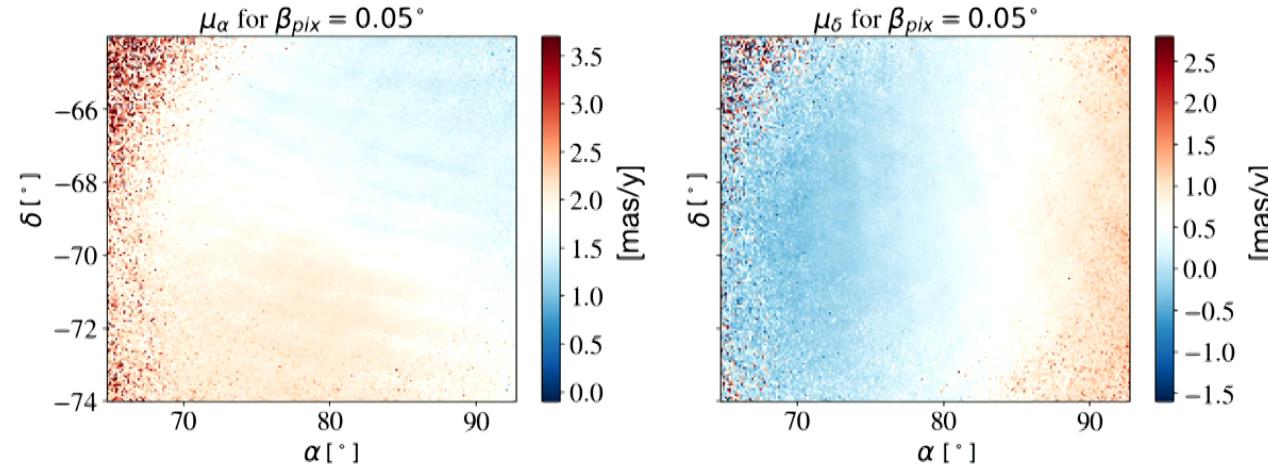
Magellanic Clouds



- 50 kpc away
- ~ 10 million stars
- $10^\circ \times 10^\circ$ on the sky

- 60 kpc away
- ~ 1.5 million stars
- $6^\circ \times 6^\circ$ on the sky

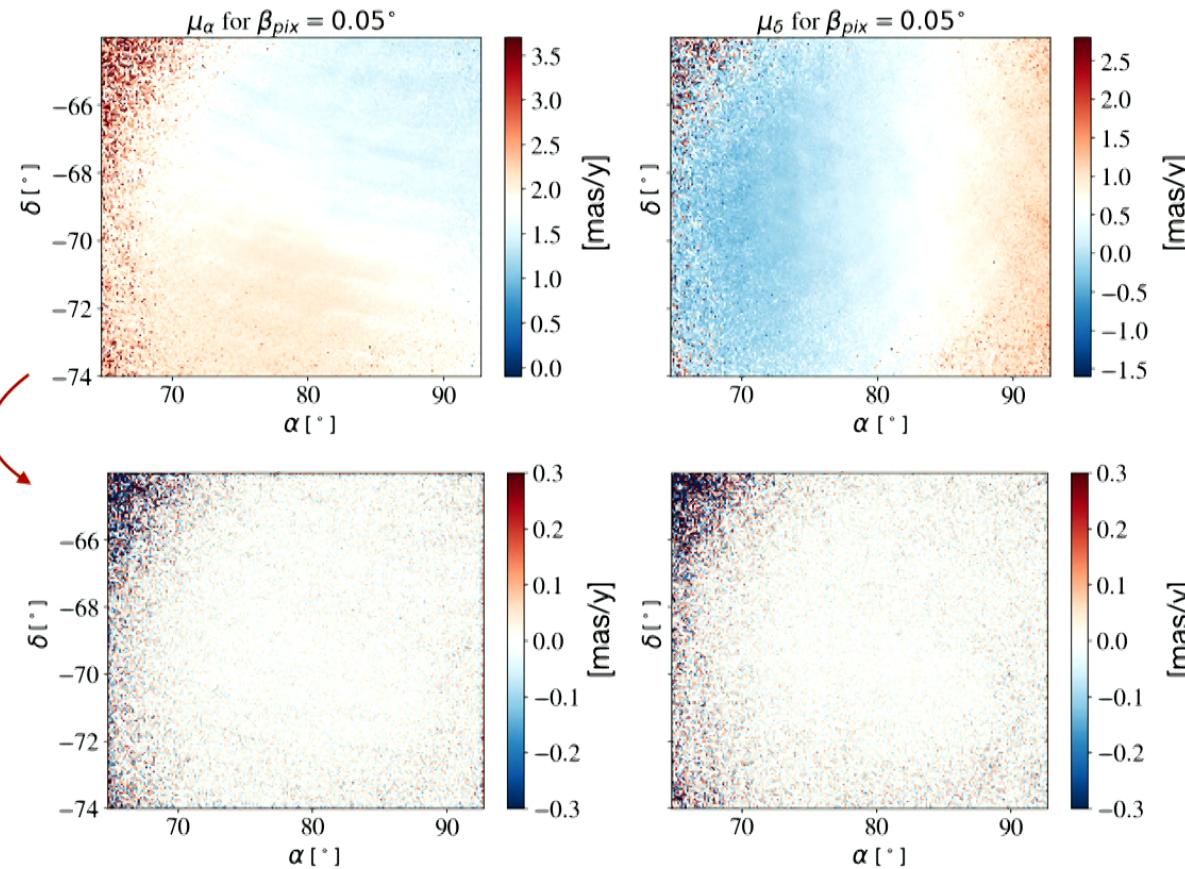
Background motion



1. The large scale motion is subtracted at scale $0.1^\circ \gg$ lensing effects
2. 3σ velocity outliers are removed to reduce foreground contamination

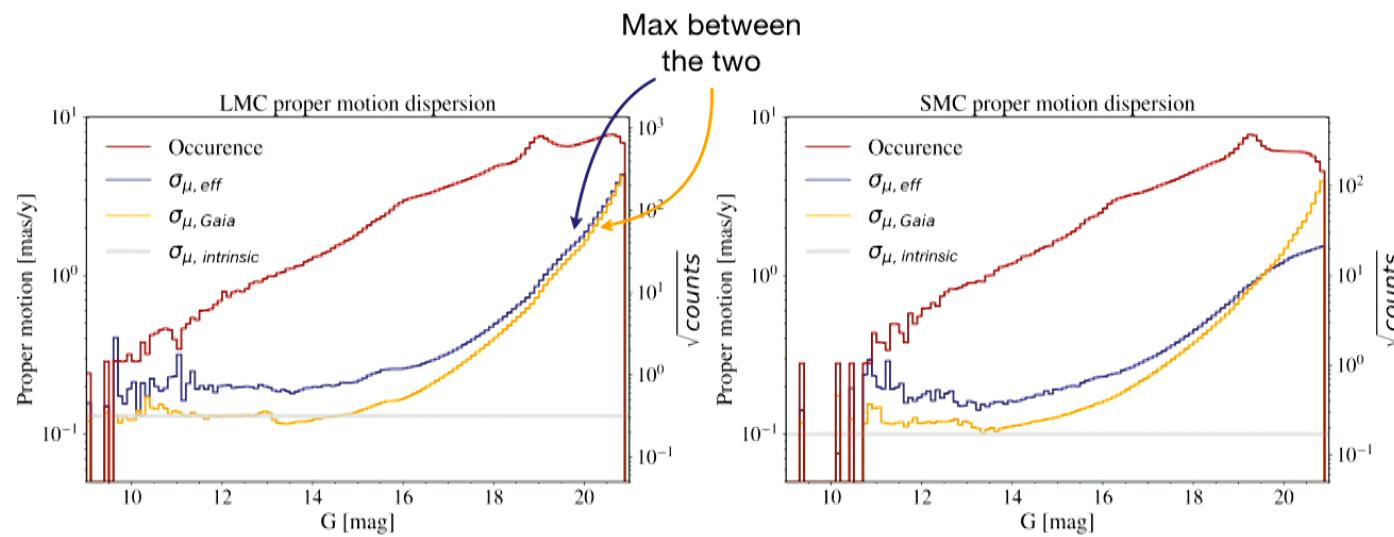
Background motion

Subtract
background
motion
&
remove
outliers.



Proper motion dispersion

The quality of the astrometric measurement depends on the stellar brightness



Outline

1. Astrometric weak lensing: lens targets
2. Precision astrometry
3. Template method and results

Local test statistic

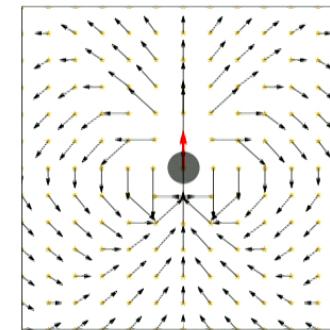
Hypothesis:

- lens with mass M_l and size r_l

Measurement:

- stars 2d velocities $\vec{\mu}_i$ with uncertainties $\sigma_{\mu,i}$

What is the **best test statistic**?



Local test statistic

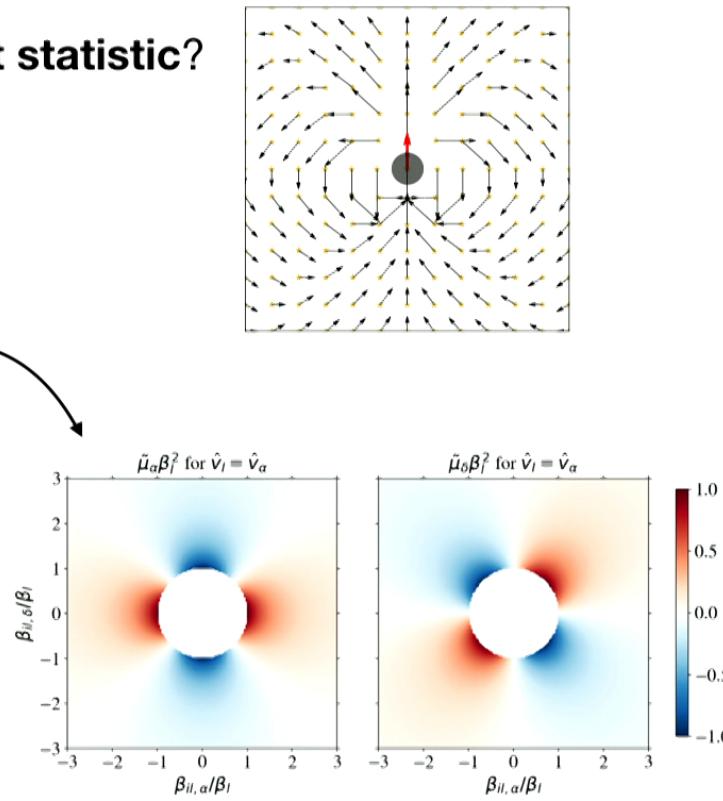
What is the **best test statistic**?

$$\mathcal{T} \equiv \sum_i \frac{\vec{\mu}_i \cdot \vec{\tilde{\mu}}_i}{\sigma_{\mu,i}^2}$$

Stellar velocity

Velocity uncertainty

Matched filter:



Signal-to-noise ratio

$$\mathcal{T} \equiv \sum_i \frac{\vec{\mu}_i \cdot \vec{\tilde{\mu}}_i}{\sigma_{\mu,i}^2} \quad \mathcal{N}^2 \equiv \sum_i \frac{|\vec{\tilde{\mu}}_i|^2}{\sigma_{\mu,i}^2}$$

Local test statistic

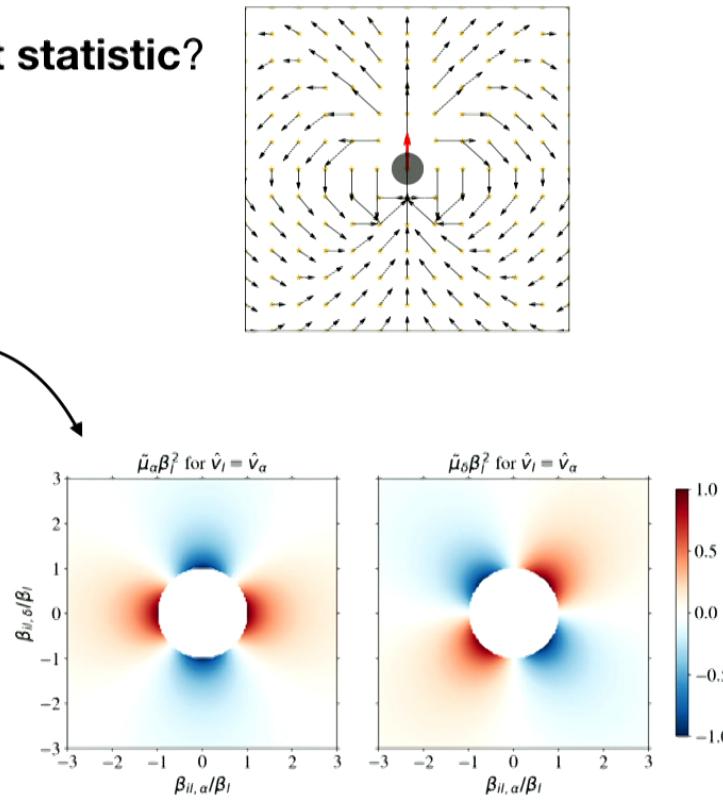
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Stellar velocity

Velocity uncertainty

Matched filter:

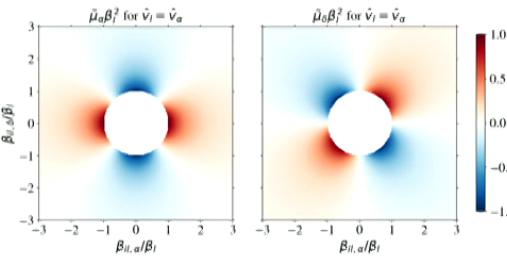


Signal-to-noise ratio

$$\mathcal{T} \equiv \sum_i \frac{\vec{\mu}_i \cdot \vec{\tilde{\mu}}_i}{\sigma_{\mu,i}^2} \quad \mathcal{N}^2 \equiv \sum_i \frac{|\vec{\tilde{\mu}}_i|^2}{\sigma_{\mu,i}^2}$$

For signal: $\langle \vec{\mu}_i \rangle = \underbrace{\frac{4G_N M_l \beta_l^2 v_l}{r_l^2} \times}_{C_l} \vec{\beta}_{\parallel,a}/\vec{\beta}_l$

$$\langle \mathcal{T} \rangle_{\text{signal}} = C_l \mathcal{N}^2$$

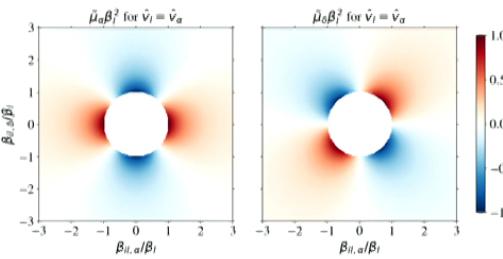


Signal-to-noise ratio

$$\mathcal{T} \equiv \sum_i \frac{\vec{\mu}_i \cdot \vec{\tilde{\mu}}_i}{\sigma_{\mu,i}^2} \quad \mathcal{N}^2 \equiv \sum_i \frac{|\vec{\tilde{\mu}}_i|^2}{\sigma_{\mu,i}^2}$$

For signal: $\langle \vec{\mu}_i \rangle = \underbrace{\frac{4G_N M_l \beta_l^2 v_l}{r_l^2} \times}_{C_l} \beta_{\parallel,a}/\beta_l$

$$\langle \mathcal{T} \rangle_{\text{signal}} = C_l \mathcal{N}^2$$



For noise: $\langle \vec{\mu}_i \rangle = 0 \quad \langle \vec{\mu}_i^2 \rangle = \sigma_{\mu,i}^2$

$$\langle \mathcal{T}^2 \rangle_{\text{noise}} = \mathcal{N}^2$$

Signal-to-noise ratio

For signal: $\langle \mathcal{T} \rangle_{\text{signal}} = C_l \mathcal{N}^2$

For noise: $\langle \mathcal{T}^2 \rangle_{\text{noise}} = \mathcal{N}^2$

$$\text{SNR} = \frac{\langle \mathcal{T} \rangle_{\text{signal}}}{\sqrt{\langle \mathcal{T}^2 \rangle_{\text{noise}}}} = C_l \mathcal{N} \propto \frac{M_l}{r_l D_l} \frac{\sqrt{\Sigma_s}}{\sigma_{\mu, \text{eff}}}$$

Signal-to-noise ratio

For signal: $\langle \mathcal{T} \rangle_{\text{signal}} = C_l \mathcal{N}^2$

For noise: $\langle \mathcal{T}^2 \rangle_{\text{noise}} = \mathcal{N}^2$

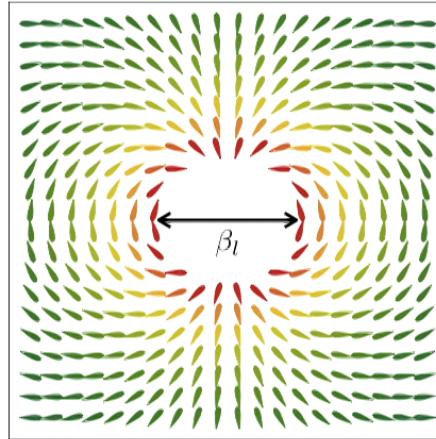
$$\text{SNR} = \frac{\langle \mathcal{T} \rangle_{\text{signal}}}{\sqrt{\langle \mathcal{T}^2 \rangle_{\text{noise}}}} = C_l \mathcal{N} \propto \frac{M_l}{r_l D_l} \frac{\sqrt{\Sigma_s}}{\sigma_{\mu, \text{eff}}}$$

Maximized by the closest lens: $D_{l,\min} \propto \left(\frac{M_l}{\Omega_l} \frac{1}{\Delta\Omega} \right)^{1/3}$

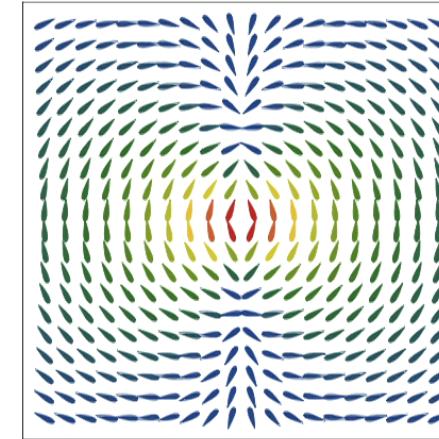
$$\text{SNR} \propto \frac{M_l^{2/3} \Omega_l^{1/3}}{r_l} \frac{\Delta\Omega^{1/3} \sqrt{\Sigma_s}}{\sigma_{\mu, \text{eff}}}$$

Truncated profile vs NFW

Truncated density profile



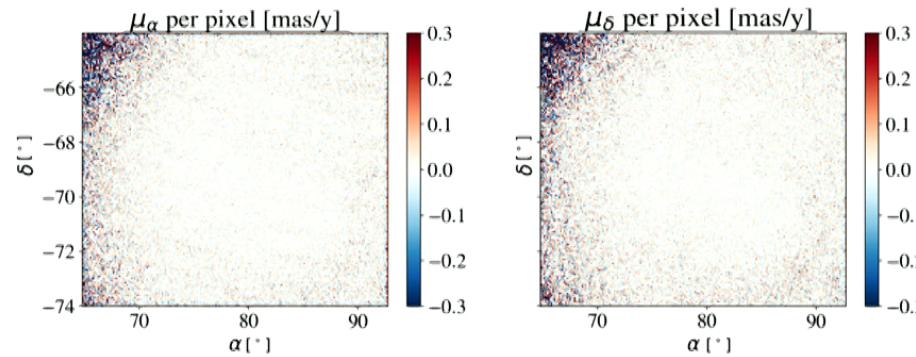
NFW density profile



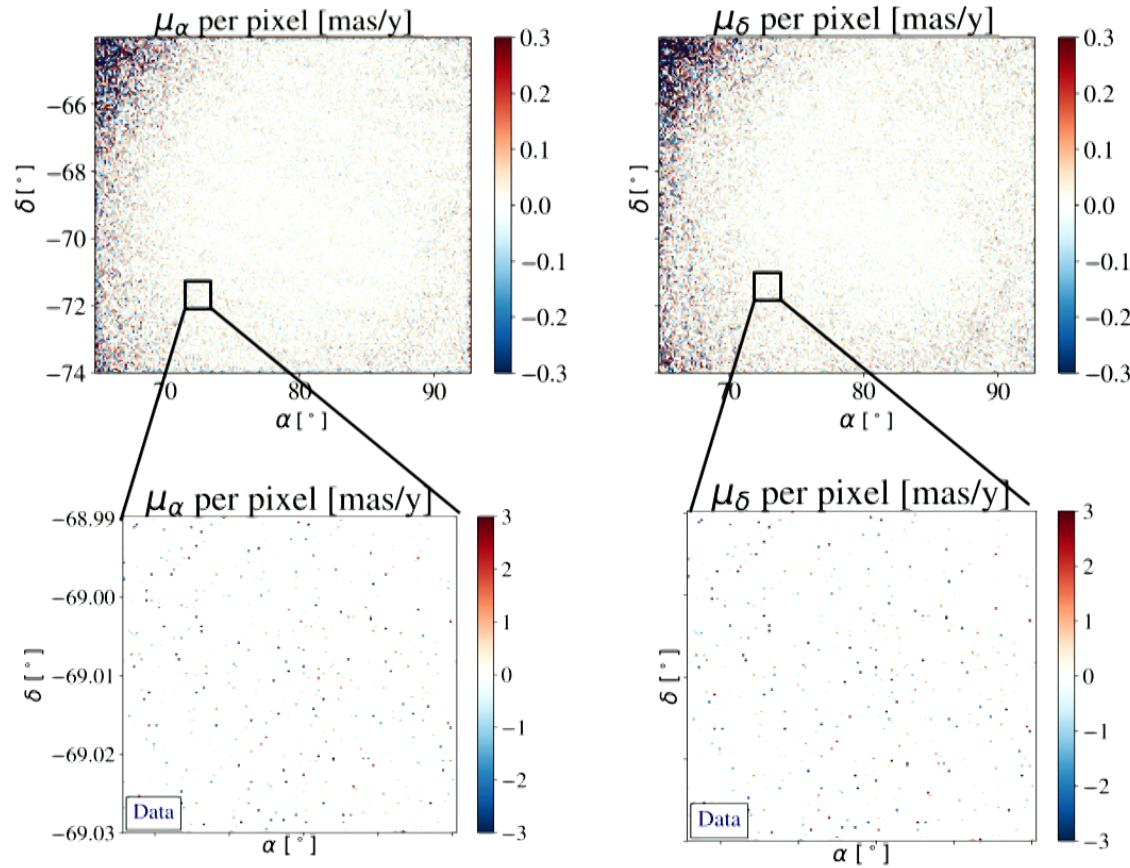
~ 50% of SNR

What do we actually do?

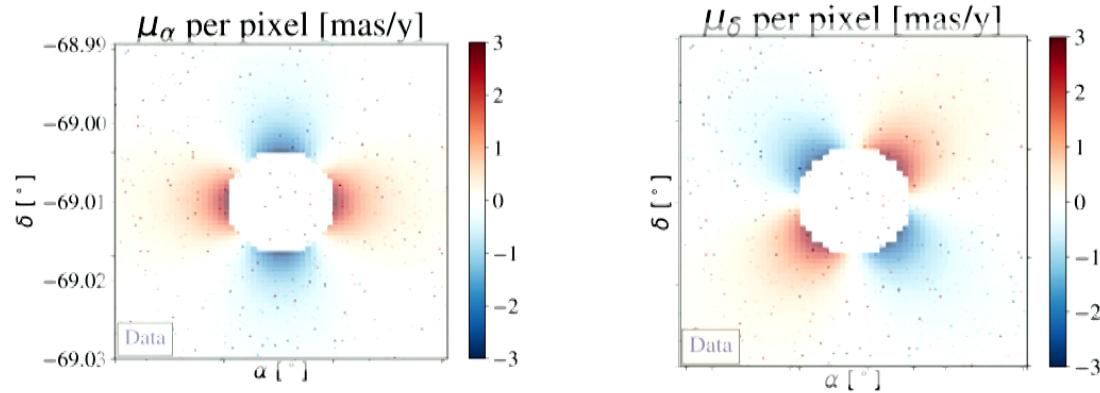
$$\mathcal{T} \equiv \sum_i \frac{\vec{\mu}_i \cdot \tilde{\vec{\mu}}_i}{\sigma_{\mu,i}^2}$$



What do we actually do?



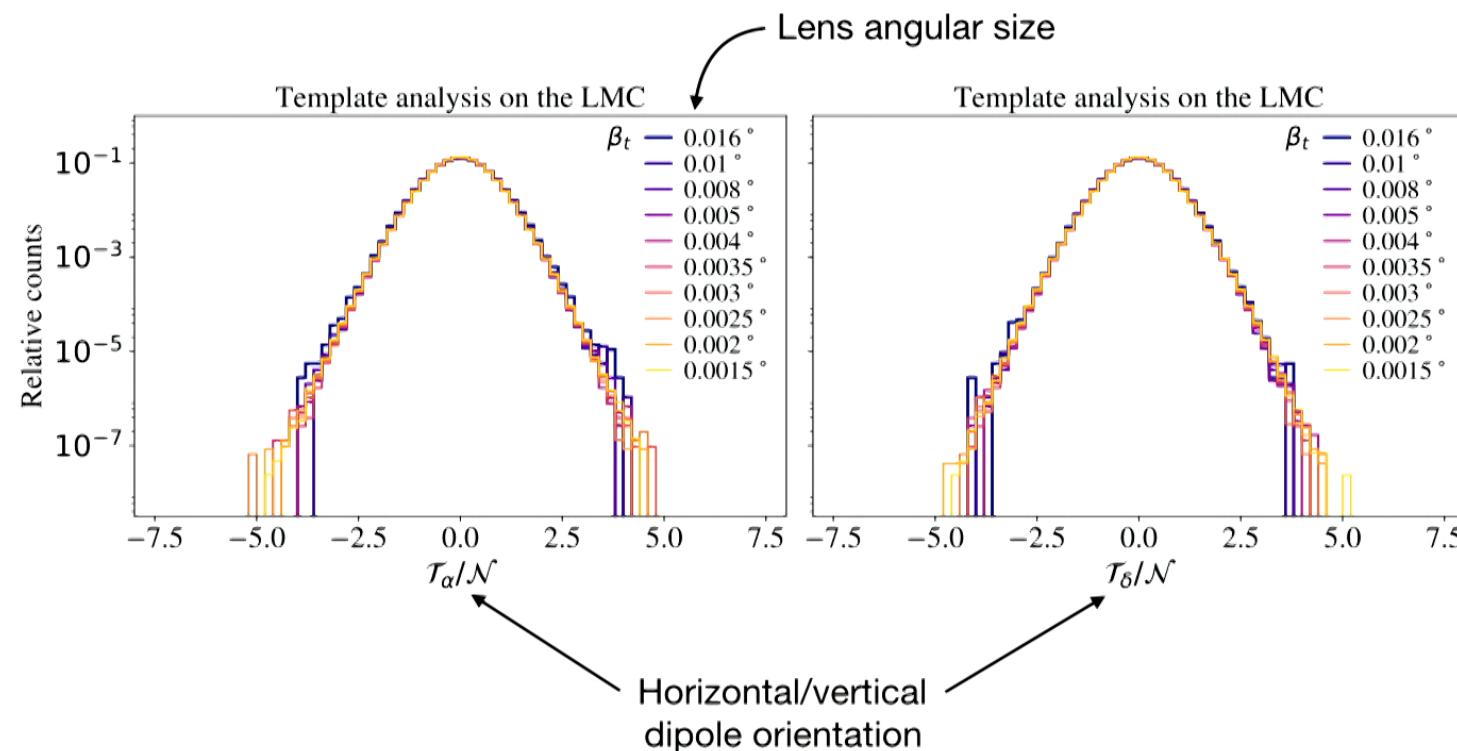
What do we actually do?



$$\Rightarrow \mathcal{T} \equiv \sum_i \frac{\vec{\mu}_i \cdot \vec{\tilde{\mu}}_i}{\sigma_{\mu,i}^2}$$

Repeat for different template locations: scan over the sky

Template sanning



Global test statistic

How do we test for a **population** of lenses?

Global test statistic

Simplifying **assumptions**:

- most of the signal comes from the closest lens
(larger angular size $\beta_l = r_l/D_l$)
- the measured errors are gaussian

Likelihood

Simplifying **assumptions**:

- most of the signal comes from the closest lens
(larger angular size $\beta_l = r_l/D_l$)
- the measured errors are gaussian

$$\mathcal{L}(\vec{\mu}_i | M_l, r_l) = \underbrace{f_1(\vec{\theta}_l, \beta_l) f_2(\vec{v}_l)}_{\text{Probability of a lens:}} \prod_i \frac{1}{2\pi\sigma_{\mu,i}^2} \exp \left[-\frac{(\vec{\mu}_i - \Delta\vec{\mu}_i)^2}{2\sigma_{\mu,i}^2} \right] \underbrace{\quad}_{\text{Probability for the observed star velocities}}$$

at position $\vec{\theta}_l$
with size β_l
with velocity \vec{v}_l

Likelihood ratio

The best **test statistic** is the maximum **Likelihood Ratio**:

$$\text{LR} = \frac{\mathcal{L}(\vec{\mu}_i | M_l, r_l)}{\mathcal{L}(\vec{\mu}_i | \text{no lens})}$$

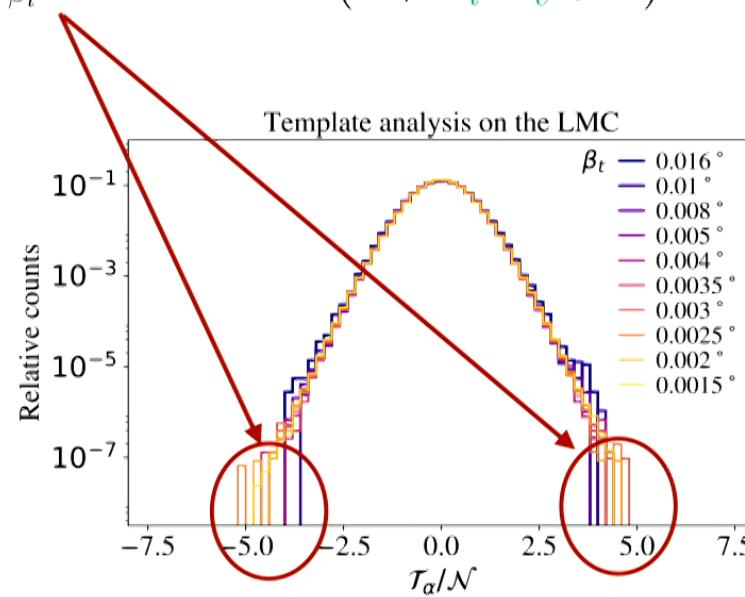
$$\max\{\ln(\text{LR})\} = \max_{\vec{\theta}_l \beta_l} \frac{C_l^2 \sigma_v^2 \mathcal{N}^2 (\mathcal{T}^2 / \mathcal{N}^2 - \vec{v}_0^2 / \sigma_v^2) + 2 C_l \vec{\mathcal{T}} \cdot \vec{v}_0}{2(1 + C_l^2 \sigma_v^2 \mathcal{N}^2)} + A(\rho_l, \beta_l)$$

Preferred lens
velocity direction
(observer velocity)

$$\vec{\mathcal{T}} = \{\mathcal{T}_\alpha, \mathcal{T}_\delta\}$$

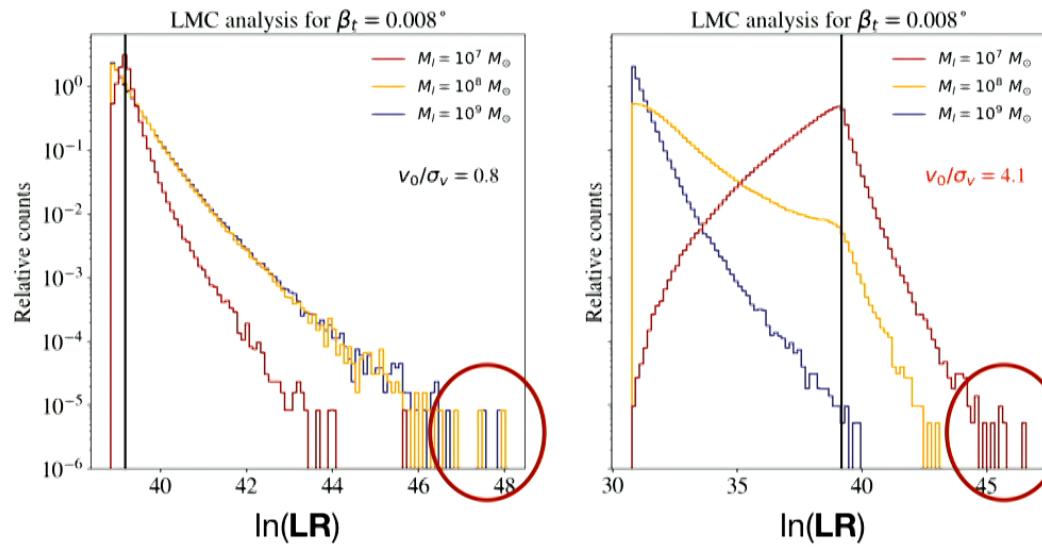
Optimal discriminant

$$\max\{\ln(\text{LR})\} = \max_{\vec{\theta}_l \beta_l} \frac{C_l^2 \sigma_v^2 \mathcal{N}^2 (\mathcal{T}^2/\mathcal{N}^2 - \vec{v}_0^2/\sigma_v^2) + 2 \vec{C}_l \cdot \vec{v}_0}{2(1 + C_l^2 \sigma_v^2 \mathcal{N}^2)} + A(\rho_l, \beta_l)$$



Optimal discriminant

$$\max\{\ln(\text{LR})\} = \max_{\vec{\theta}_l \beta_l} \frac{C_l^2 \sigma_v^2 \mathcal{N}^2 (\mathcal{T}^2 / \mathcal{N}^2 - v_0^2 / \sigma_v^2) + 2 \vec{C}_l \cdot \vec{v}_0}{2(1 + C_l^2 \sigma_v^2 \mathcal{N}^2)} + A(\rho_l, \beta_l)$$



Optimal discriminant

$$\max\{\ln(\text{LR})\} = \max_{\vec{\theta}_l \beta_l} \frac{C_l^2 \sigma_v^2 \mathcal{N}^2 (\mathcal{T}^2 / \mathcal{N}^2 - v_0^2 / \sigma_v^2) + 2 C_l \vec{\mathcal{T}} \cdot \vec{v}_0}{2(1 + C_l^2 \sigma_v^2 \mathcal{N}^2)} + A(\rho_l, \beta_l)$$

In practice:

- the measured noise is not gaussian
- there is more than one lens

The true **LR** is much
more complicated!



Use **signal simulations**

Setting the limit

Given the lens parameters: M_l, r_l, Ω_l

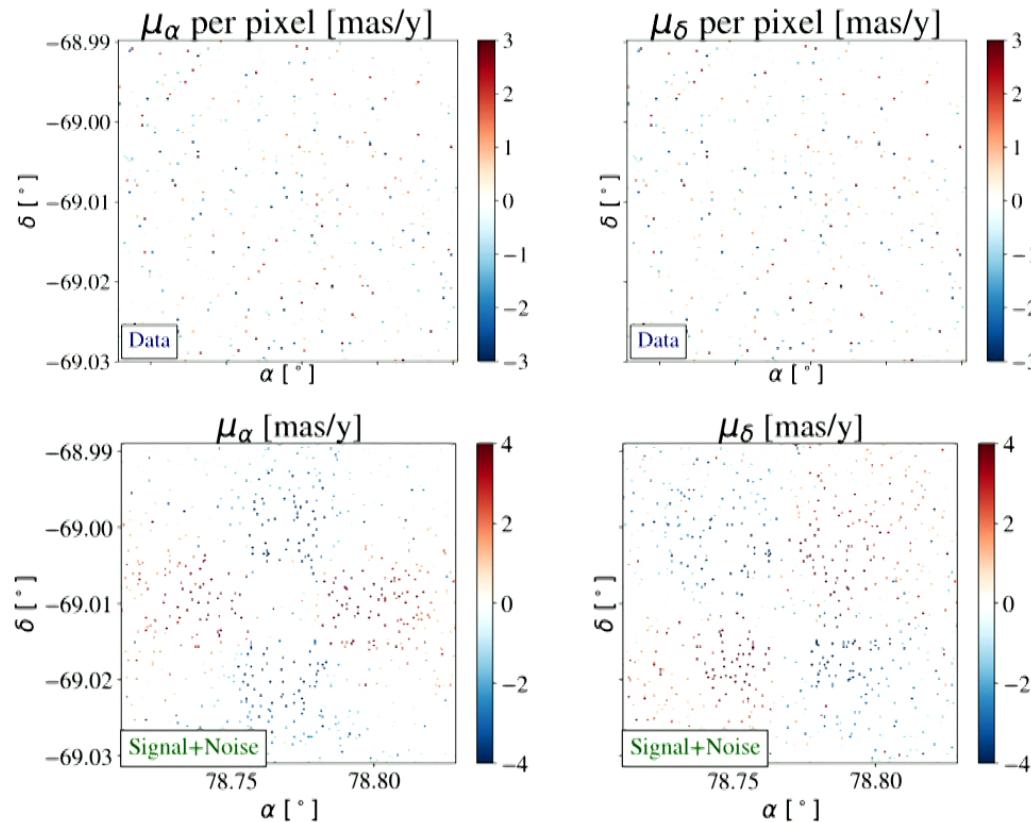
1. “Fake” data samples are generated injecting signal + noise (data-driven)
2. The optimal test statistic is computed for ***data*** and ***simulations***
3. If in 90% of the ***simulations***

$$\max(\text{LR})_{\text{simulation}} > \max(\text{LR})_{\text{data}}$$

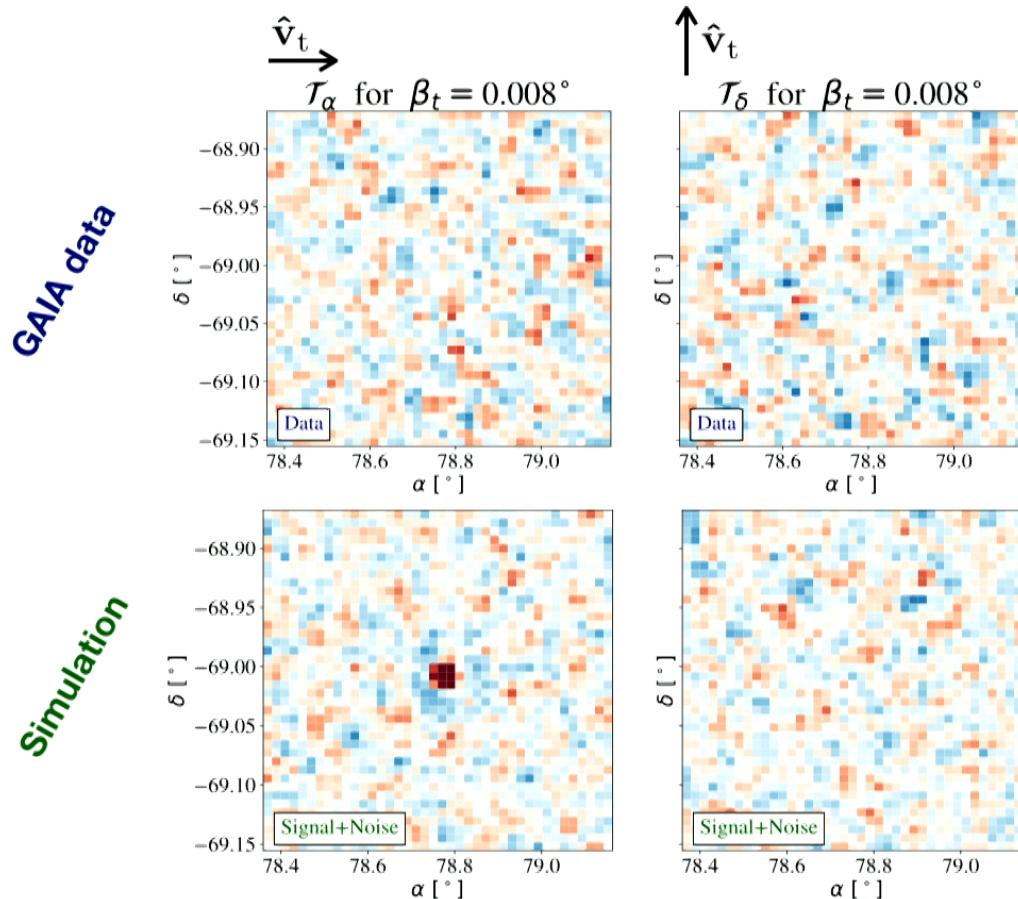
the parameter point is excluded at 90% CL.

Simulated signal

GAIA data
Simulation



Template scanning



$$M_{\text{lens}} = 10^8 M_\odot$$

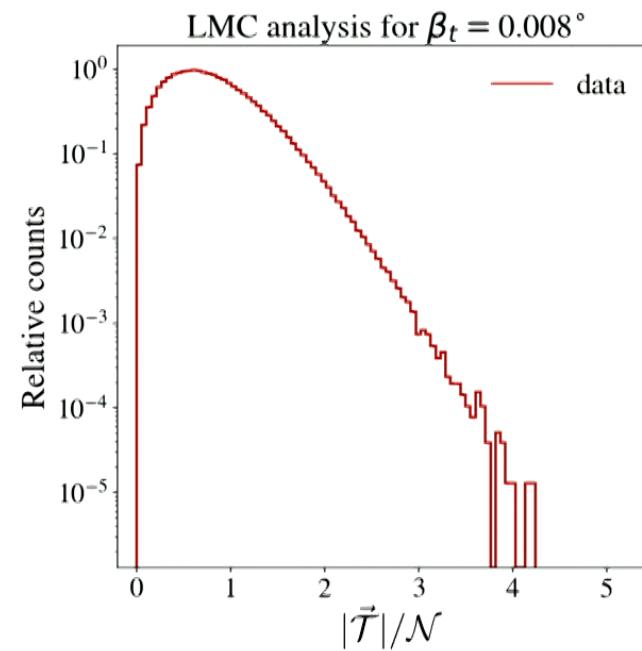
$$r_{\text{lens}} = 1 \text{ pc}$$

$$v_{\text{lens}} = 0.001$$

\hat{v}_{lens}
→

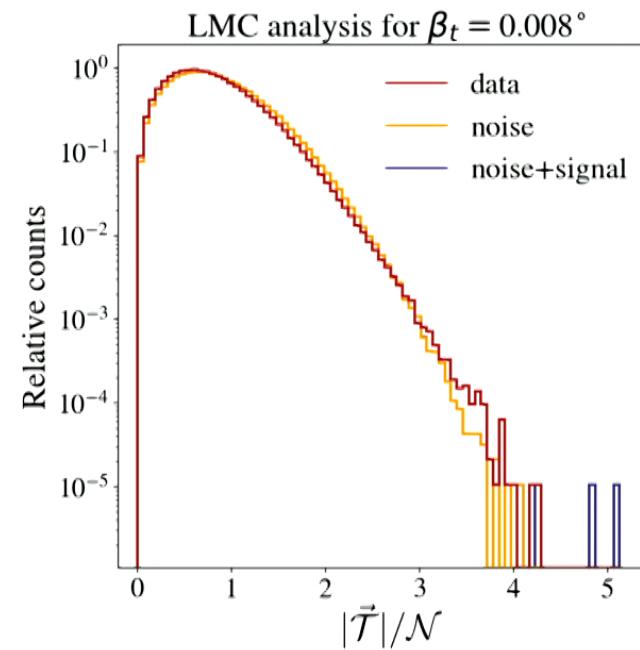
Test statistic

Distribution of the test statistic computed at all possible lens locations



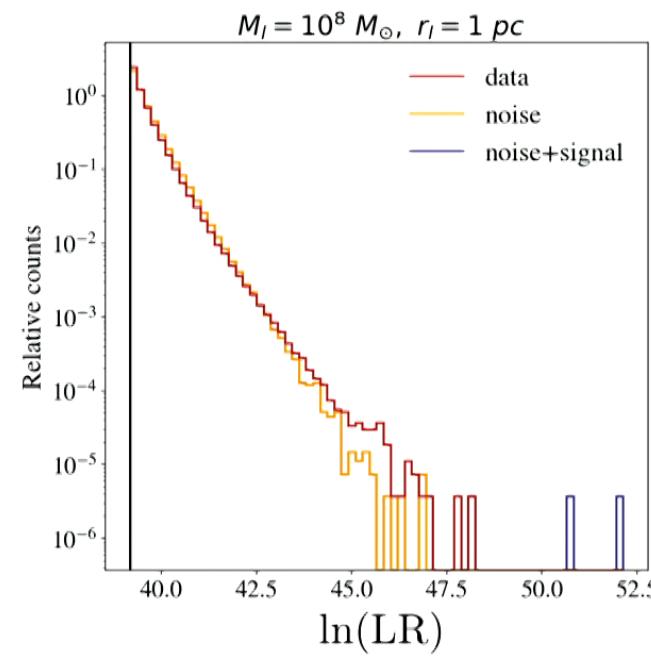
Test statistic

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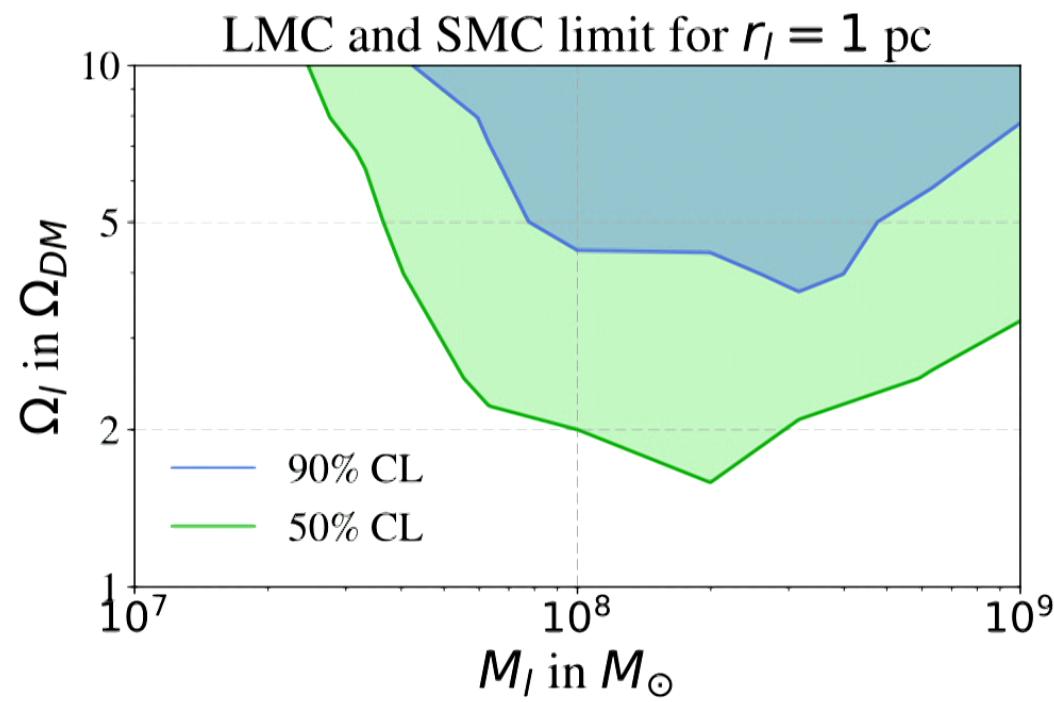


Test statistic

Distribution of the test statistic computed at all possible lens locations



Set limit



Projections

Lens properties:

- mass M_l
- size r_l
- abundance Ω_l

Sources properties:

- number of stars N_s
- proper motion dispersion $\sigma_{\mu,\text{eff}}$
- solid angle $\Delta\Omega$

$$\text{SNR} \propto \frac{\Omega_l^{1/3} M_l^{2/3}}{r_l} \frac{N_s^{1/2}}{\Delta\Omega^{1/6} \sigma_{\mu,\text{eff}}}$$

Projections

$$\text{SNR} \propto \frac{\Omega_l^{1/3} M_l^{2/3}}{r_l} \frac{N_s^{1/2}}{\Delta\Omega^{1/6} \sigma_{\mu,\text{eff}}}$$

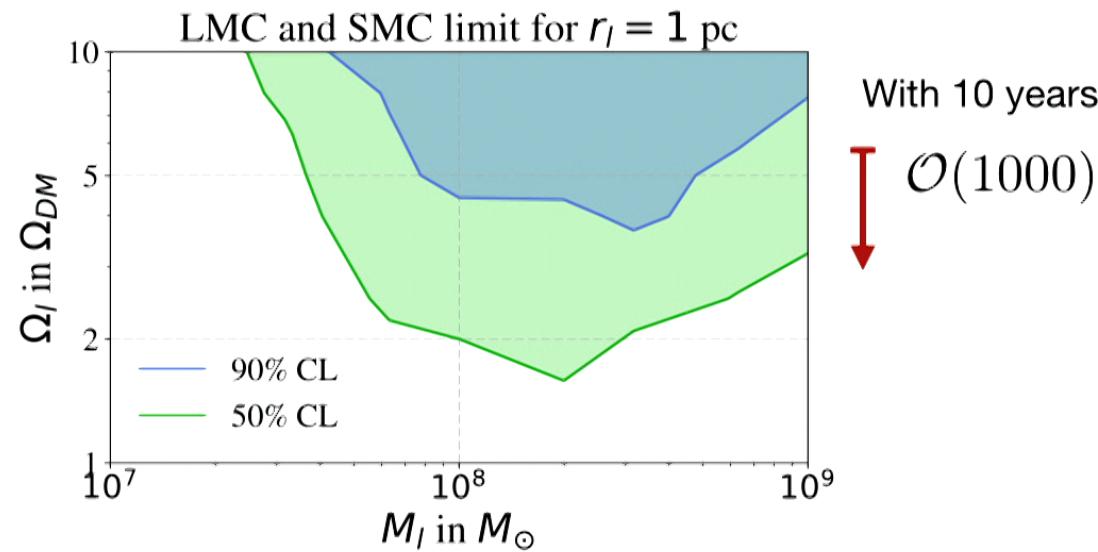
$$\Omega_l \propto \sigma_{\mu,\text{eff}}^3 \propto t^{-9/2}$$

↑

$$\sigma_{\mu,\text{eff}} \propto t^{-3/2}$$

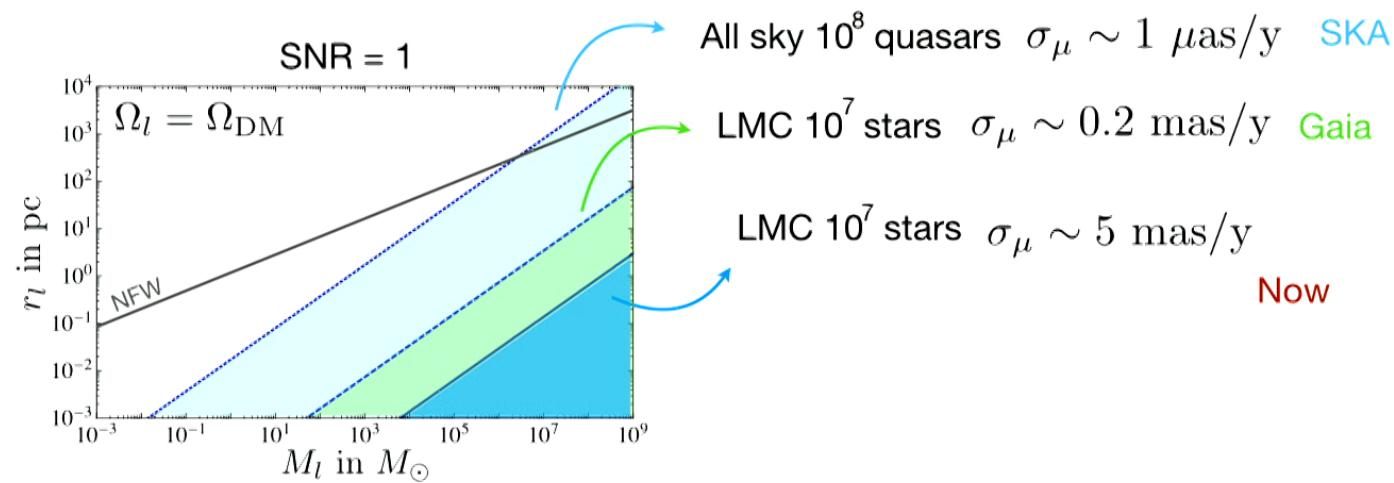
Projections

$$\Omega_l \propto \sigma_{\mu, \text{eff}}^3 \propto t^{-9/2}$$



Projections

$$\text{SNR} \propto \frac{\Omega_l^{1/3} M_l^{2/3}}{r_l} \frac{N_s^{1/2}}{\Delta\Omega^{1/6} \sigma_{\mu, \text{eff}}}$$





High-resolution Space Telescope Proper Motion Collaboration

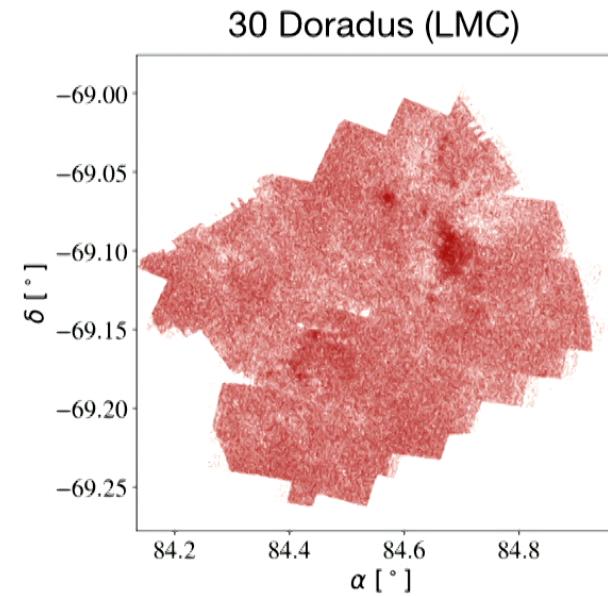
Hubble Space Telescope
repeated exposures:

- Smaller field of view
- Larger number density of $\sim 10^{10}$

(LMC in Gaia 10^8)



Sensitive to smaller lens masses



Other methods

- Extragalactic strong gravitational lensing (multiply imaged quasars)

S. Mao and P. Schneider

Evidence for substructure in lens galaxies?

- Gravitational perturbations in stellar streams

A. Bonaca, D. Hogg, A. Price-Whelan and C. Conroy

The Spur and the Gap in GD-1: Dynamical evidence for a dark substructure in the Milky Way halo

$$r_l \lesssim 30 \text{ pc} \quad M_l \sim 10^6 - 10^8 \text{ } M_{\odot}$$

- Pulsar timing observations

E. R. Siegel, M. P. Hertzberg and J. N. Fry

Probing DM Halo Substructure with Pulsar Timing

S. Baghram, N. Afshordi and K. Zurek

Prospects for Detecting DM Halo Substructure with Pulsar Timing

- Milky Way stars phase-space distribution

M. Buschmann, J. Kopp, B. R. Safdi and C.L. Wu

Stellar Wakes from Dark Matter Subhalos

Summary

- DM halo substructure: time-domain astrometric lensing effects
- Modern astrometric surveys: precision + statistics
- Velocity template: real data analysis!



Limits on DM halo substructure
(mass, size and abundance)

Further tests:
• effects on the stellar parallaxes
• closer look at the lens location