

# Reconstructing the local dark matter velocity distribution from direct detection experiments

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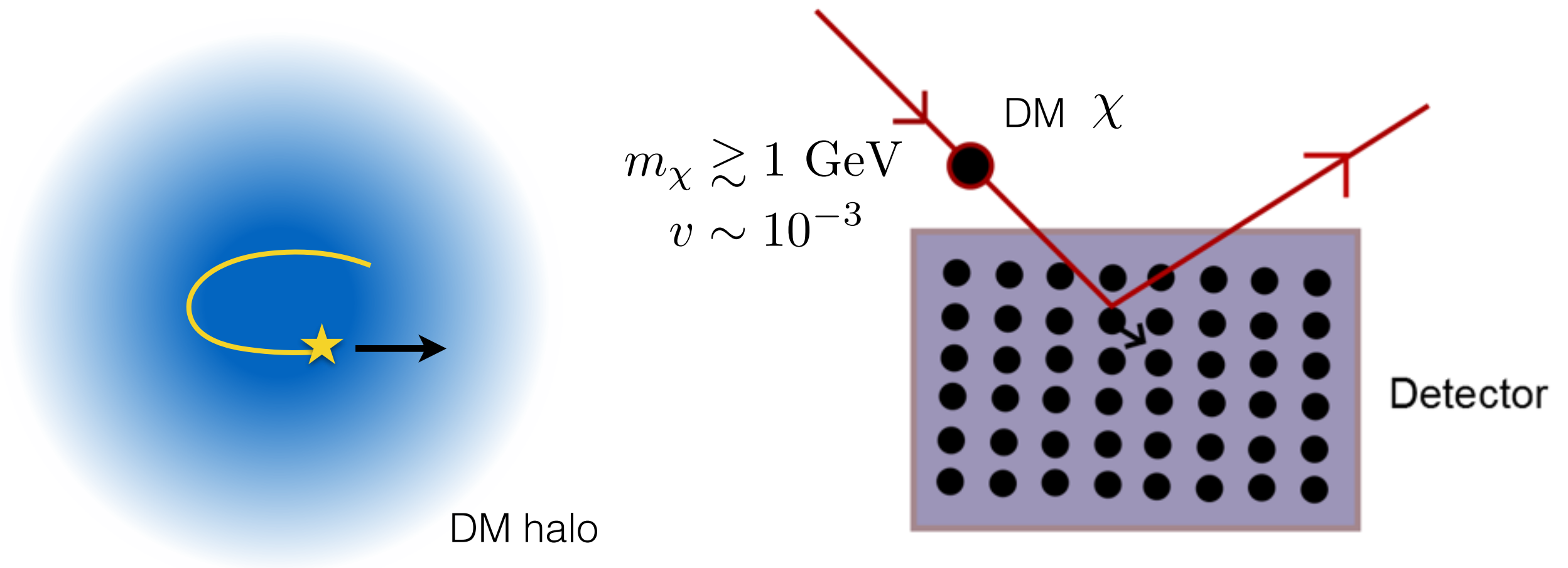
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 @BradleyKavanagh

# Direct detection experiments



I've been worrying about the DM velocity distribution for a while now...

*Improved determination of the WIMP mass from direct detection data*

**B. J. Kavanagh** and A. M. Green

[Phys. Rev. D 86, 065027 \(2012\)](#), [arXiv:1207.2039](#)

*Model independent determination of the dark matter mass from direct detection*

**B. J. Kavanagh** and A. M. Green

[Phys. Rev. Lett. 111, 031302 \(2013\)](#), [arXiv:1303.6868](#)

*Parametrizing the local dark matter speed distribution: a detailed analysis*

**B. J. Kavanagh**

[Phys. Rev. D 89, 085026 \(2014\)](#), [arXiv:1312.1852](#)

*Probing WIMP particle physics and astrophysics with direct detection and neutrino telescope data*

**B. J. Kavanagh**, M. Fornasa, A. M. Green

[Phys. Rev. D. 91, 103533 \(2015\)](#), [arXiv:1410.8051](#)

*Discretising the velocity distribution for directional dark matter experiments*

**B. J. Kavanagh**

[JCAP 07 \(2015\) 019](#), [arXiv:1502.04224](#)

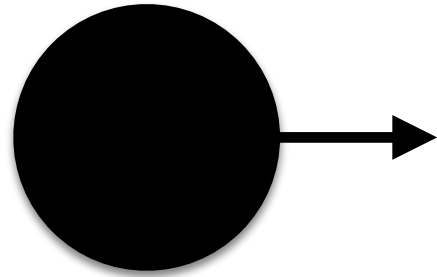
*Reconstructing the three-dimensional local dark matter velocity distribution*

**B. J. Kavanagh**, C. A. J. O'Hare

[arXiv:1609.08630](#)

# The problem

When we observe a nuclear recoil with energy  $E_R$   
we cannot distinguish between:



Heavy, slow DM



Light, fast DM

---

What can we do?

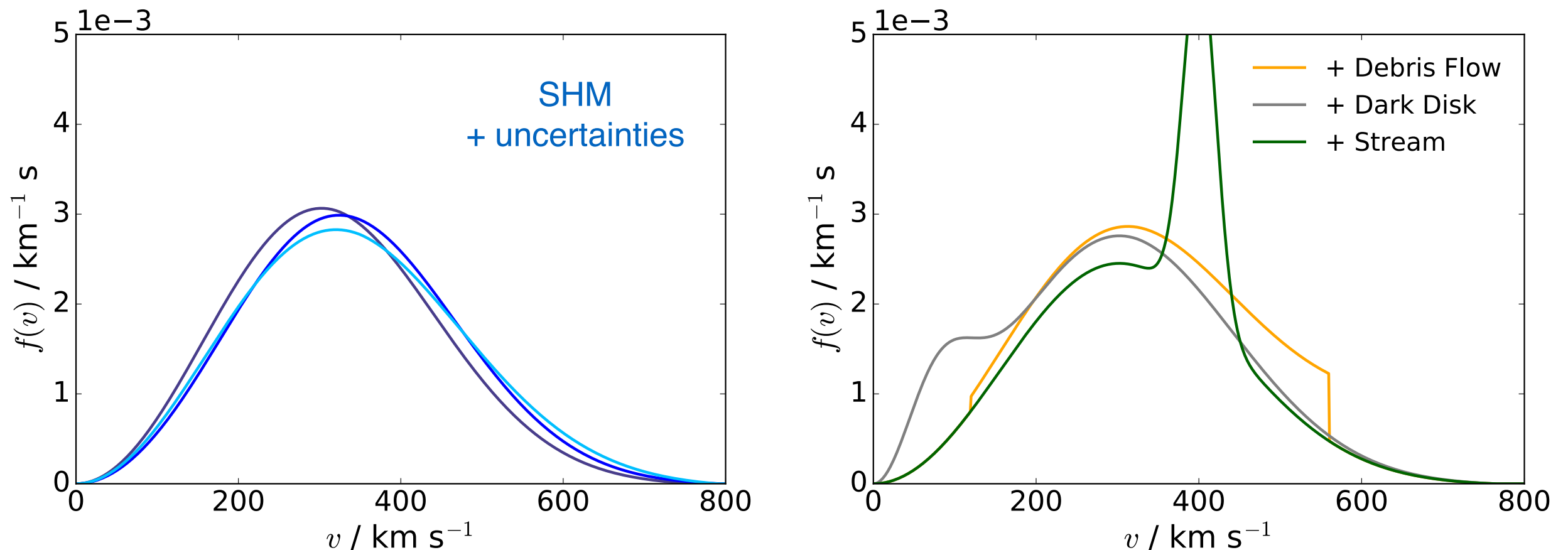
Typically, aim to fix DM speeds (or rather the  
*speed distribution*  $f(v)$ ) and measure DM mass

*In reality, we don't know  $f(v)$  precisely, and  
we would ideally like to measure it!*



# Astrophysical uncertainties

Typically assume an isotropic, isothermal halo leading to a smooth Maxwell-Boltzmann distribution - the Standard Halo Model (**SHM**)



But simulations suggest there could be substructure:

Debris flows [Kuhlen et al. \[1202.0007\]](#)

Dark disk [Pillepich et al. \[1308.1703\]](#), [Schaller et al. \[1605.02770\]](#)

Tidal stream [Freese et al. \[astro-ph/0309279, astro-ph/0310334\]](#)

# Reconstructing the *speed* distribution

Write a *general parametrisation* for the speed distribution:

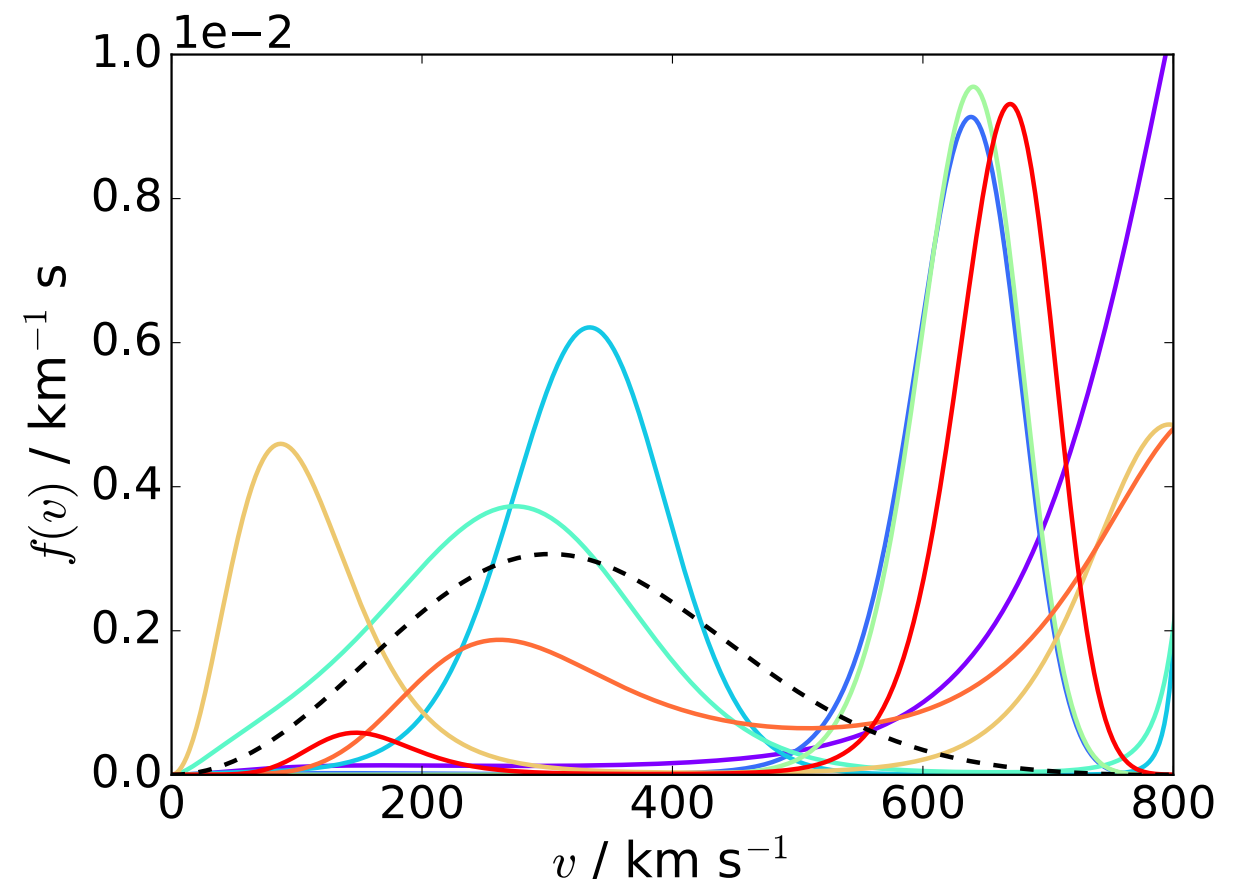
Peter [1103.5145]

$$f(v) = v^2 \exp \left( - \sum_{m=0}^{N-1} a_m v^m \right)$$

BJK & Green [1303.6868, 1312.1852]

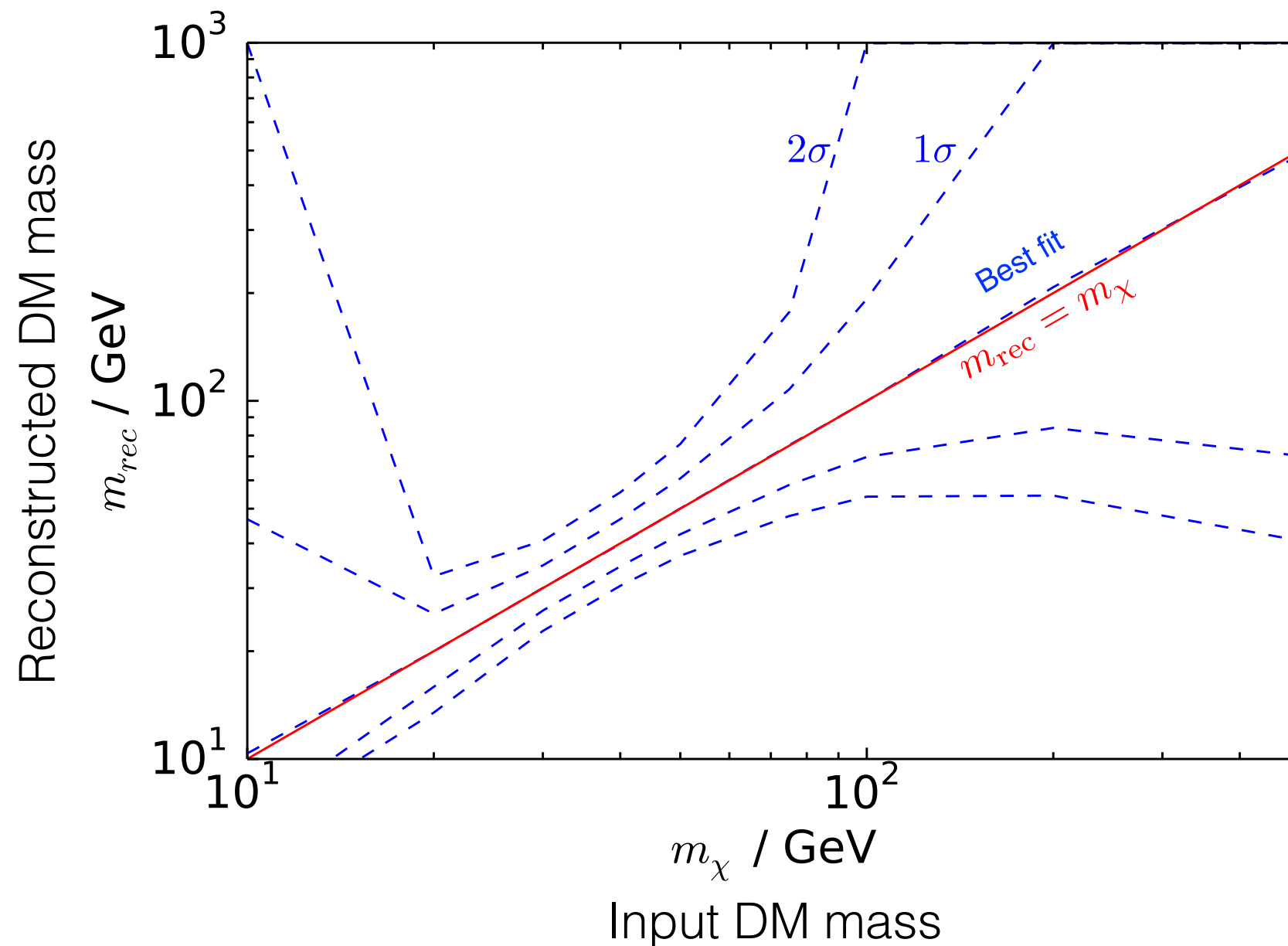
This form guarantees a positive distribution function.

Now we attempt to fit the particle physics parameters  $(m_\chi, \sigma^p)$ , as well as the astrophysics parameters  $\{a_m\}$ .



# Testing the parametrisation

Generate mock data in *multiple experiments* and attempt to reconstruct the DM mass:

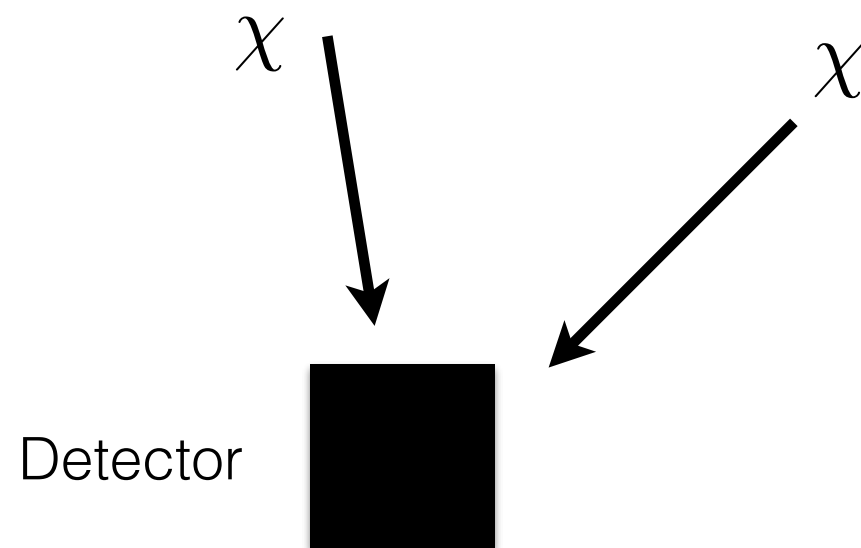


Tested for a number of underlying velocity distributions  
(but we'll save the reconstructed distributions until later...)

# DM velocity distribution

Experiments which are sensitive to the *direction* of the nuclear recoil can give us information about the full 3-D distribution of the *velocity vector*  $\mathbf{v} = (v_x, v_y, v_z)$ , not just the speed  $v = |\mathbf{v}|$

Mayet et al. [1602.03781]



But, we now have an *infinite* number of functions to parametrise (one for each incoming direction  $(\theta, \phi)$ )!

If we want to parametrise  $f(\mathbf{v})$ , we need some *basis functions* to make things more tractable:

$$f(\mathbf{v}) = f^1(v)A^1(\hat{\mathbf{v}}) + f^2(v)A^2(\hat{\mathbf{v}}) + f^3(v)A^3(\hat{\mathbf{v}}) + \dots$$

# Basis functions

$$f(\mathbf{v}) = f^1(v)A^1(\hat{\mathbf{v}}) + f^2(v)A^2(\hat{\mathbf{v}}) + f^3(v)A^3(\hat{\mathbf{v}}) + \dots$$

One possible basis is spherical harmonics:

Alves et al. [1204.5487], Lee [1401.6179]

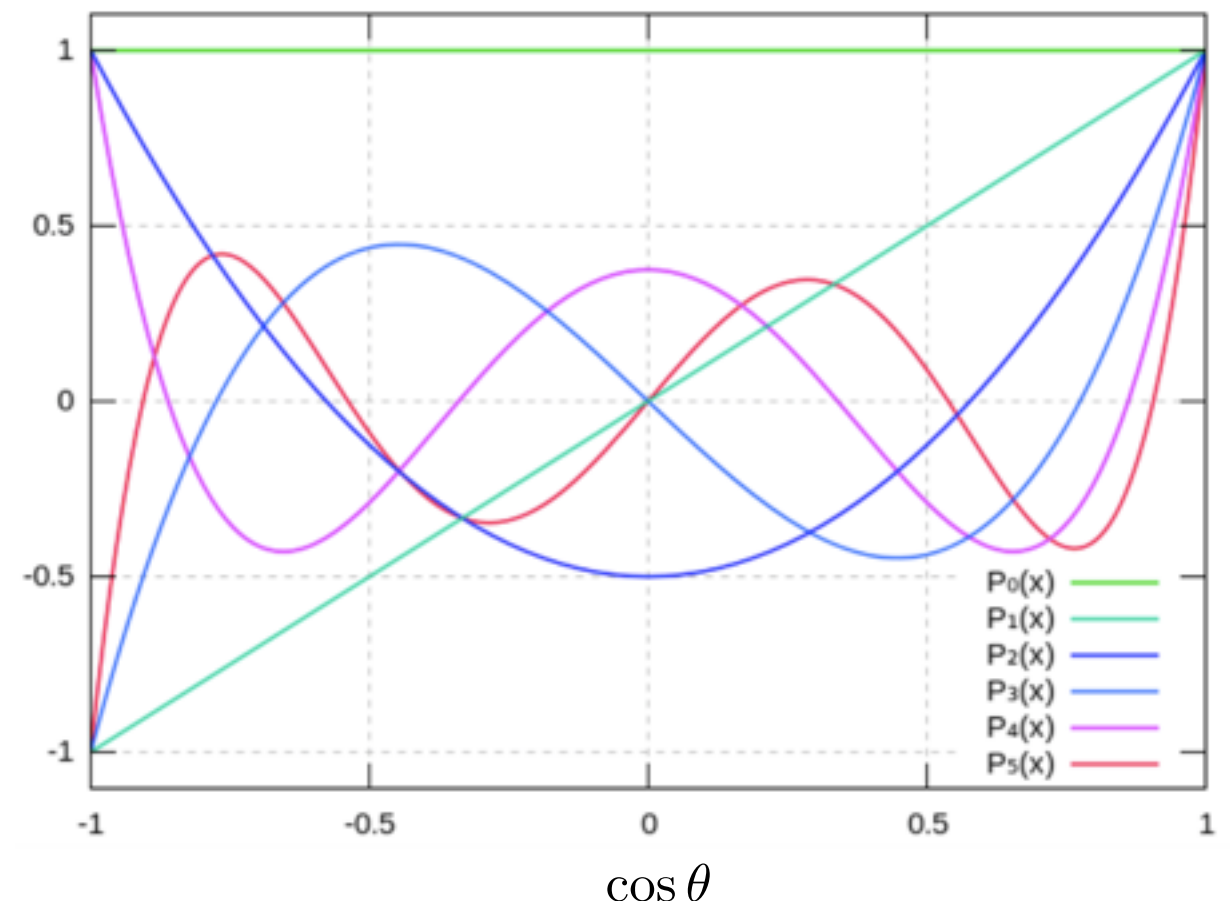
$$f(\mathbf{v}) = \sum_{lm} f_{lm}(v) Y_{lm}(\hat{\mathbf{v}})$$

However, they are not strictly positive definite.



Physical distribution functions must be positive!

$Y_{l0}(\cos \theta)$





# A discretised velocity distribution

Divide the velocity distribution into  $N = 3$  angular bins...

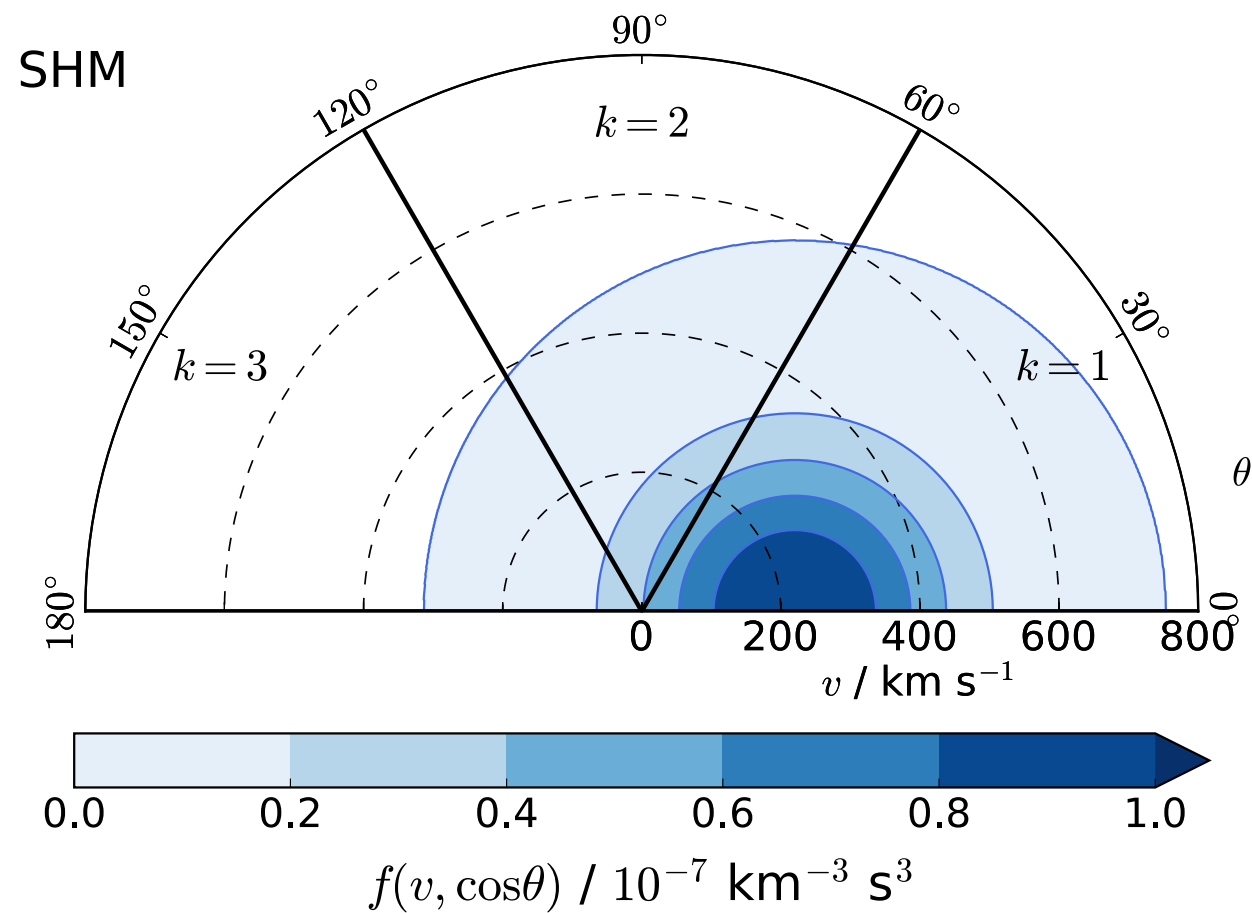
$$f(\mathbf{v}) = f(v, \cos \theta, \phi) = \begin{cases} f^1(v) & \text{for } \theta \in [0^\circ, 60^\circ] \\ f^2(v) & \text{for } \theta \in [60^\circ, 120^\circ] \\ f^3(v) & \text{for } \theta \in [120^\circ, 180^\circ] \end{cases}$$

BJK [1502.04224]

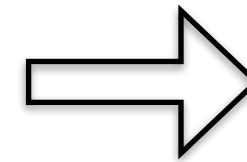
...and then parametrise  $f^k(v)$  within each angular bin.

Calculating the event rate from such a distribution (especially for arbitrary  $N$ ) is non-trivial. But not impossible.

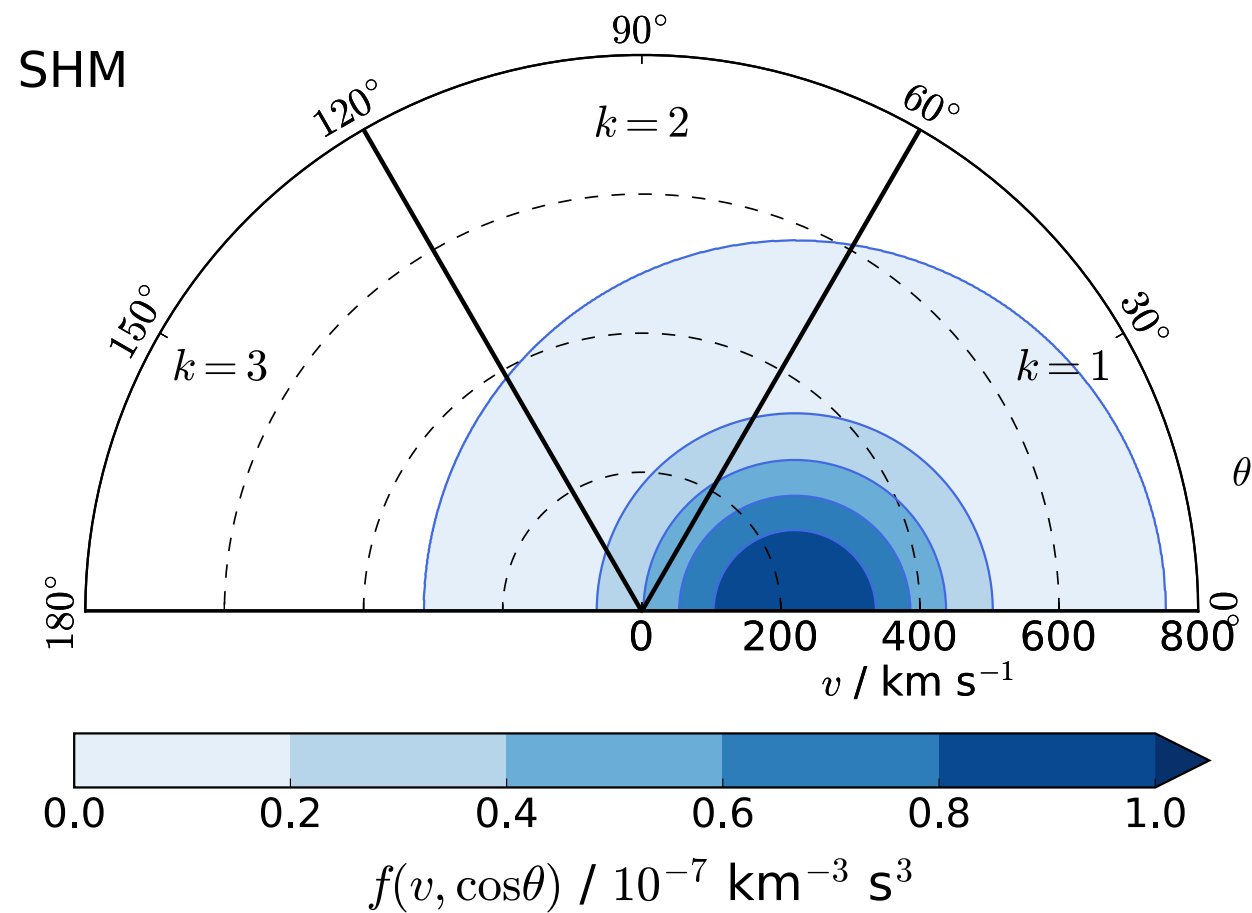
# An example: the SHM



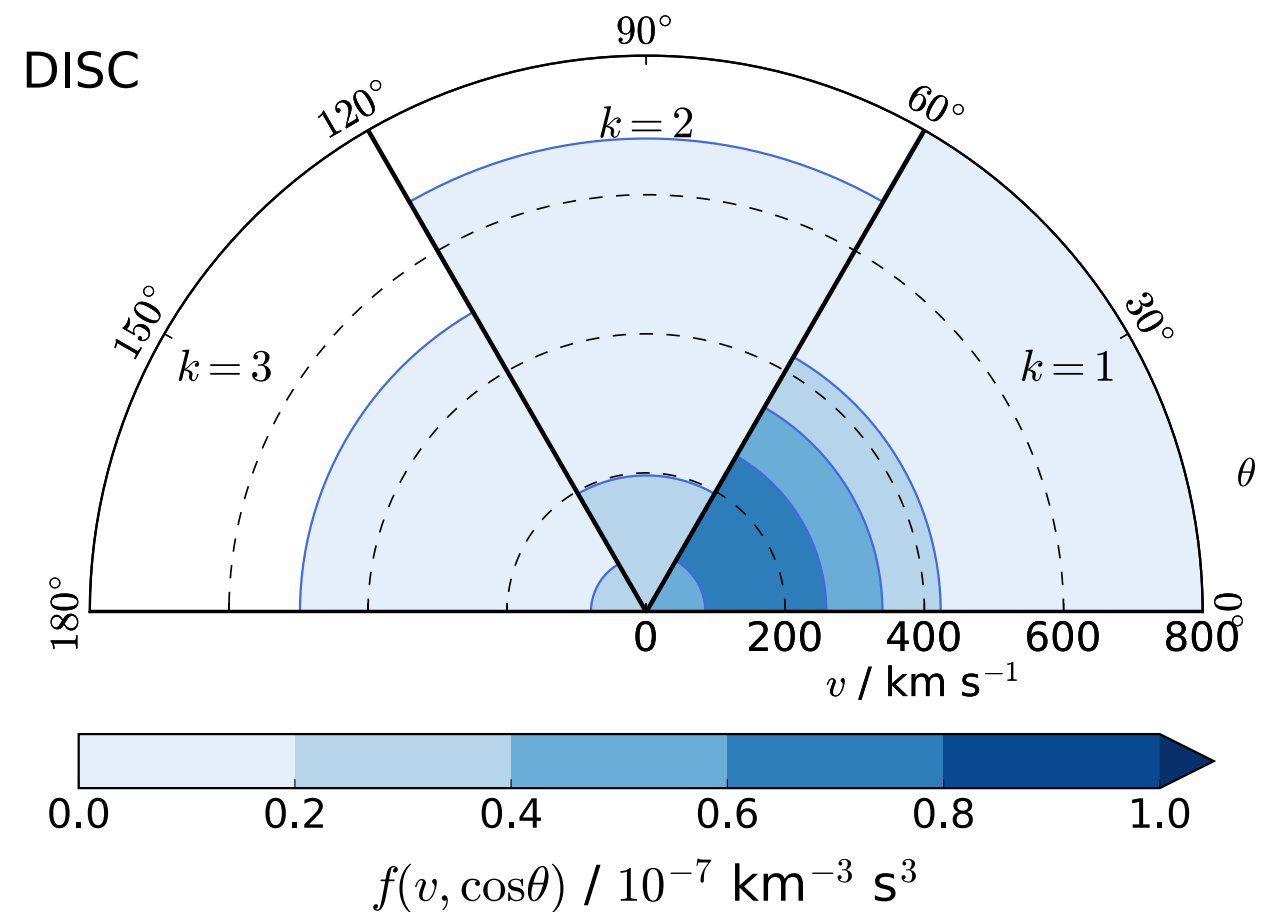
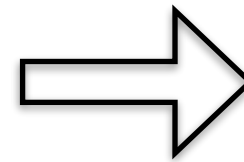
DM wind



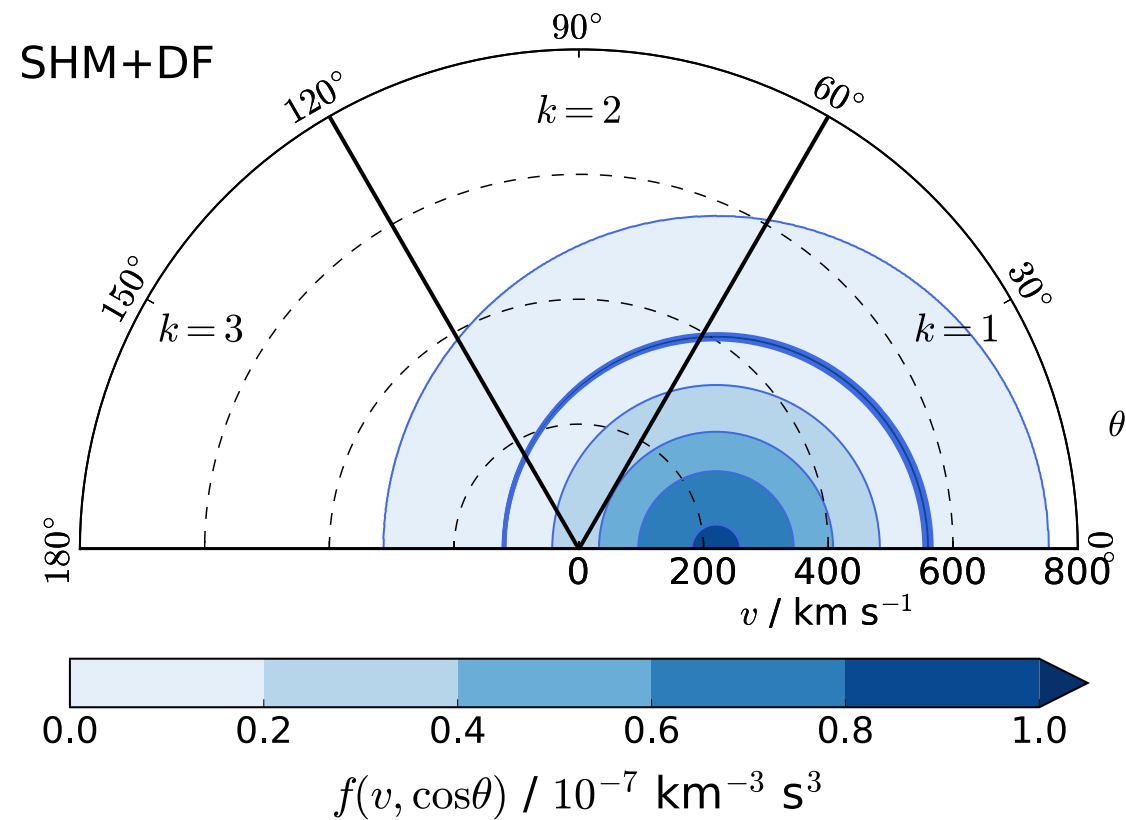
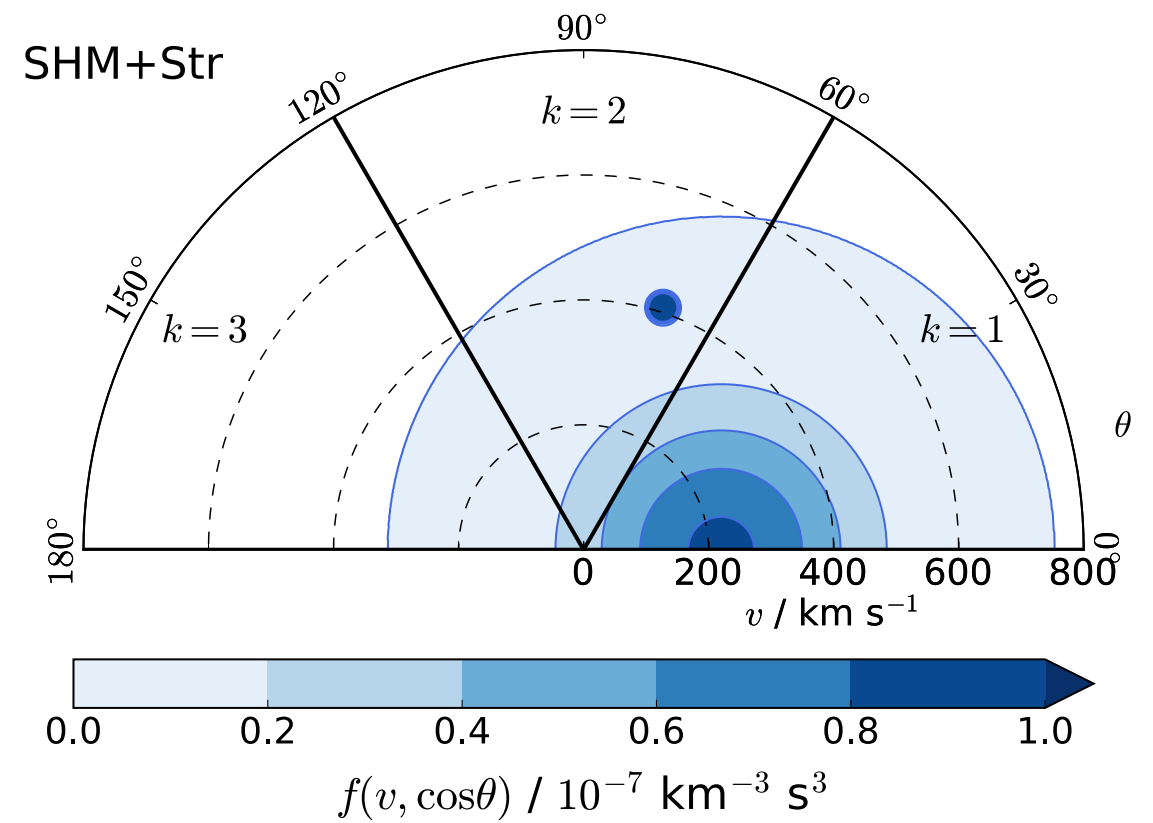
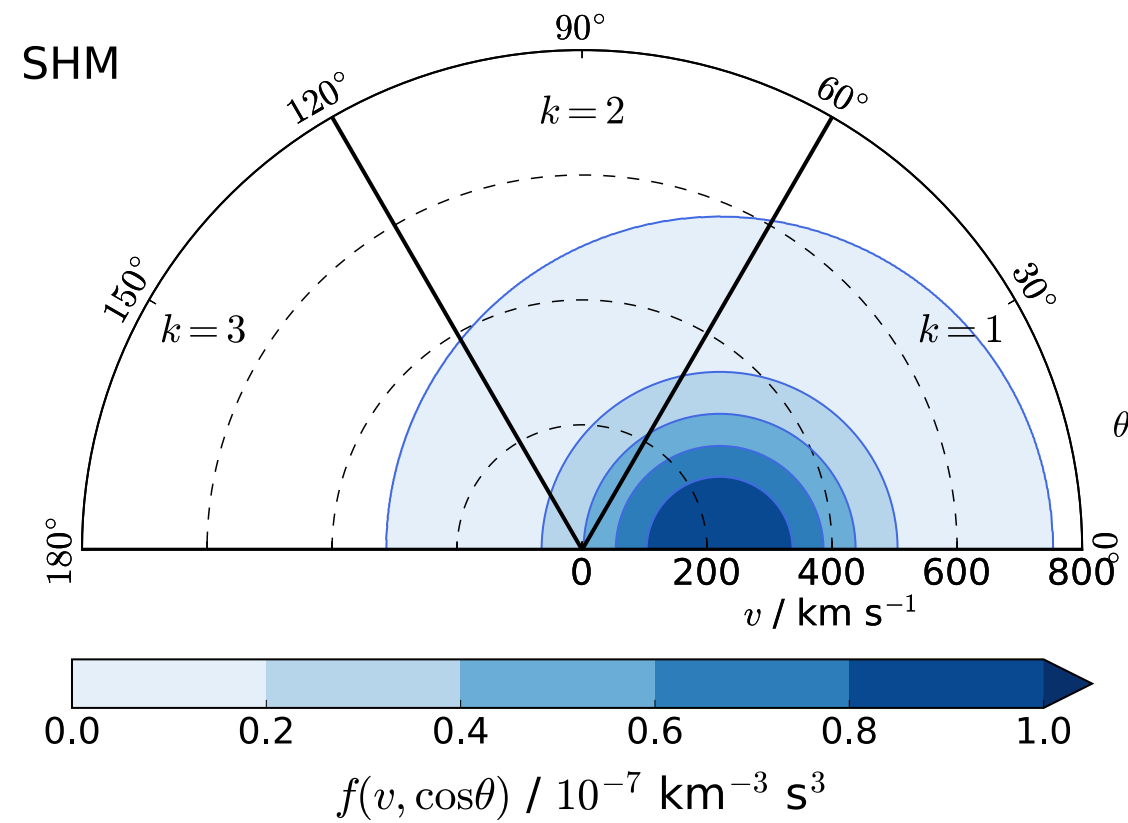
# An example: the SHM



DM wind



# Benchmarks



# Reconstructions

BJK, CAJ O'Hare[1609.08630]

For a single particle physics benchmark ( $m_\chi, \sigma_p$ ),  
generate mock data in two *ideal* future directional detectors:  
Xenon-based [1503.03937] and Fluorine-based [1410.7821]

Then fit to the data ( $\sim 1000$  events) using 3 methods:

*Method A:  
Best Case*

Assume underlying  
velocity distribution is  
known exactly.

Fit  $m_\chi, \sigma_p$

*Method B:  
Reasonable Case*

Assume functional form  
of underlying velocity  
distribution is known.

Fit  $m_\chi, \sigma_p$  and  
theoretical parameters

*Method C:  
Worst Case*

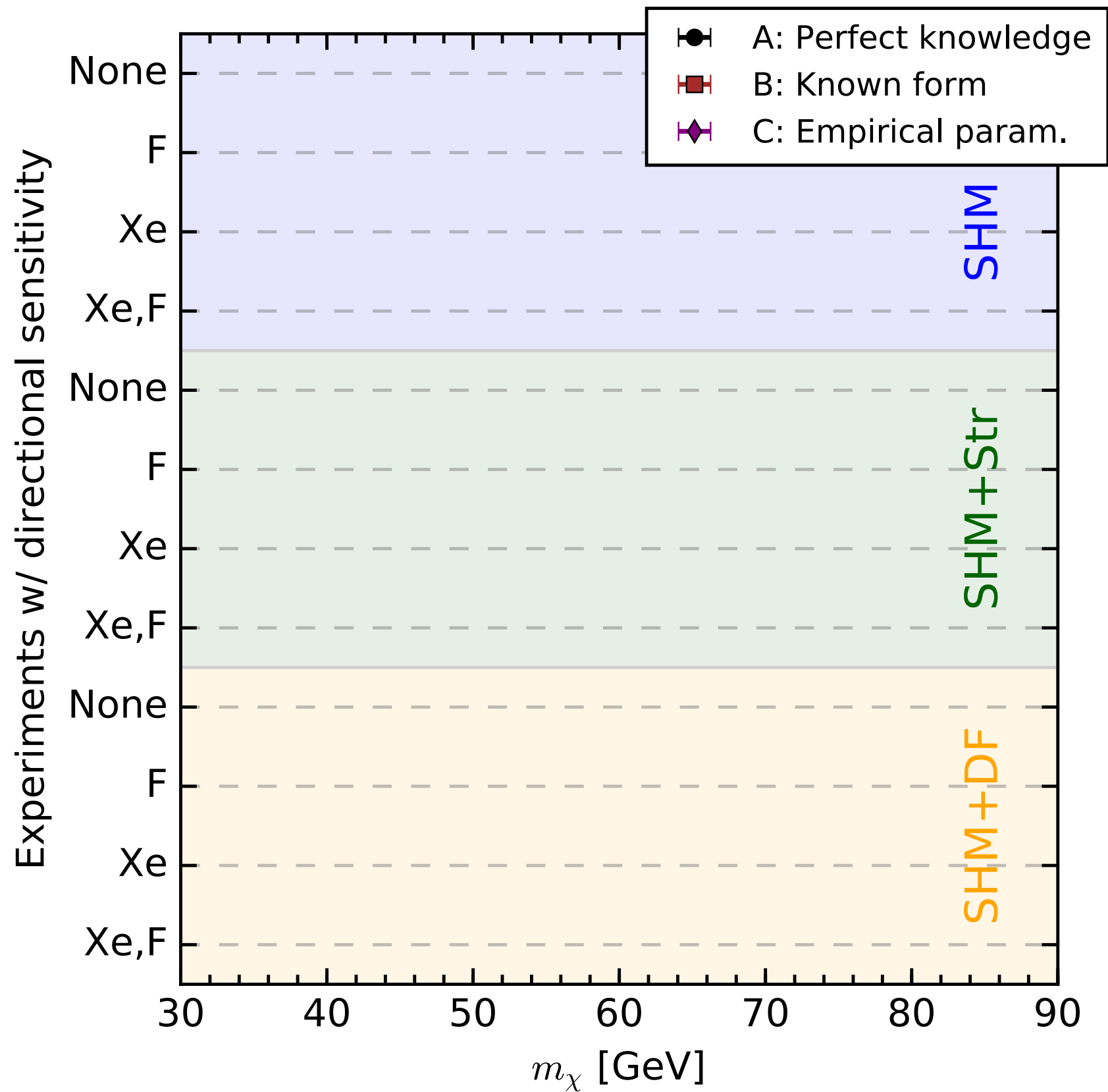
Assume nothing about  
the underlying velocity  
distribution.

Fit  $m_\chi, \sigma_p$  and  
empirical parameters

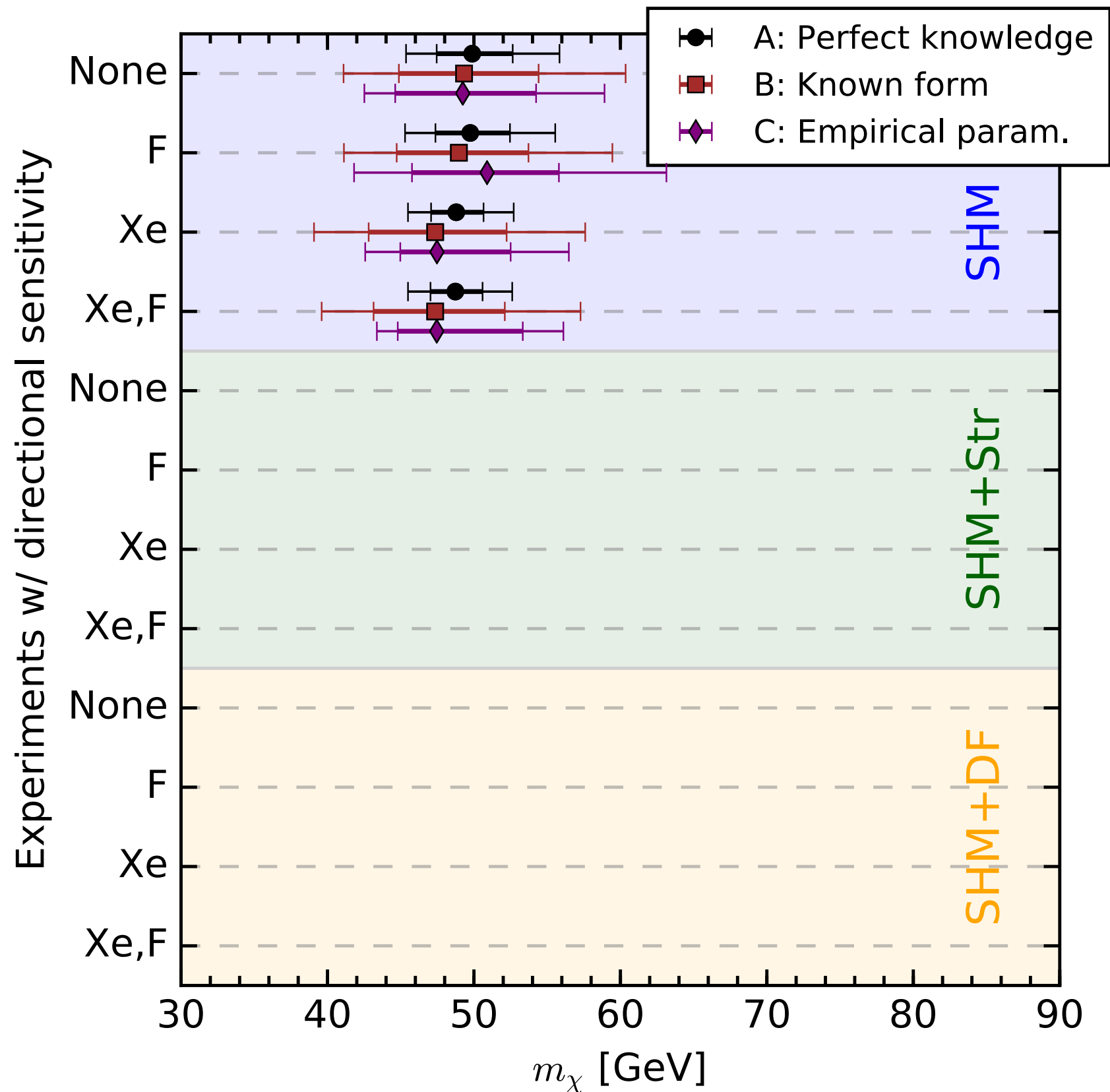
Lee et al. [1202.5035]  
Billard et al. [1207.1050]



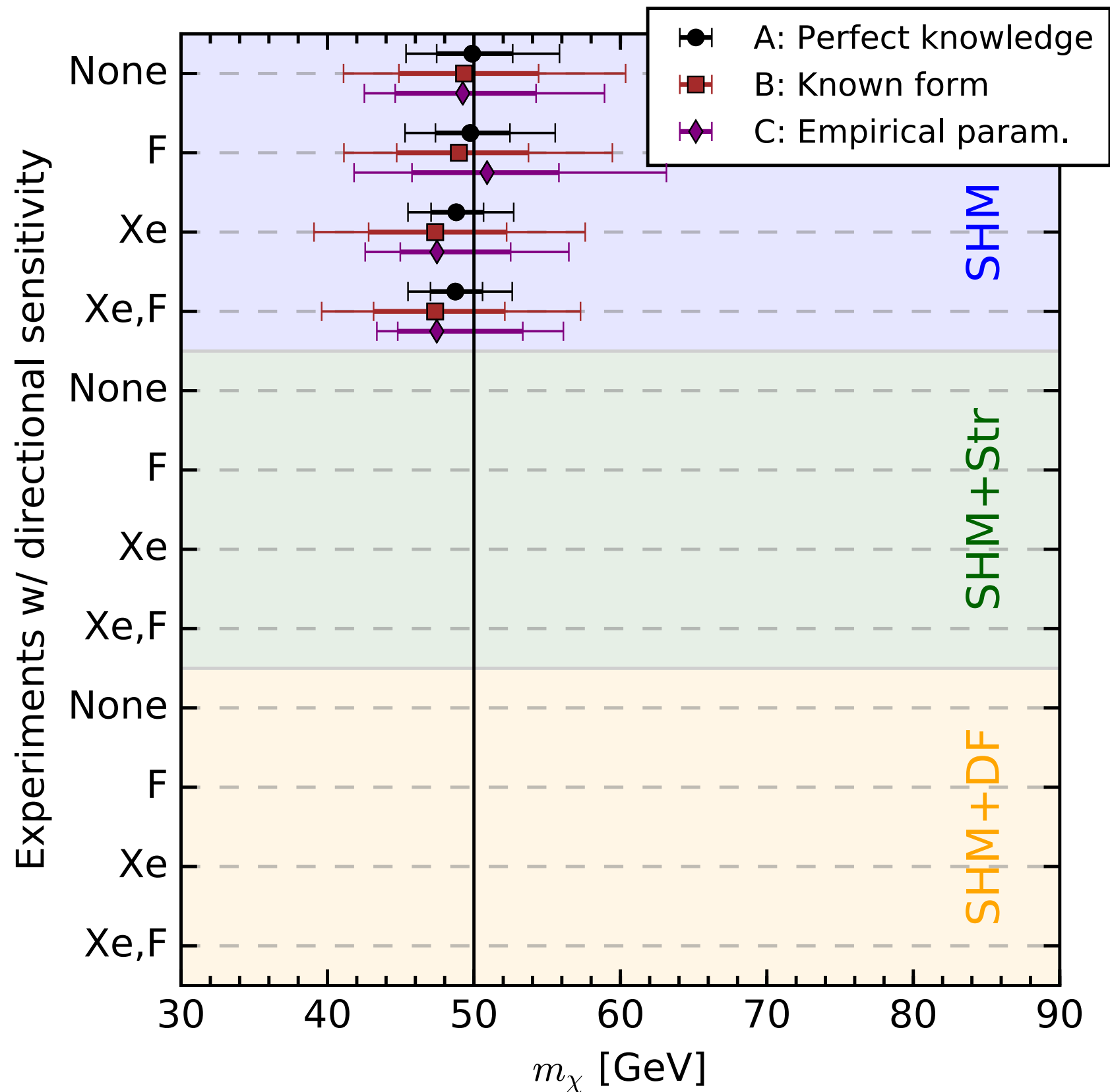
# Reconstructing the DM mass



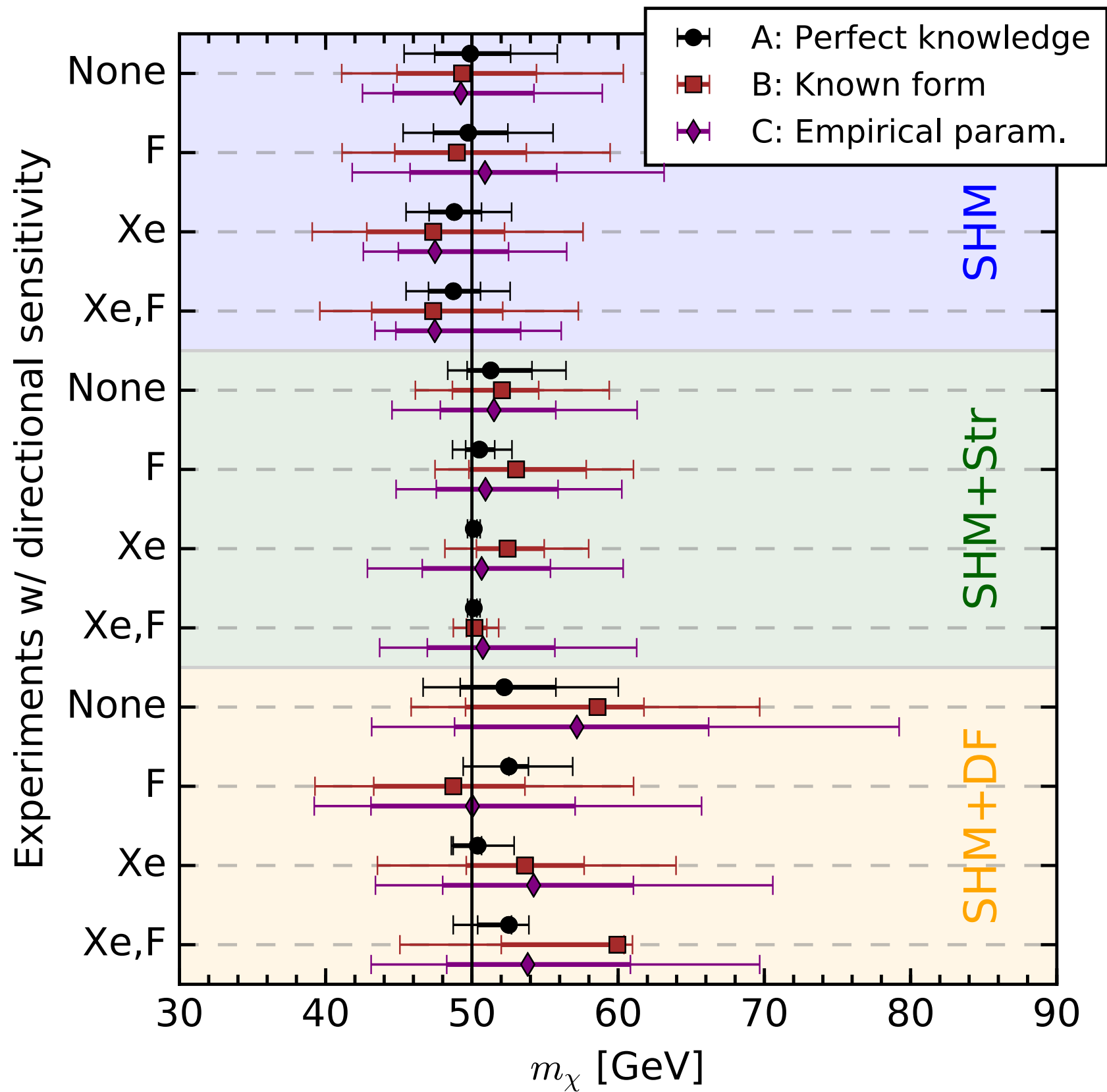
# Reconstructing the DM mass



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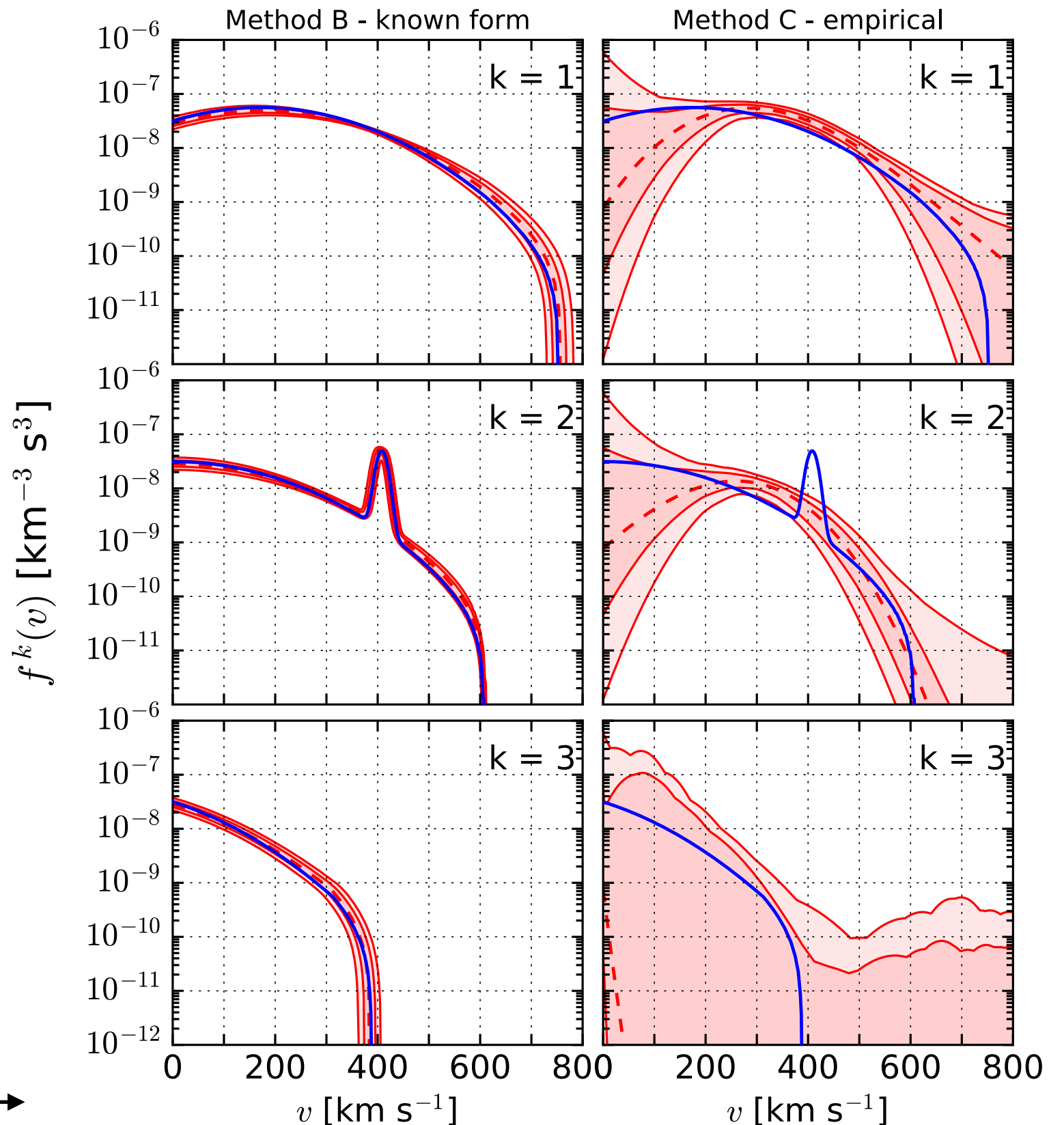
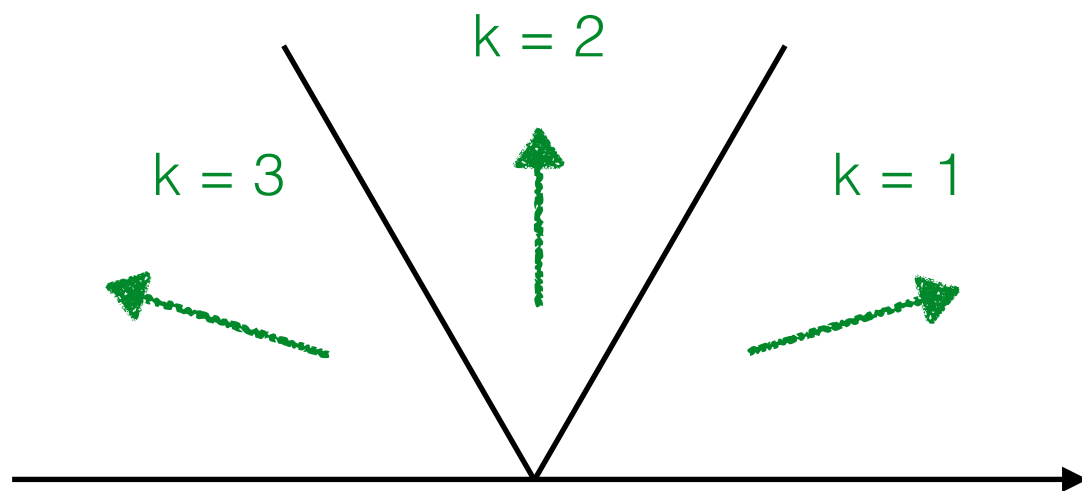
# Reconstructing the DM mass



# Shape of the velocity distribution

SHM+Stream distribution  
with directional  
sensitivity in Xe and F

'True' velocity distribution ———  
Best fit distribution - - -  
(+68% and 95% intervals)

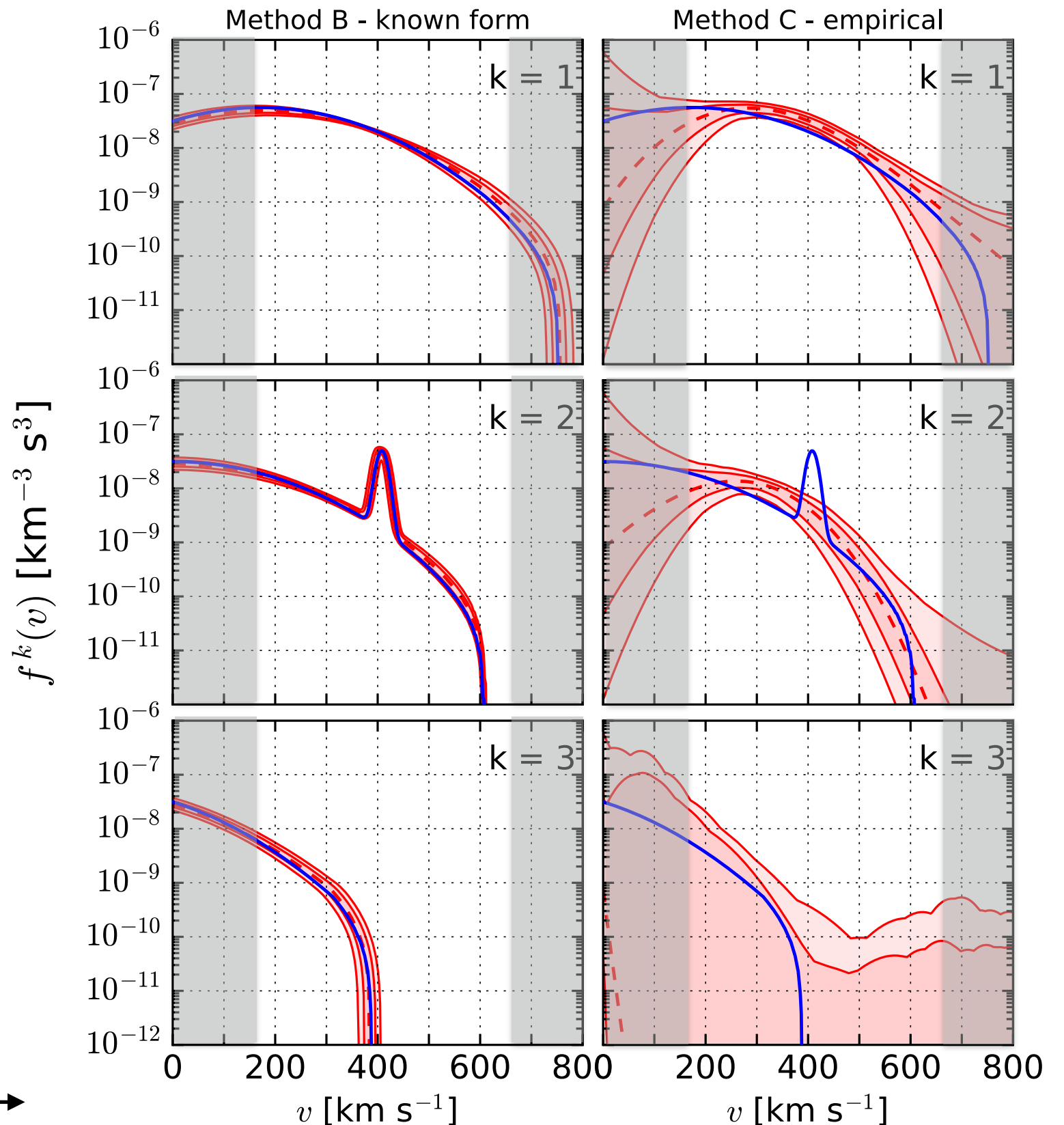
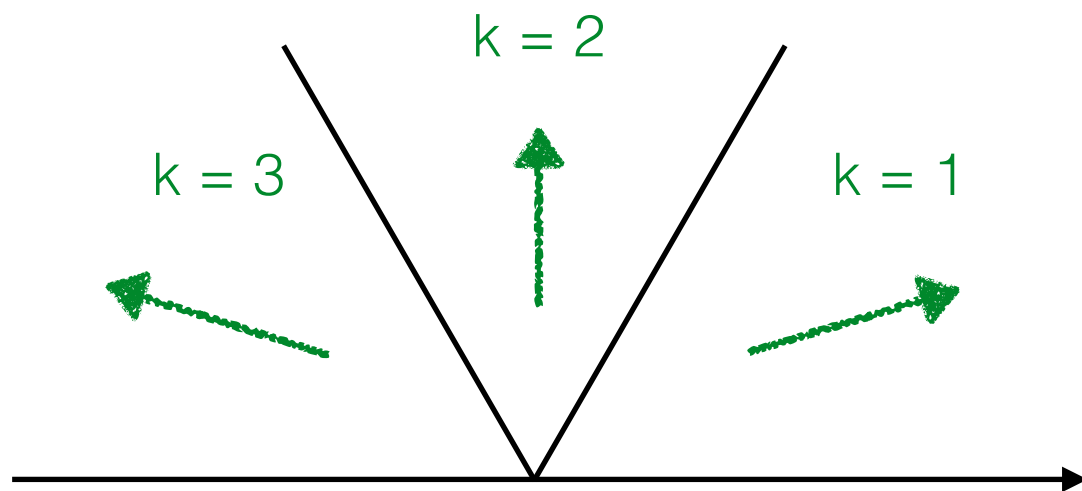




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# Velocity parameters

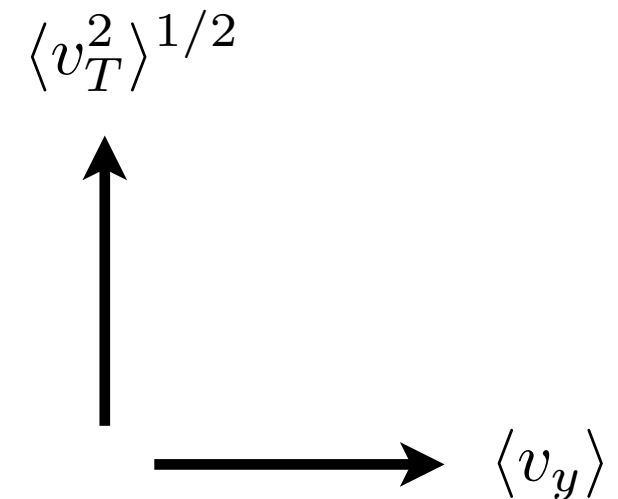
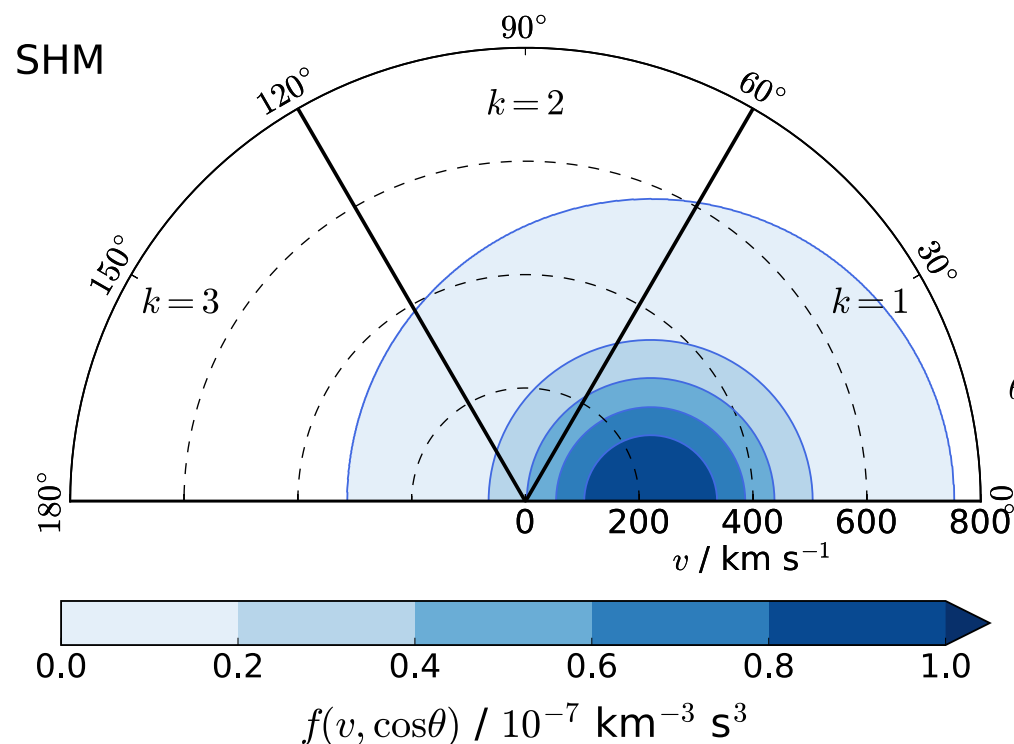
In order to compare distributions, calculate some derived parameters:

Average DM velocity  
*parallel* to Earth's motion

$$\longrightarrow \langle v_y \rangle = \int dv \int_0^{2\pi} d\phi \int_{-1}^1 d\cos\theta (v \cos\theta) v^2 f(\mathbf{v})$$

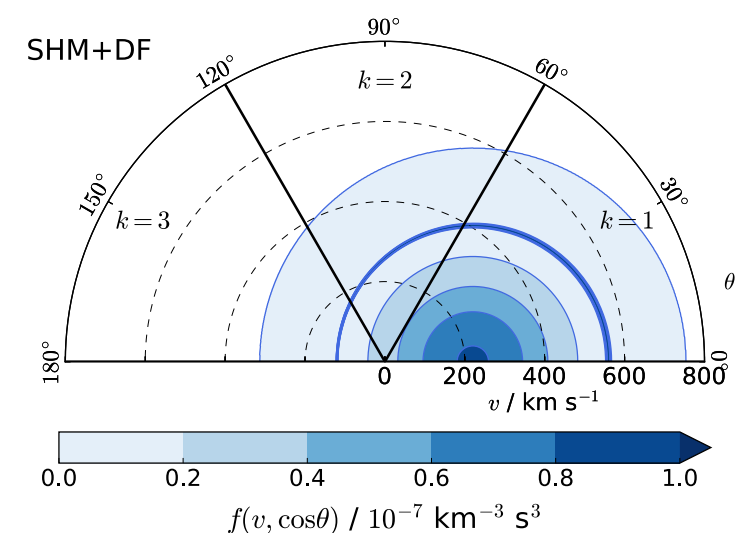
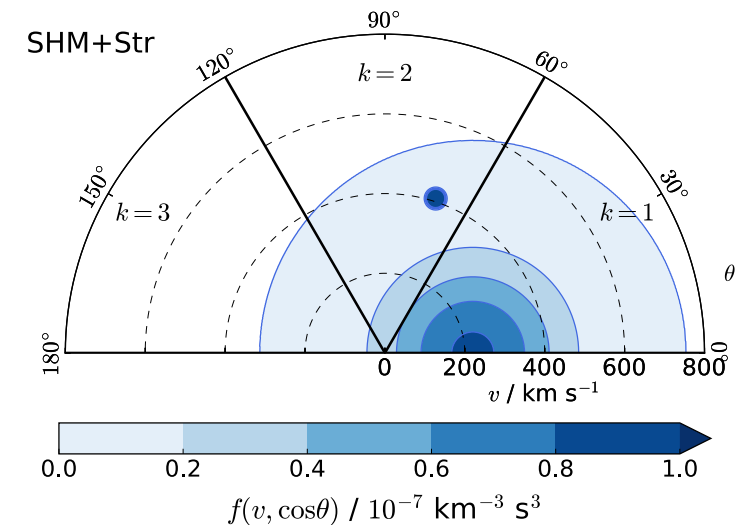
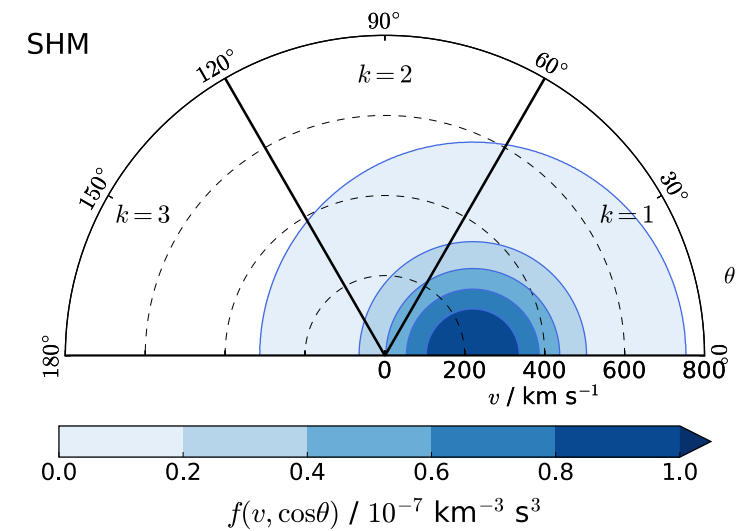
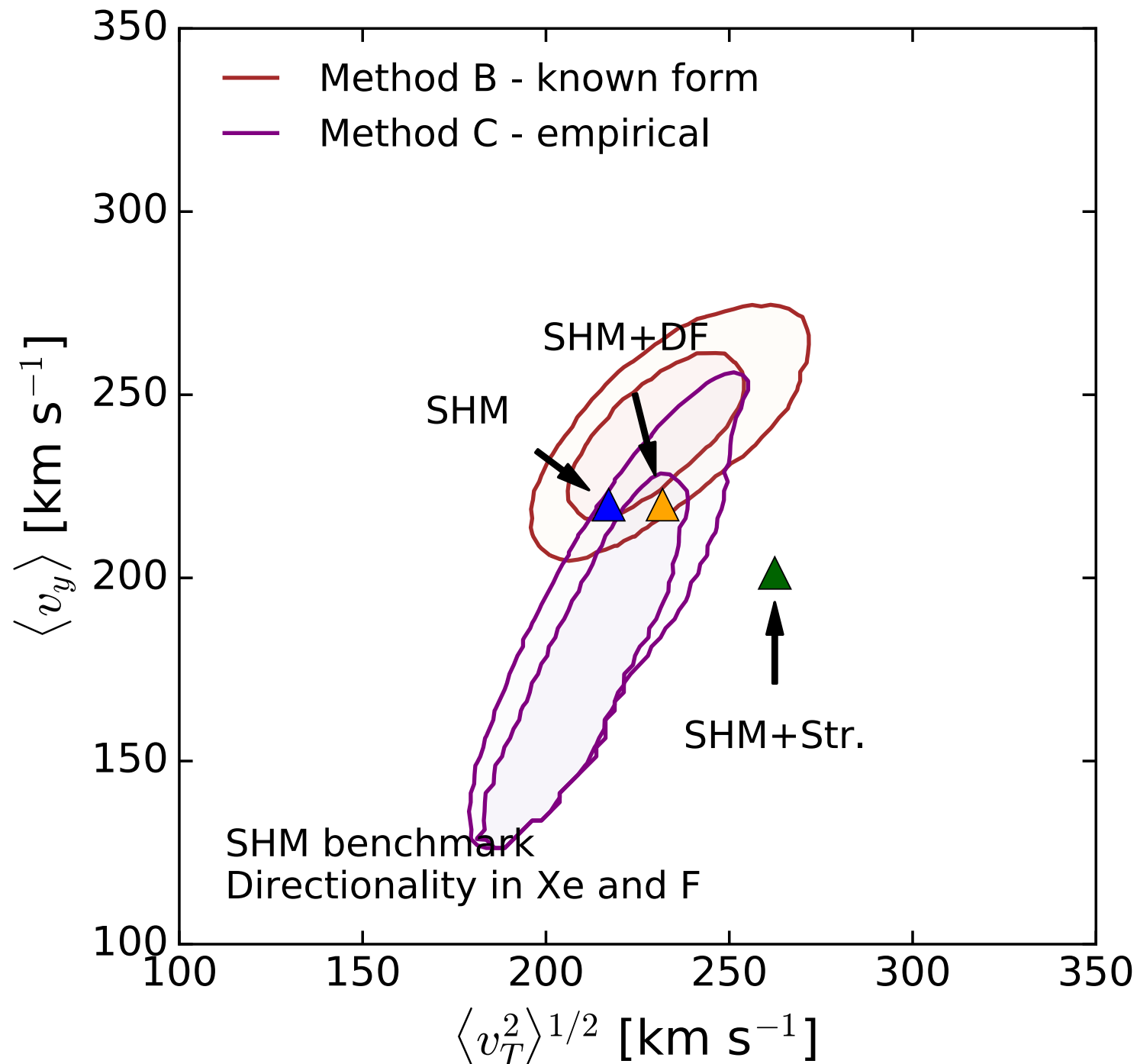
Average DM velocity  
*transverse* to Earth's motion

$$\longrightarrow \langle v_T^2 \rangle = \int dv \int_0^{2\pi} d\phi \int_{-1}^1 d\cos\theta (v^2 \sin^2\theta) v^2 f(\mathbf{v})$$



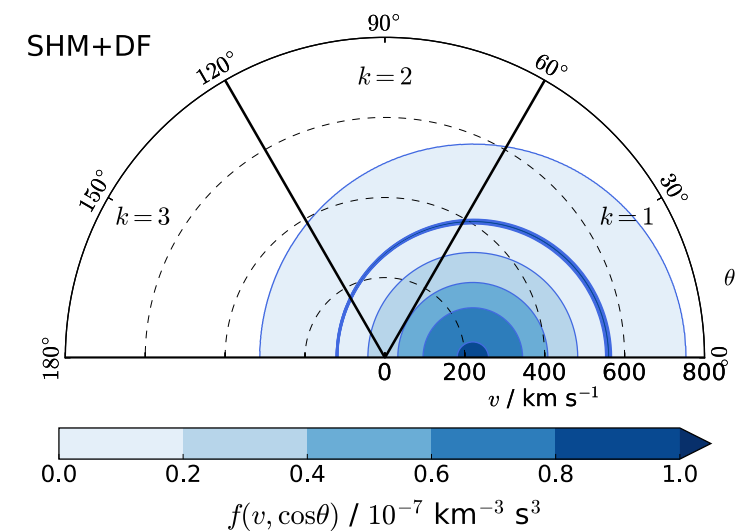
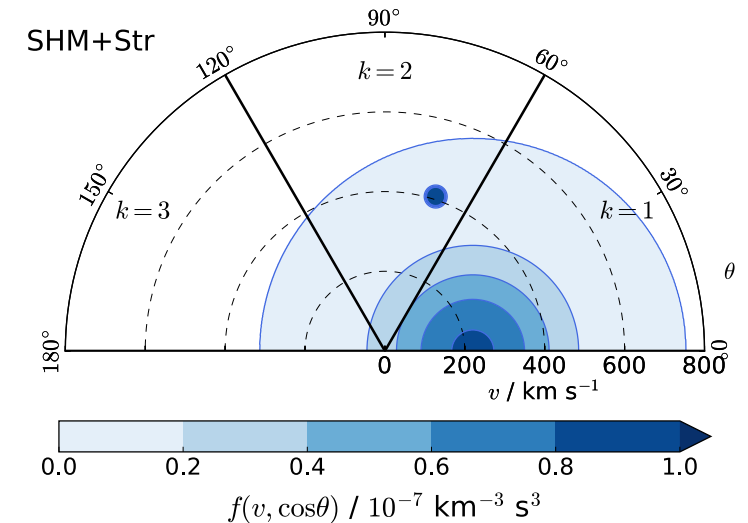
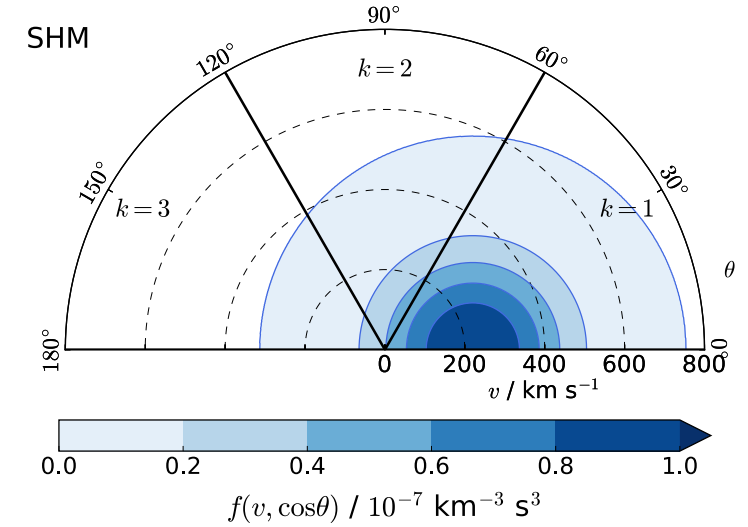
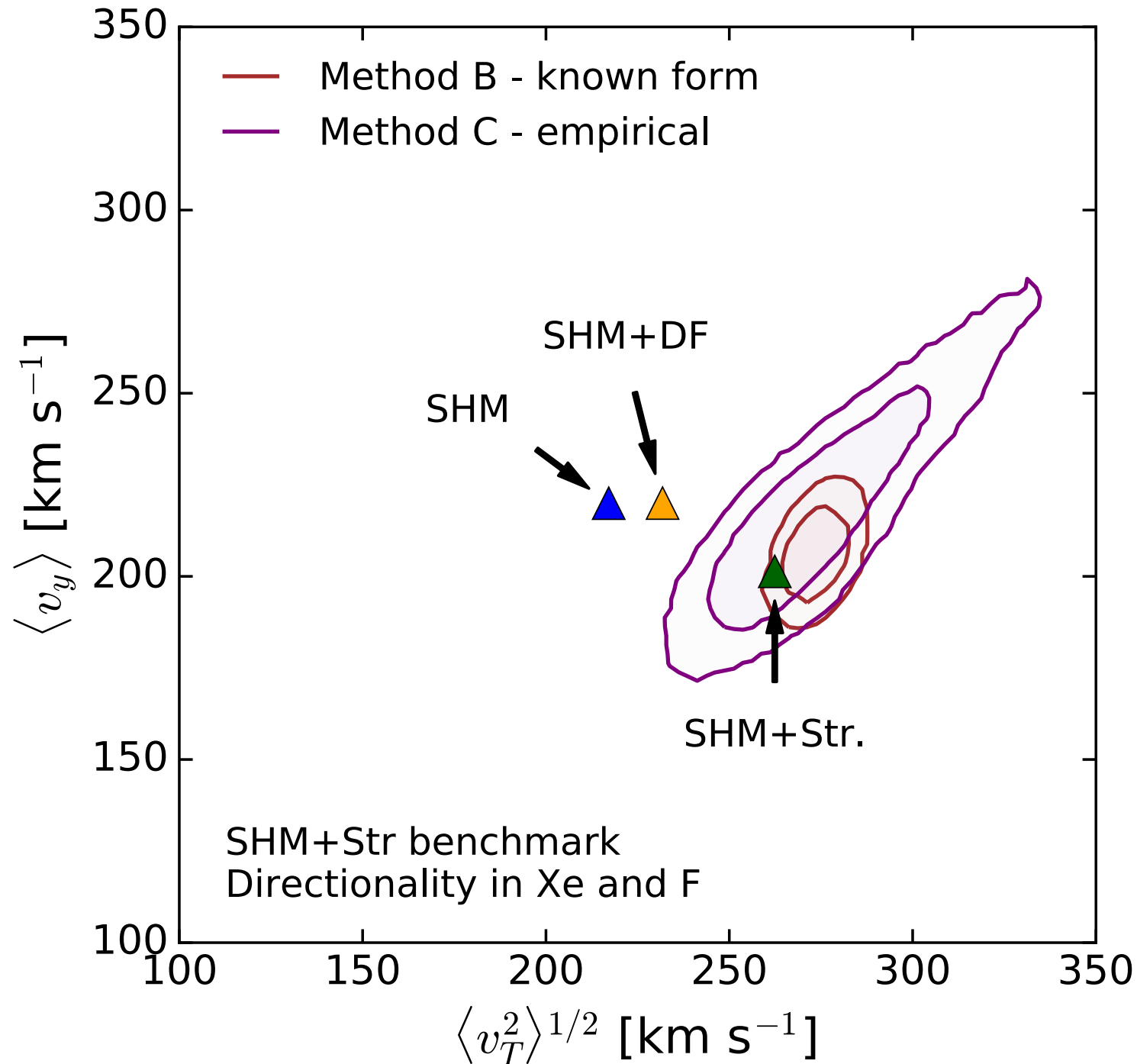
# Comparing distributions

Input distribution: SHM



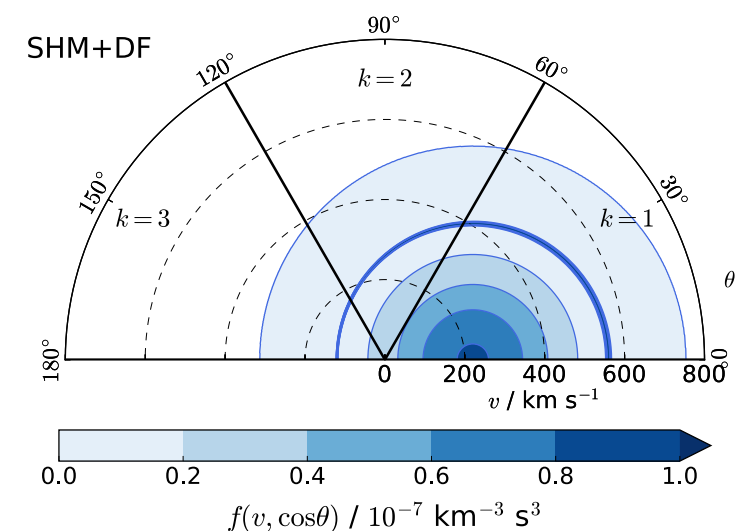
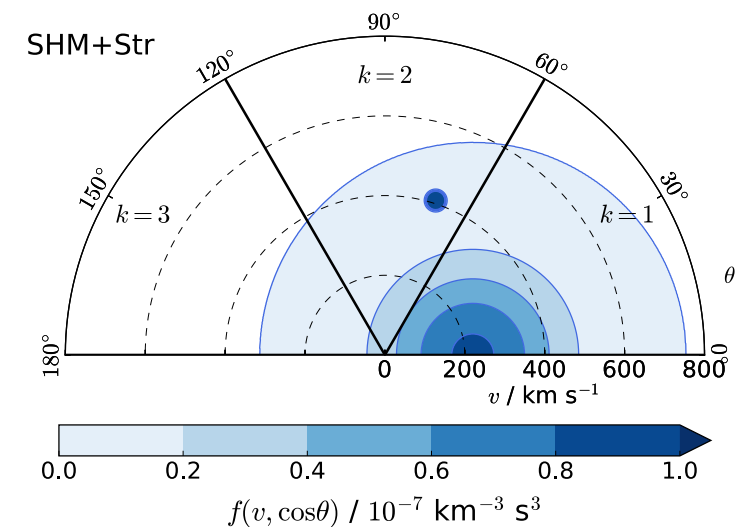
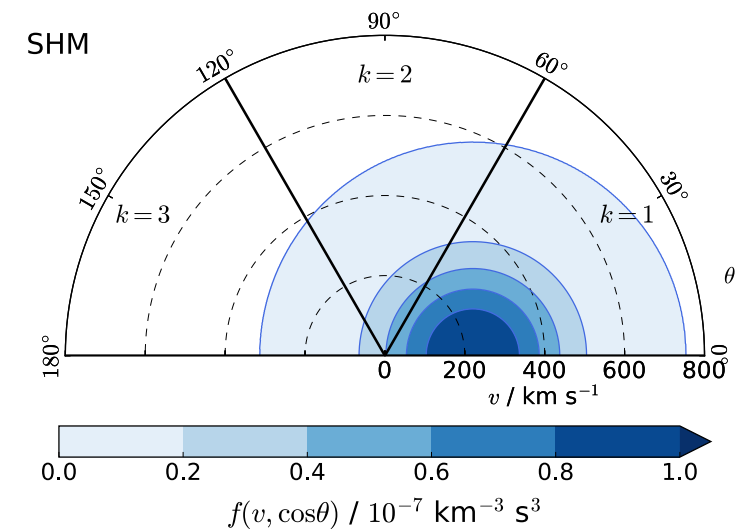
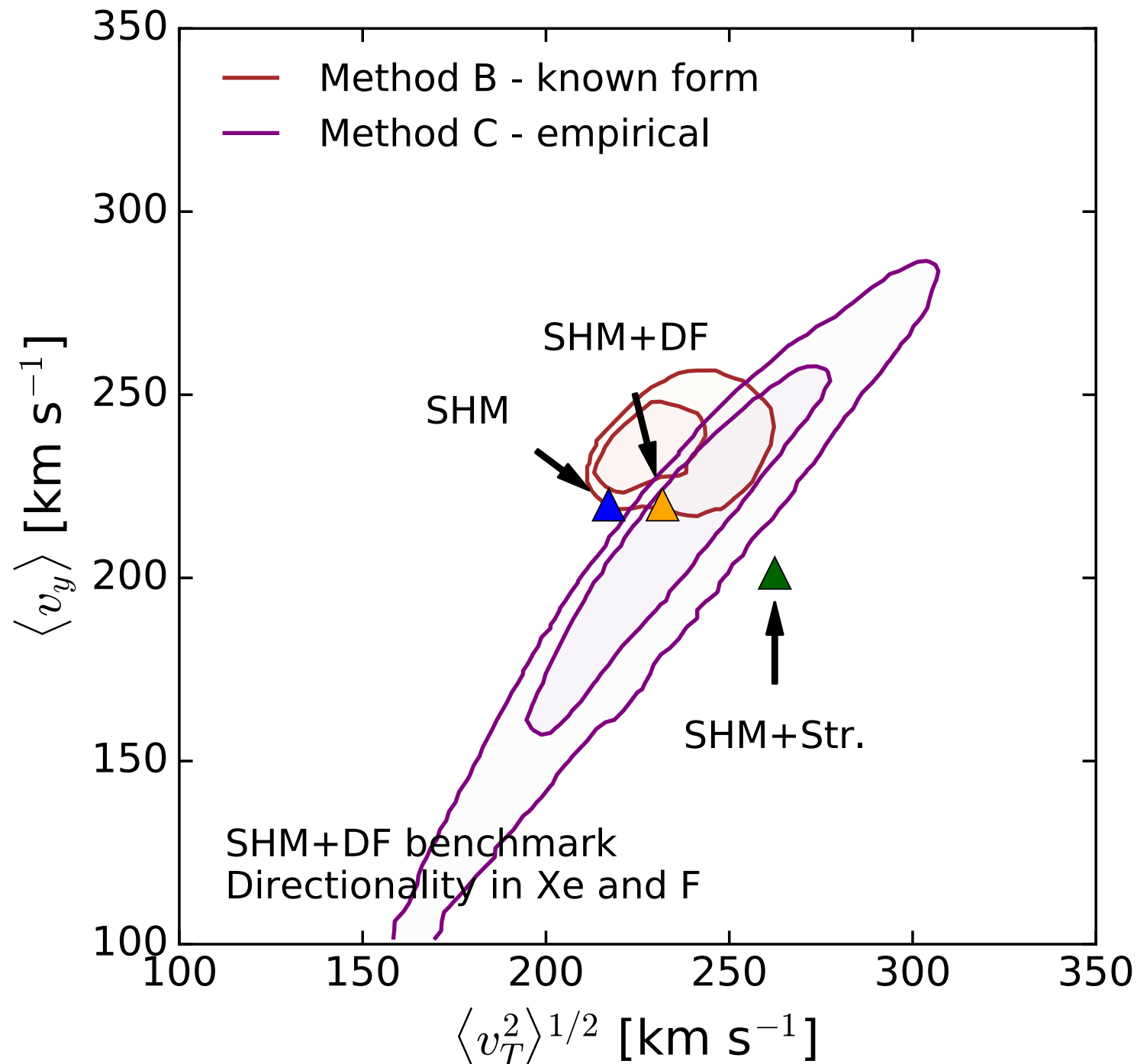
# Comparing distributions

Input distribution: SHM + Stream



# Comparing distributions

Input distribution: SHM + Debris Flow





# The strategy

**In case of signal  
break glass**

Perform parameter estimation using two methods:  
'known' functional form vs. empirical parametrisation

→ Compare reconstructed particle parameters

Calculate derived parameters (such as  $\langle v_y \rangle$  and  $\langle v_T^2 \rangle^{1/2}$ )

→ Check for consistency with SHM

In case of inconsistency, look at reconstructed shape of  $f(v)$

→ Hint towards unexpected structure?

# Conclusions

Proof of concept for reconstructing the DM properties from *ideal directional detectors*

↪ Extend halo-independent, *general parametrisation* to the velocity distribution

*Angular discretisation* of the velocity distribution makes the problem tractable

No large loss of precision or accuracy compared with knowing the functional form of the underlying distribution

↪ *Reconstruction of the DM mass* without assumptions about the halo

May allow us to *distinguish different velocity distributions* (and tell us something about the Milky Way)

# Conclusions

Proof of concept for reconstructing the DM properties from *ideal directional detectors*

↪ Extend halo-independent, *general parametrisation* to the velocity distribution

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↪ *Reconstruction of the DM mass* without assumptions about the halo

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**Thank you**

## Backup Slides

# Directional recoil spectrum

$$\frac{dR}{dE_R d\Omega_q} = \frac{\rho_0}{4\pi\mu_{\chi p}^2 m_\chi} \sigma^p \mathcal{C}_{\mathcal{N}} F^2(E_R) \hat{f}(v_{\min}, \hat{\mathbf{q}})$$

$$v_{\min} = \sqrt{\frac{m_{\mathcal{N}} E_R}{2\mu_{\chi \mathcal{N}}^2}}$$

Enhancement for nucleus  $\mathcal{N}$ :

$$\mathcal{C}_{\mathcal{N}} = \begin{cases} |Z + (f^p/f^n)(A - Z)|^2 \\ \frac{4}{3} \frac{J+1}{J} |\langle S_p \rangle + (a^p/a^n) \langle S_n \rangle|^2 \end{cases}$$

SI interactions

SD interactions

NB: May get interesting directional signatures from other operators  
BJK [1505.07406]

Form factor:  $F^2(E_R)$

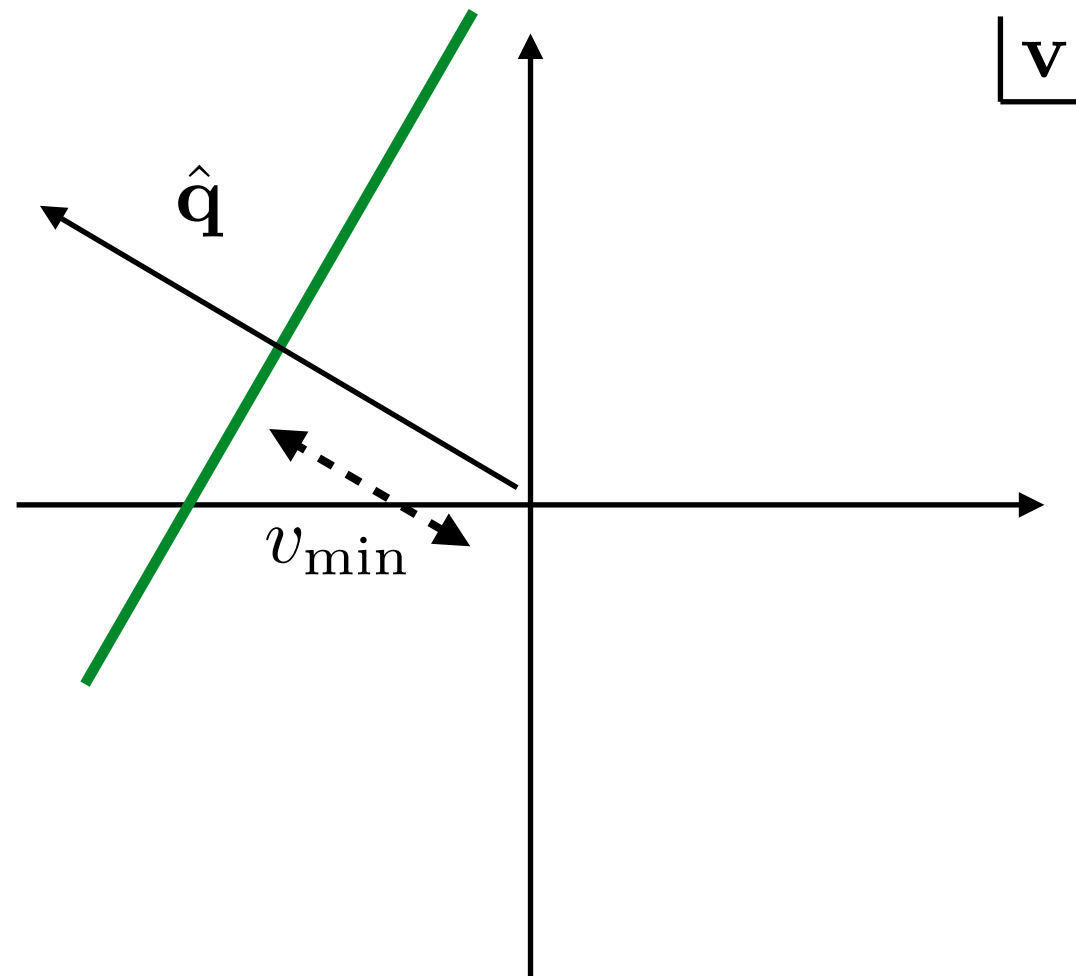
Radon Transform (RT):

$$\hat{f}(v_{\min}, \hat{\mathbf{q}}) = \int_{\mathbb{R}^3} f(\mathbf{v}) \delta(\mathbf{v} \cdot \hat{\mathbf{q}} - v_{\min}) d^3\mathbf{v}$$

# Radon Transform

Radon Transform (RT):

$$\hat{f}(v_{\min}, \hat{\mathbf{q}}) = \int_{\mathbb{R}^3} f(\mathbf{v}) \delta(\mathbf{v} \cdot \hat{\mathbf{q}} - v_{\min}) d^3\mathbf{v}$$



# Reconstructing $f(v)$

Many previous attempts to tackle this problem:

Numerical inversion ('measure'  $f(v)$  from the data)

Fox, Liu, Weiner [1011.915], Frandsen et al. [1111.0292], Feldstein, Kahlhoefer [1403.4606]

Include uncertainties in SHM parameters in the fit

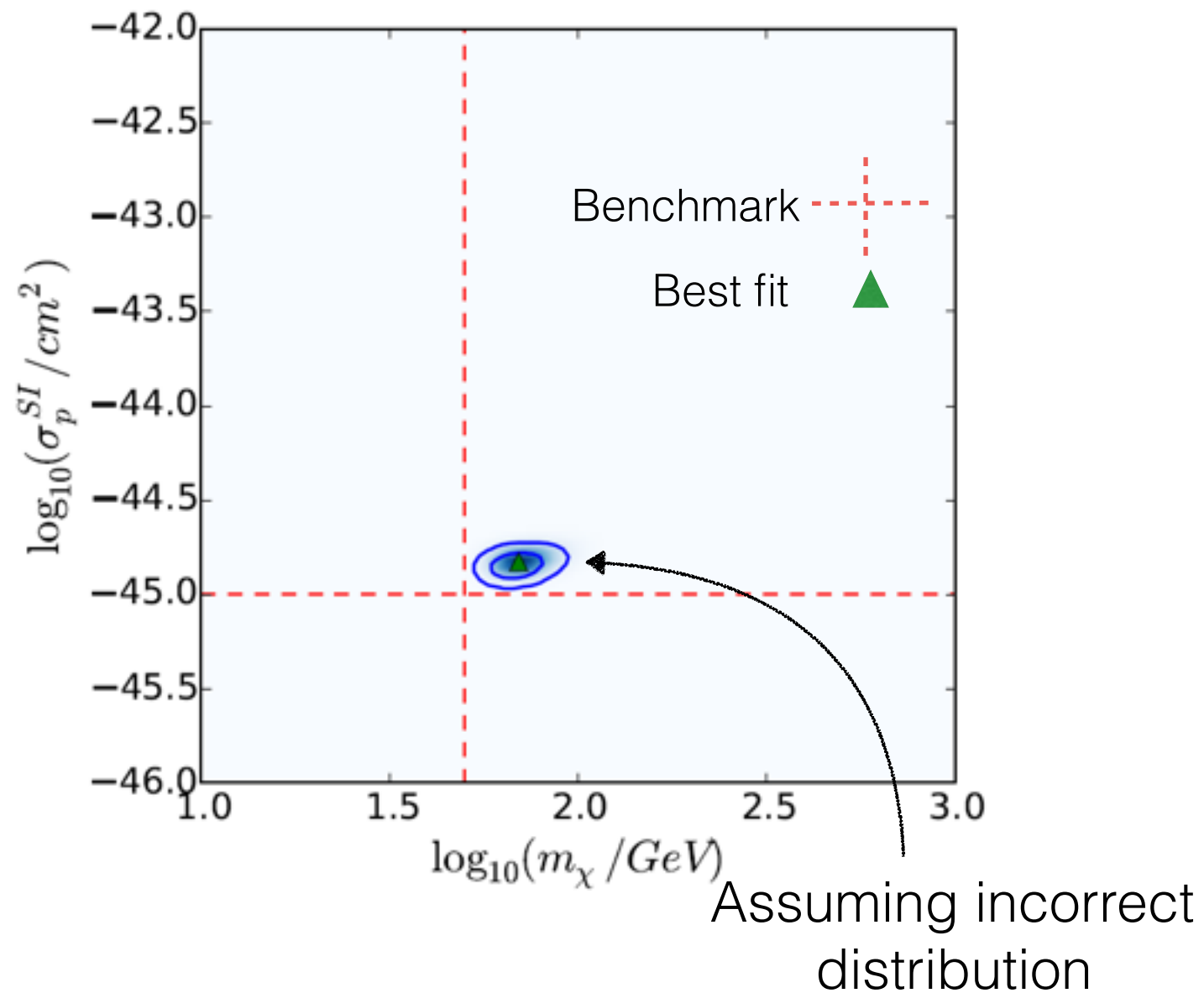
Strigari, Trotta [0906.5361]

Add extra components to the velocity distribution (and fit)

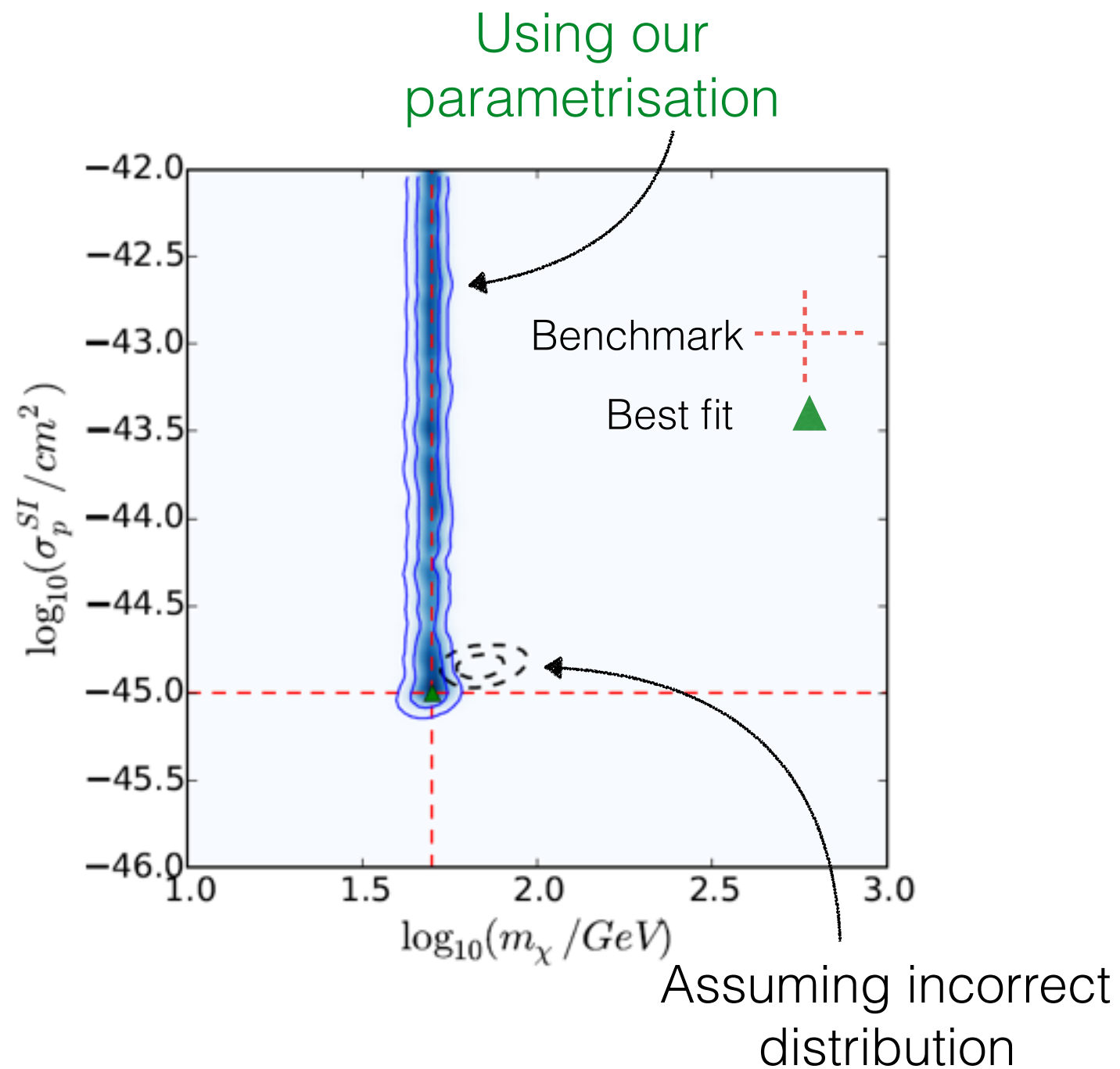
Lee, Peter [1202.5035], O'Hare, Green [1410.2749]



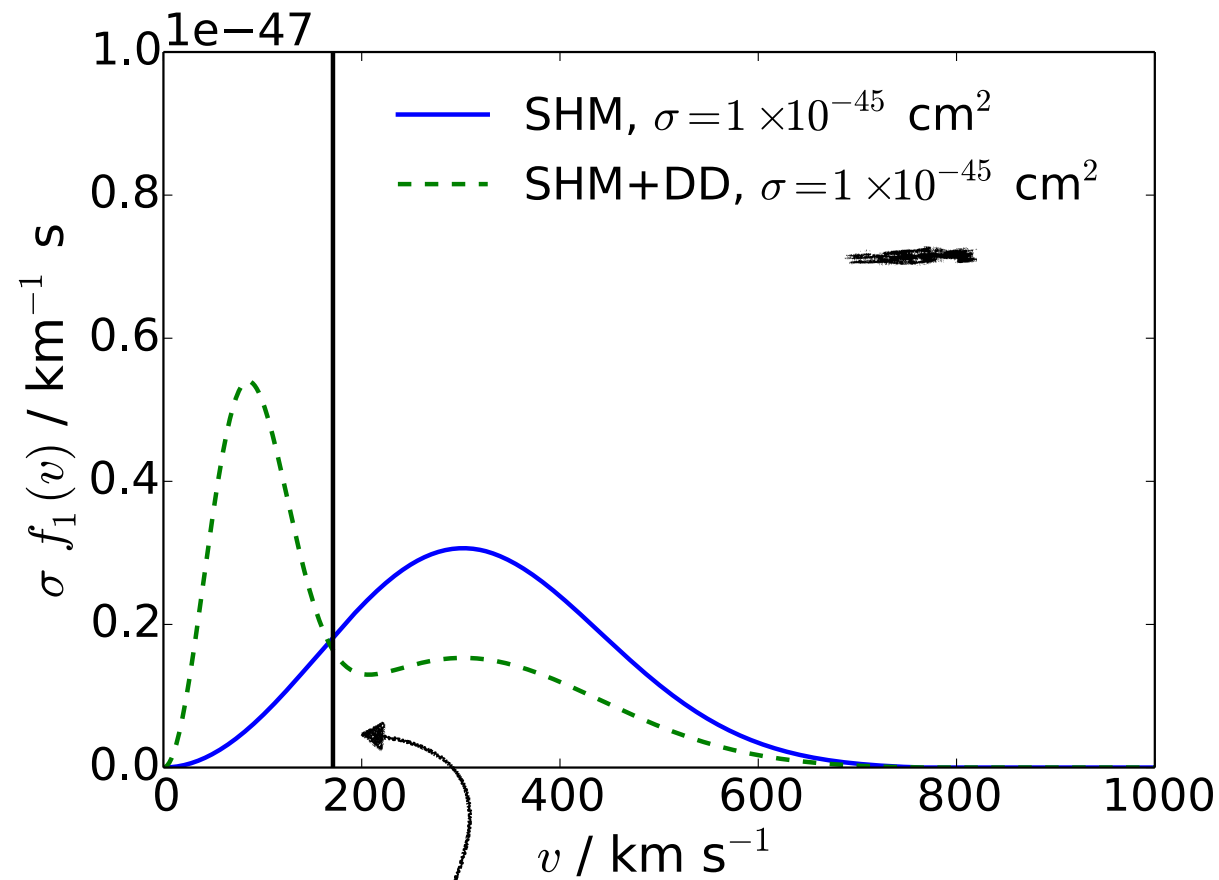
# Cross section degeneracy



# Cross section degeneracy



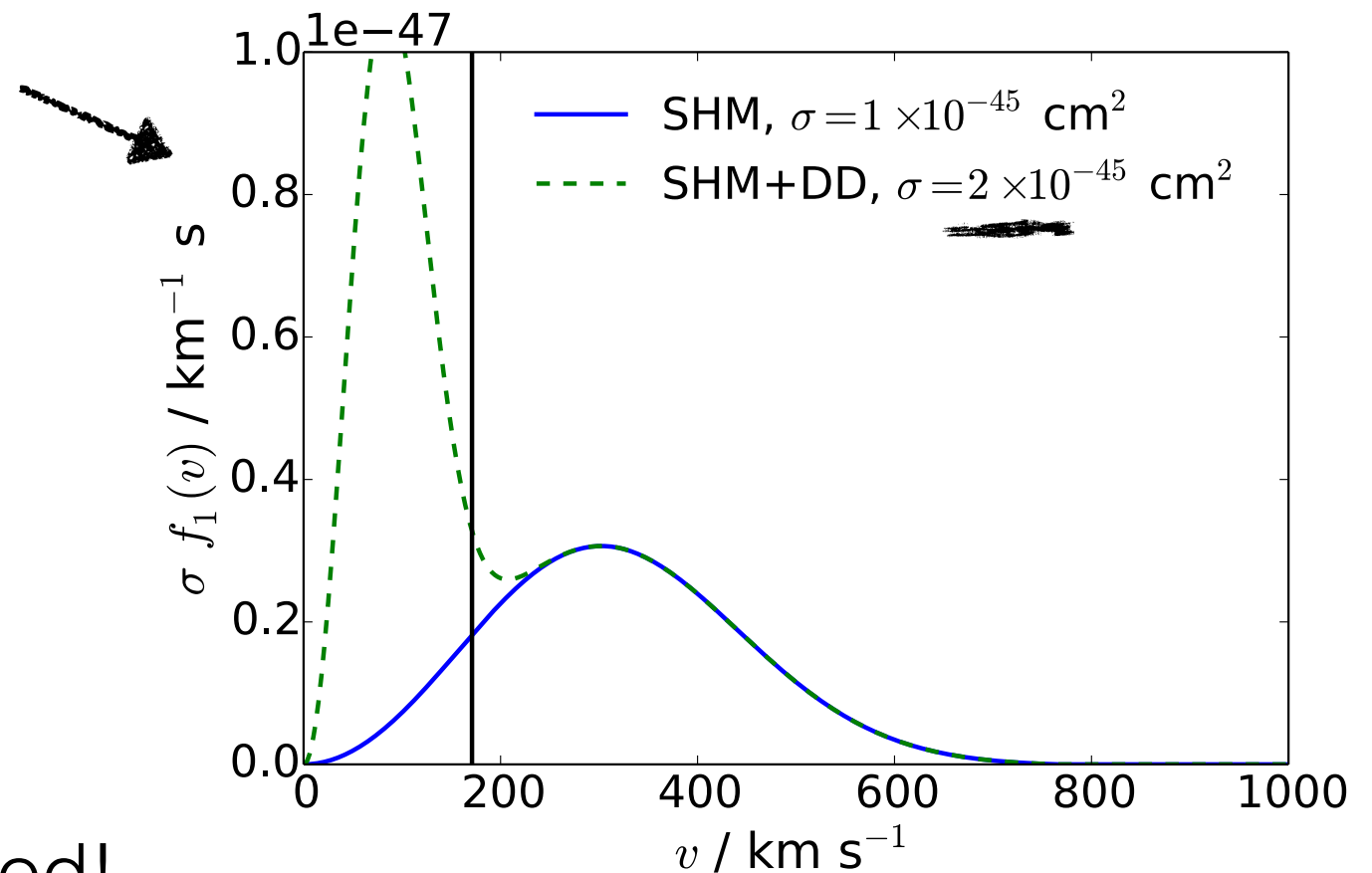
# Cross section degeneracy



Minimum DM speed probed by a typical Xe experiment

This is a problem for *any* astrophysics-independent method!

$$\frac{dR}{dE_R} \propto \sigma \int_{v_{\min}}^{\infty} \frac{f_1(v)}{v} dv$$



Can be solved by including data from Solar Capture of DM - sensitive to low speed DM particles

BJK, Fornasa, Green [1410.8051]

# Incorporating IceCube

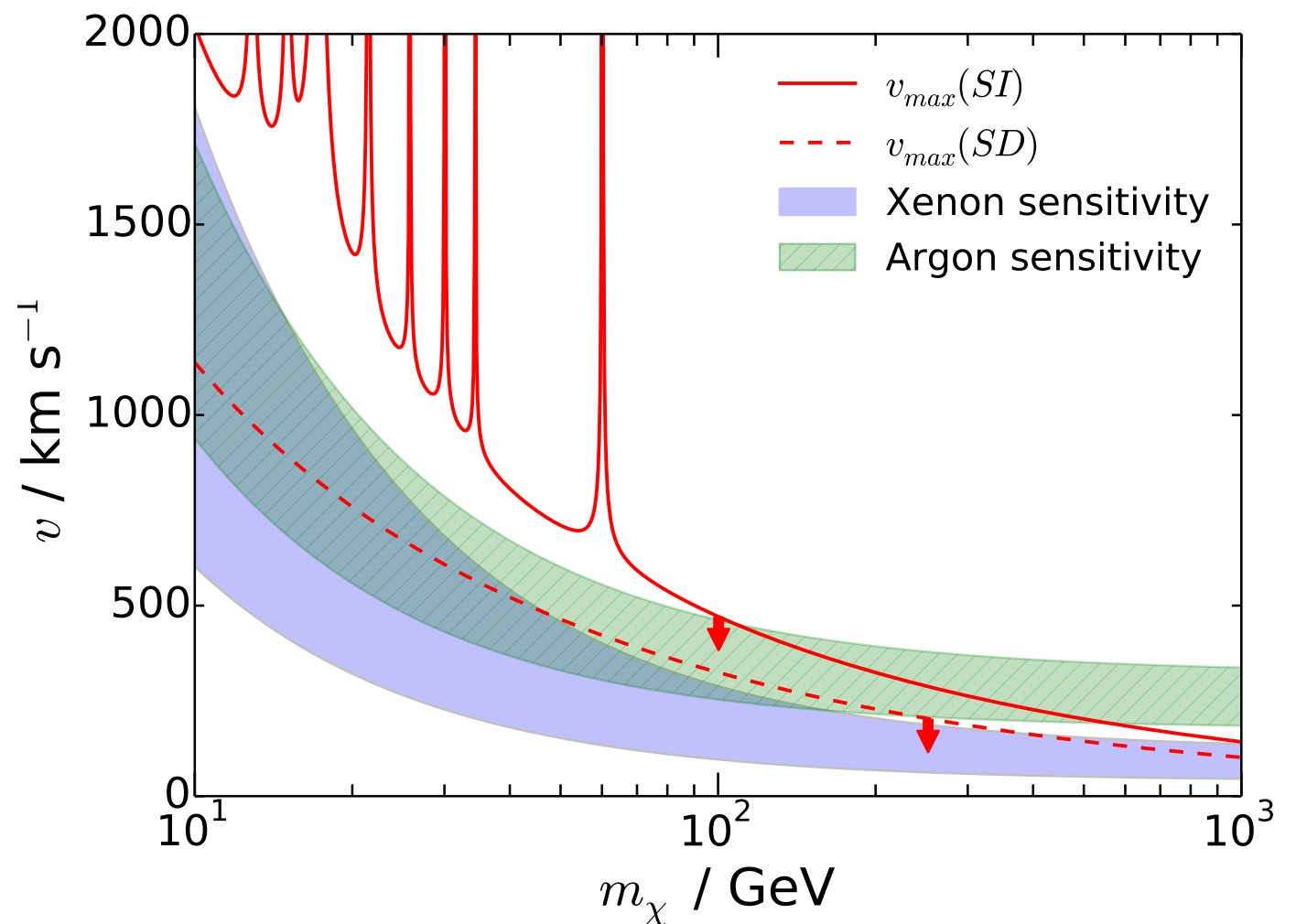
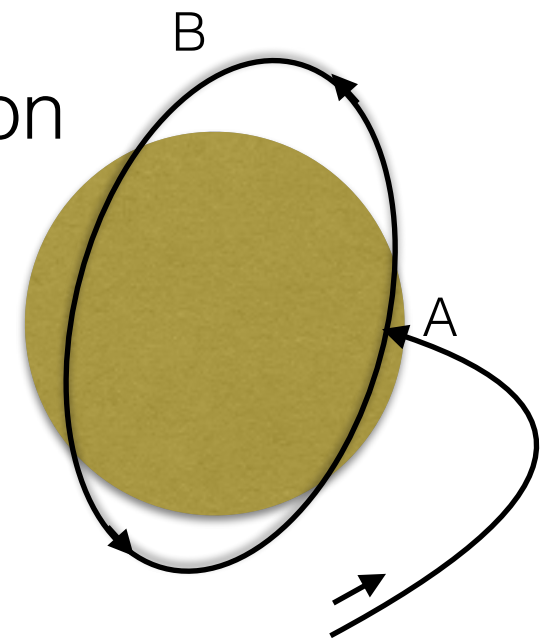
IceCube can detect neutrinos from DM annihilation in the Sun

Rate driven by solar capture of DM, which depends on the DM-nucleus scattering cross section

Crucially, only low energy DM particles are captured:

$$\frac{dC}{dV} \sim \sigma \int_0^{v_{\max}} \frac{f_1(v)}{v} dv$$

But Sun is mainly spin-1/2 Hydrogen - so we need to include SD interactions...



# Detectors Parameters

Xe detector

$$E_{\text{th}} = 5 \text{ keV}$$

1000 kg yr

$\sim 900$  events

Mohlabeng et al. [1503.03937]

Mock data from 2 ideal  
experiments

Consider with and without  
directionality

F detector

$$E_{\text{th}} = 20 \text{ keV}$$

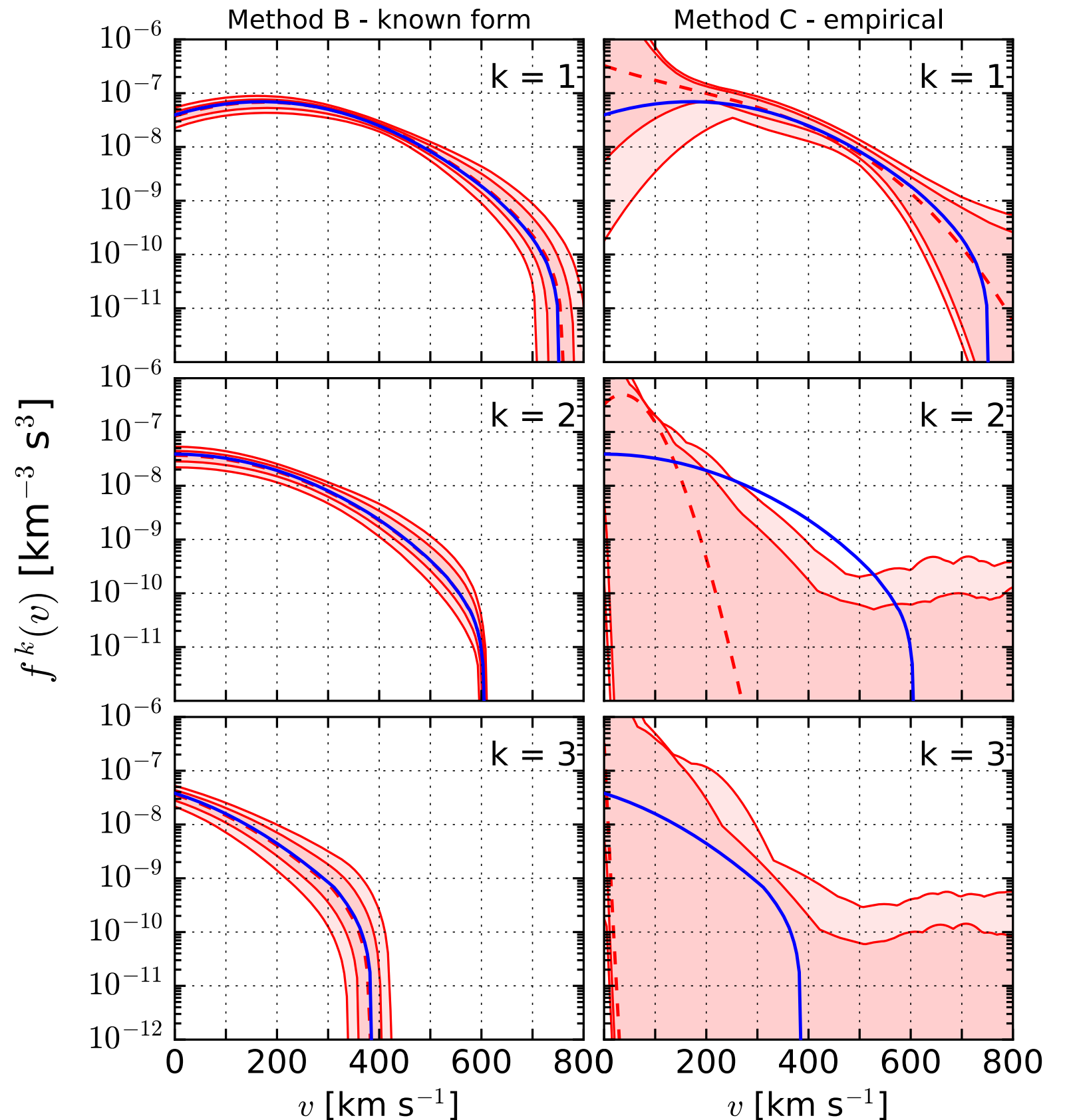
10 kg yr

$\sim 50$  events

DRIFT [1010.3027]

# SHM reconstructions

Directionality in Fluorine  
but *not* in Xenon



# SHM reconstructions

Directionality in both  
Fluorine and Xenon

