

# CLUMPY: A public code for $\gamma$ -ray and $\nu$ signals from dark matter structures.



**Moritz Hütten, DESY Zeuthen**

for the CLUMPY developers:

**Vincent Bonnivard, Moritz Hütten, Emmanuel Nezri,  
Aldée Charbonnier, Céline Combet, David Maurin**

TeVPA 2017, Columbus (Ohio)

<https://lpsc.in2p3.fr/clumpy/>

Bonnivard et al. (CPC, 2016), arXiv:**1506.07628**

Charbonnier et al. (CPC, 2012), arXiv:**1201.4728**



# Indirect DM detection in $\gamma$ -rays and $\nu$

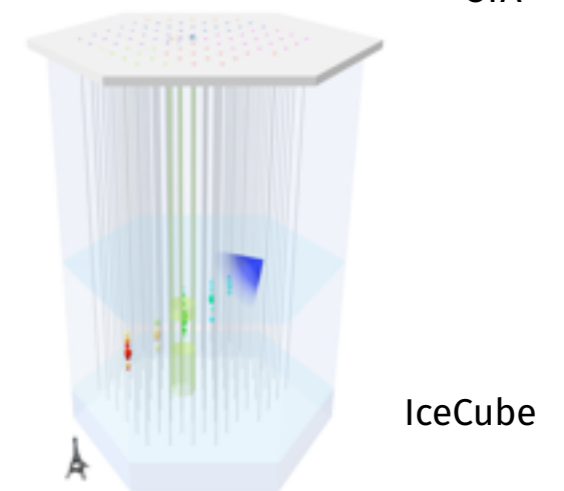
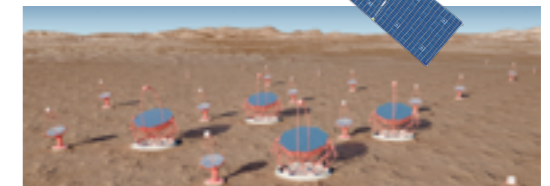
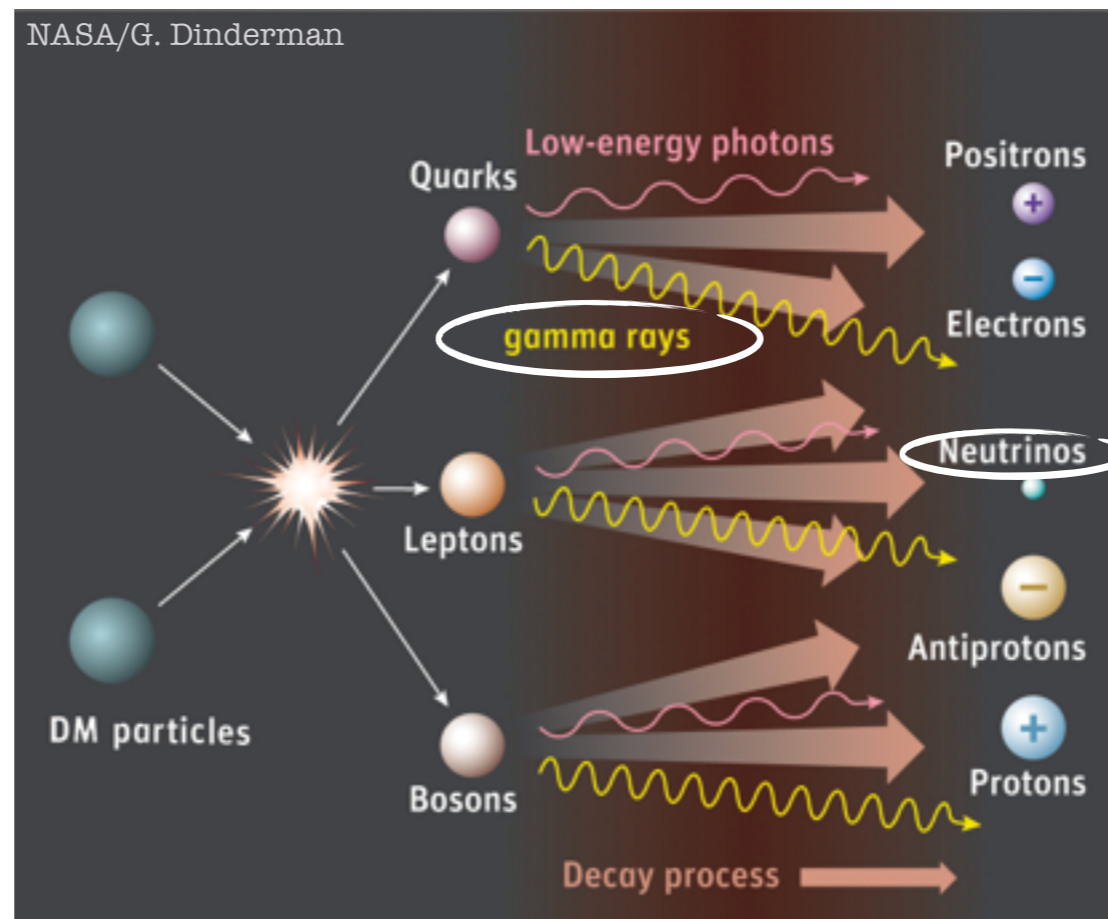
Dense & massive  
astrophysical  
DM budget



Annihilation or decay of the DM



Detectors for  
astrophysical  $\gamma$ -rays  
and neutrinos

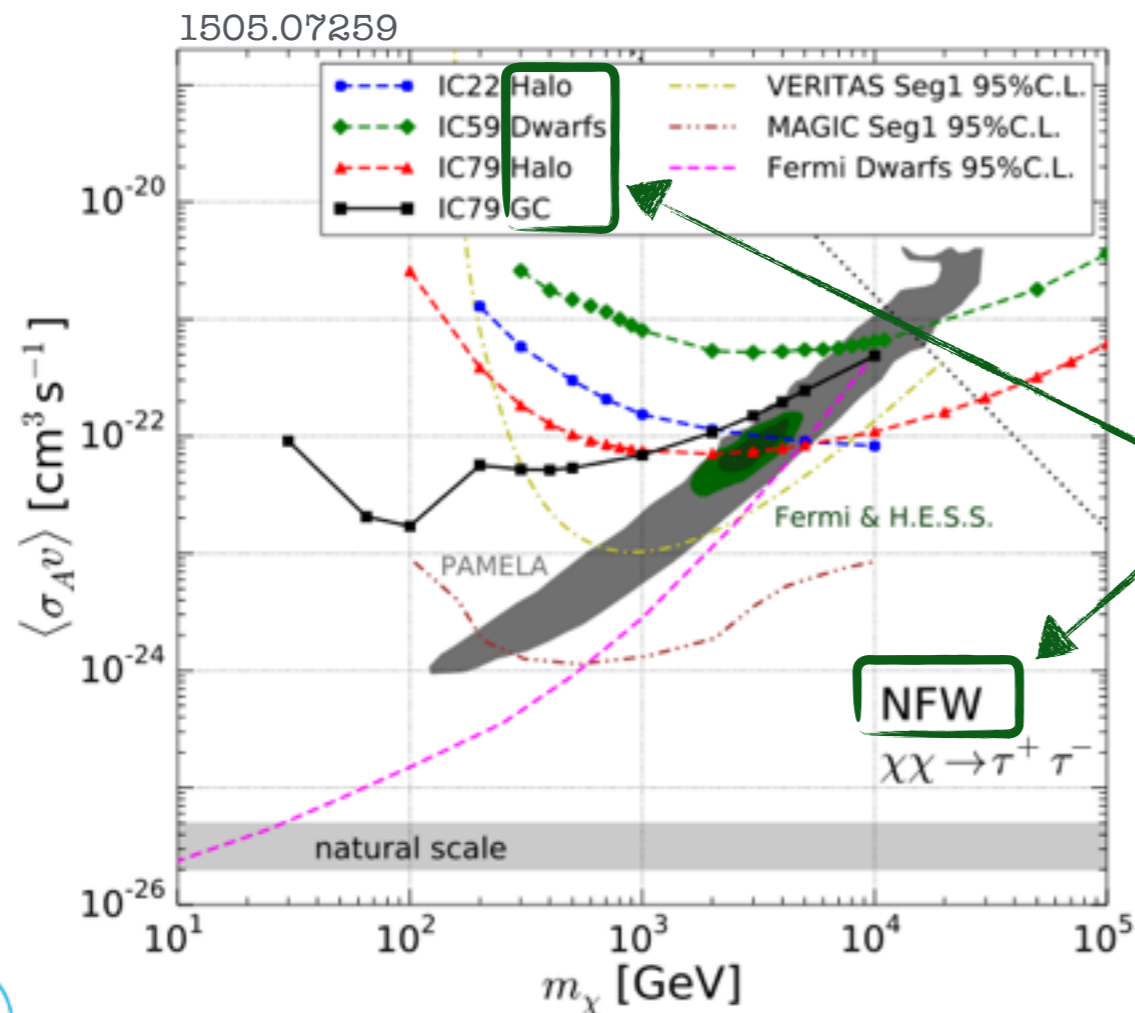


# Indirect DM detection in $\gamma$ -rays and neutrinos

$\gamma$ -ray/ $\nu$  flux in case of DM annihilation:

$$\frac{d\Phi_{\gamma}^{\text{ann.}}}{dE_{\gamma}} = \frac{1}{4\pi} \frac{\langle\sigma v\rangle}{2m_{\chi}^2} \times \frac{dN_{\gamma}}{dE_{\gamma}} \times \int_{\Delta\Omega} \int_{l.o.s.} \rho_{\text{DM}}^2 dl d\Omega$$

Flux = Particle physics  $\times$   $J$  : Astrophysical factor  $\approx \frac{1}{d^2} \frac{M^2}{V}$



**Detection or non-detection:**

$J$ -factor and uncertainty must be well-known to put constraints on DM candidate

**Annihilation:** Signal depends crucially on DM target and distribution (smooth + substructures)

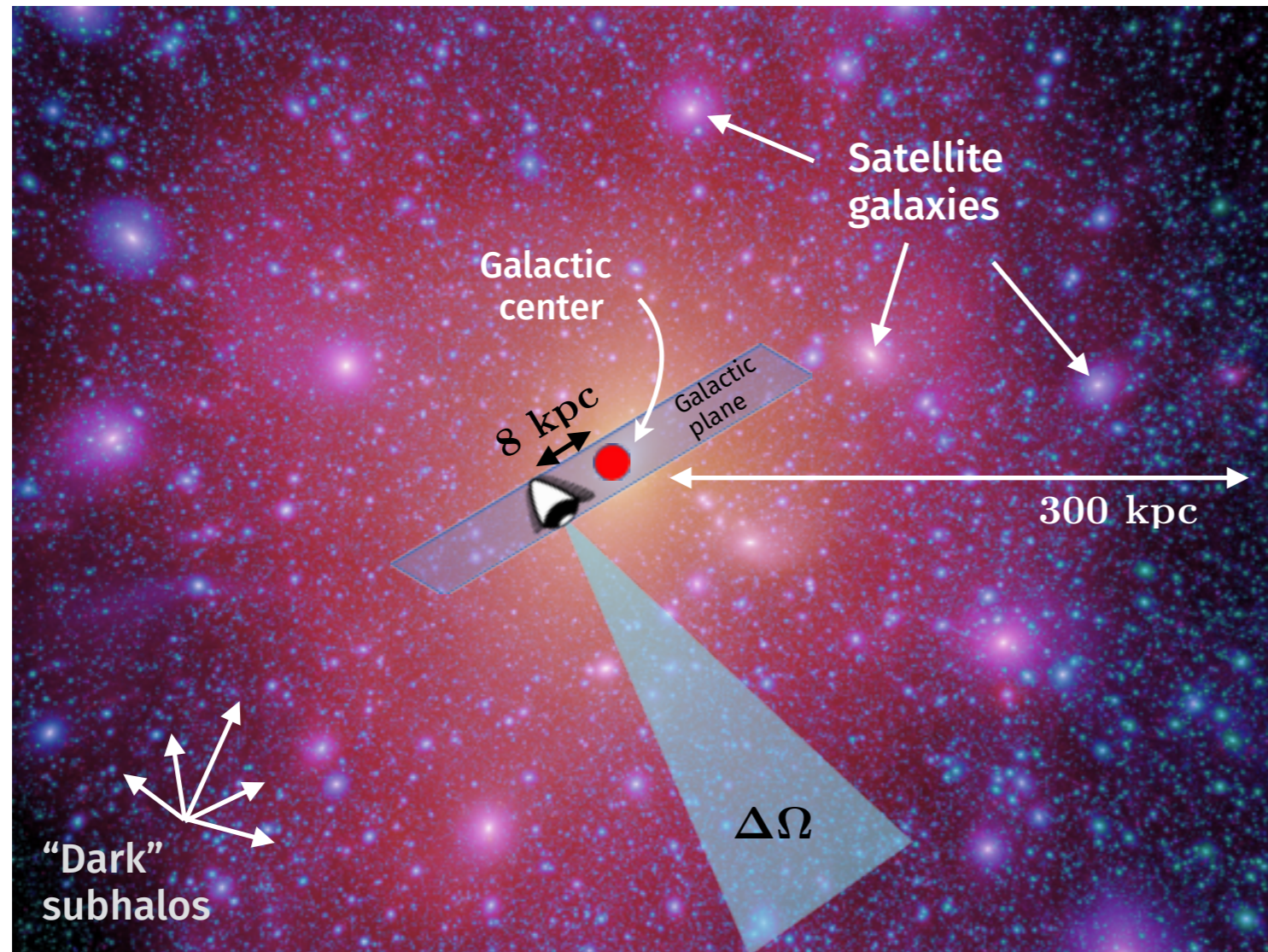
(CLUMPY can also do all calculations for DM **decay**, but skipped for this talk)



# Indirect DM detection in $\gamma$ -rays and neutrinos

## Where to look?

Massive & dense ( $M^2/V$ ) vs. close ( $1/d^2$ ) vs. little astrophysical background

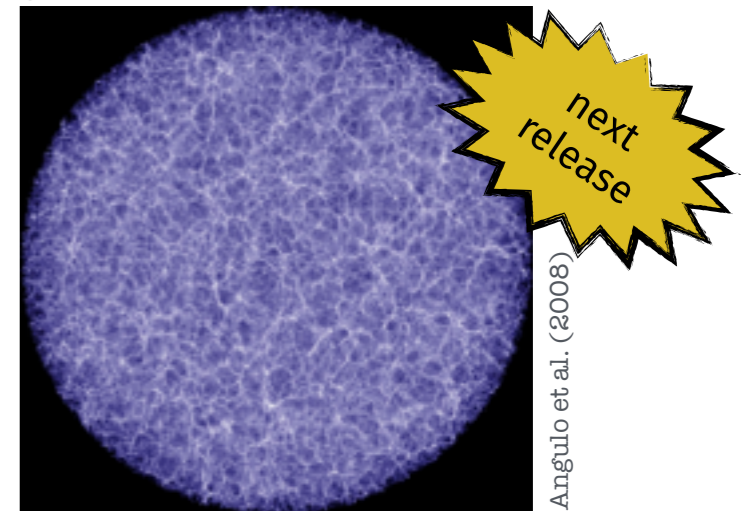


Aquarius simulation - Springel et al. (Nature, 2008)

+ single galaxy clusters ( $d > \text{Mpc}$ )



+ ensemble average of extra-galactic DM ( $d > \text{Gpc}$ )



Angulo et al. (2008)

CLUMPY calculates  $J$ -factors/fluxes for all the various targets

# What is CLUMPY?

<https://lpsc.in2p3.fr/clumpy/>  
Bonnivard et al. (CPC, 2016), arXiv:1506.07628  
Charbonnier et al. (CPC, 2012), arXiv:1201.4728

- **Open-source**, written in C/C++
- Depends on:
  - ▶ CERN's ROOT
  - ▶ Heasarc's cfitsio
  - ▶ **HEALPix** (next release shipped with frozen HEALPix version)
  - ▶ gsl
  - ▶ GreAT (lpsc.in2p3.fr/great, optional)
- Runs on **Linux** and **MacOS X**

CLUMPY Version\_2015.06\_corr2 [released 19/11/2015]

**CLUMPY Documentation**

If you use CLUMPY, please cite  
Charbonnier, Combet, Maurin, CPC 183, 656 (2012)  
Bonnivard, Hütten, Nezri, Charbonnier, Combet, Maurin (arXiv 1506.07628)

To install the code and have a quick overview before getting started, please visit the following pages:

- Introduction – J-factor calculation and conventions
- Download / Installation instructions – Archives of the code + installation instructions (README)
- Quick checks / examples – Command lines and outputs to quickly check CLUMPY
- Contact, bug reports, ASCII files

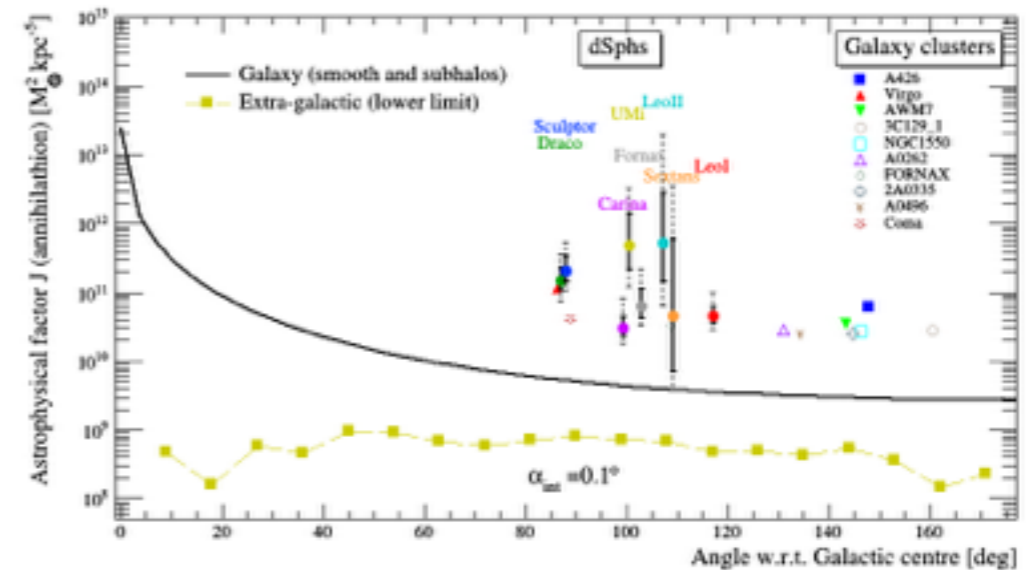
Generated on Thu Nov 19 2015 13:28:42 for CLUMPY by doxygen 1.8.9.1

Open source code to provide the community with reproducible and comparable  $J$ -factor values

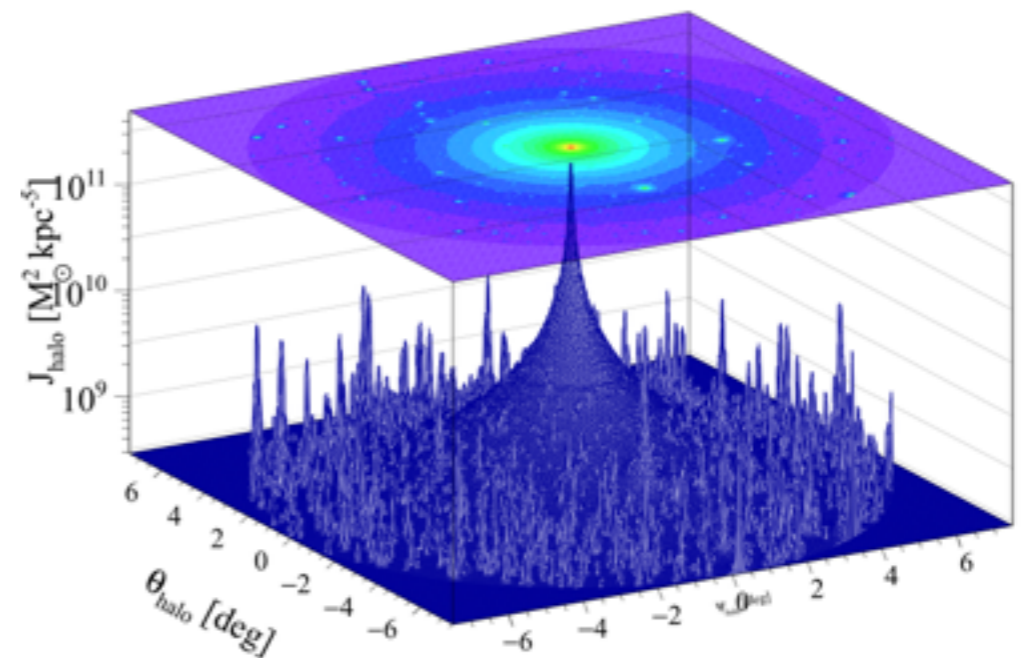
# CLUMPY features (I): $\rho_{\text{sm}} + \rho_{\text{subs}} \rightarrow J\text{-factor/flux}$

$J$ -factors/fluxes of individual objects (e.g. dSph's) from **pre-defined DM profiles**

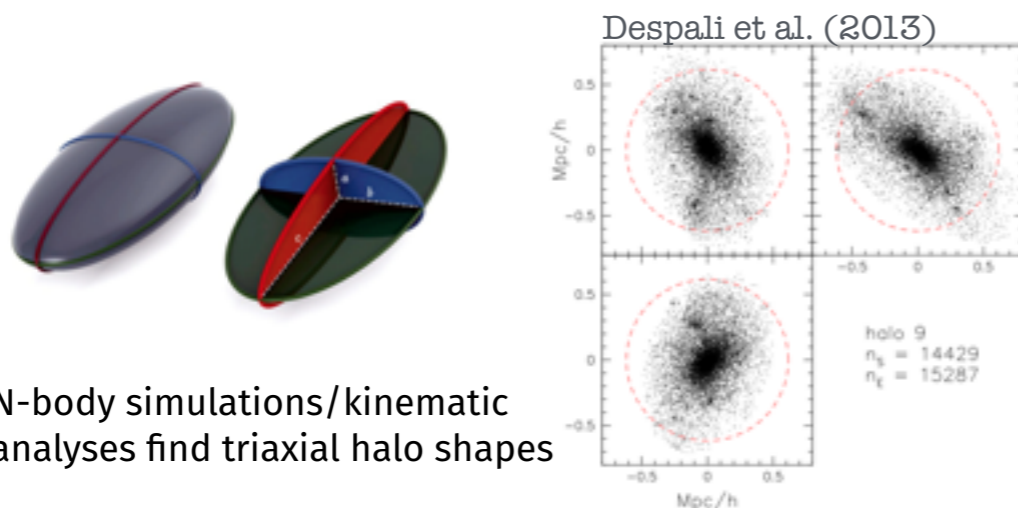
- Propagate error bars from DM profiles to  $J$ -factors and limits on DM  
(Bonnivard ApJ, MNRAS, 2015)
- Take into account **substructures**:
  - ▶ resolved (statistical) + unresolved: **boost**
  - ▶ vary distribution within host halo (antibiased, own profile,...)
  - ▶ Clumps within clumps: multiple levels of self-similar sub-subclustering (converges for  $\sim 2$  levels)
- allow **triaxial distortion** of halo profile (semiaxis ratio  $a, b, c$ )



Comparison of classical dSph, brightest galaxy clusters, and galactic DM foreground  
(Charbonnier et al., MNRAS, 2011; Nezri et al., MNRAS, 2012)



LMC  $dJ/d\Omega$  profile with resolved substructure model (analysis done by M. Castaño, São Paulo)



N-body simulations/kinematic analyses find triaxial halo shapes

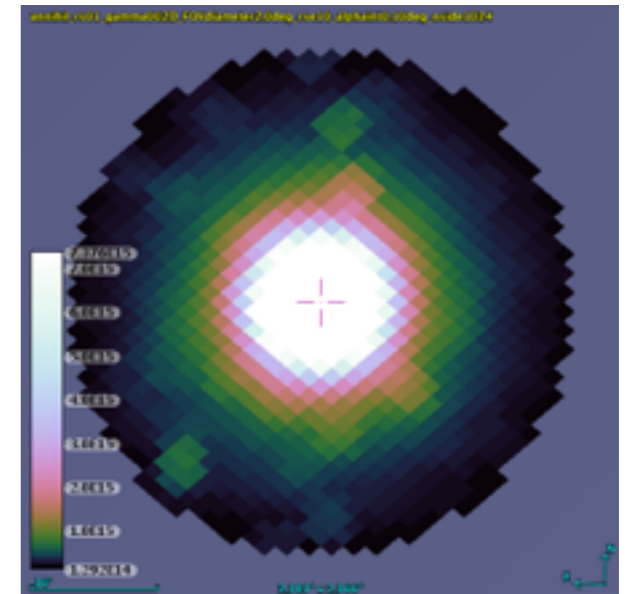


# CLUMPY features (I): $\rho_{\text{sm}} + \rho_{\text{subs}} \rightarrow J\text{-factor/flux}$

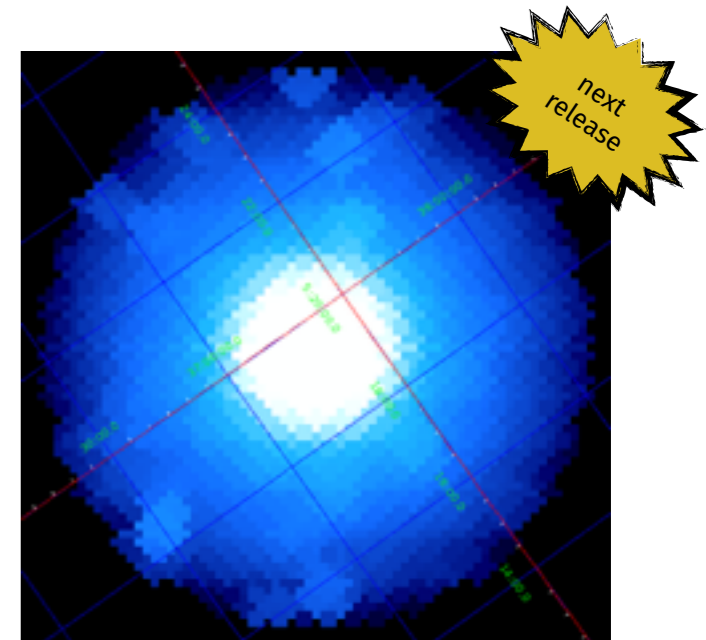
$J$ -factors/fluxes of individual objects (e.g. dSph's) from **pre-defined DM profiles**

- Directly compute differential/integral fluxes (1D and 2D), relying on PPC4DMID (Cirelli et al., 2010)
- ROOT pop-up graphics (1D and 2D)
- Choose output format: ROOT, HEALPix FITS (2D), ASCII
- FITS images interfaceable with **gammalib/ctools**
- **Correct cosmology** (line-of-sight and angular diameter distance) + **EBL flux absorption** for extragalactic objects

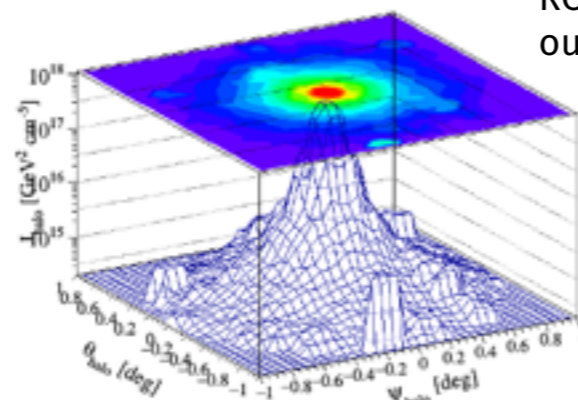
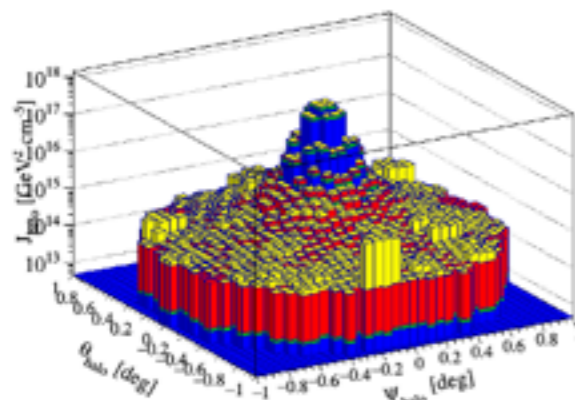
**gammalib/ctools**  
desy telescope app



HEALPix pixelization (FITS format)



projected FITS image



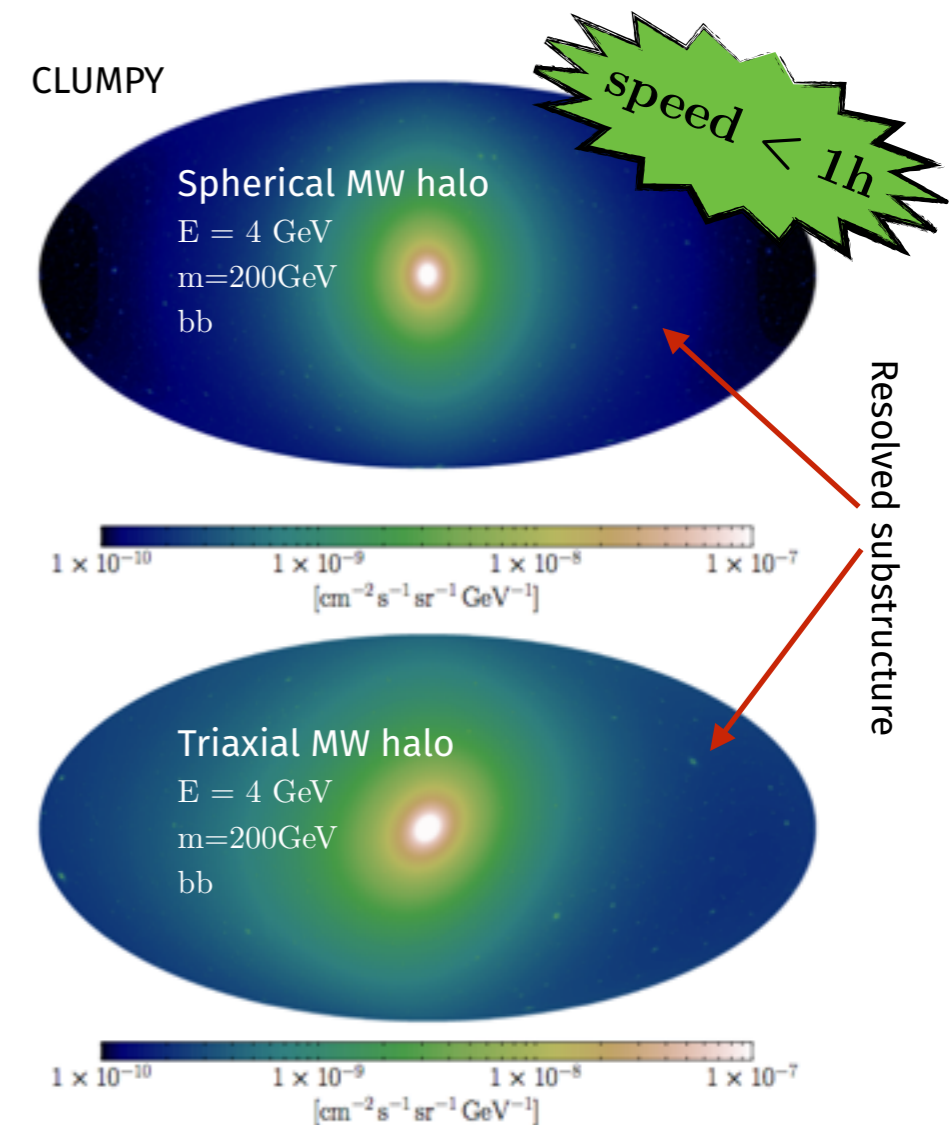
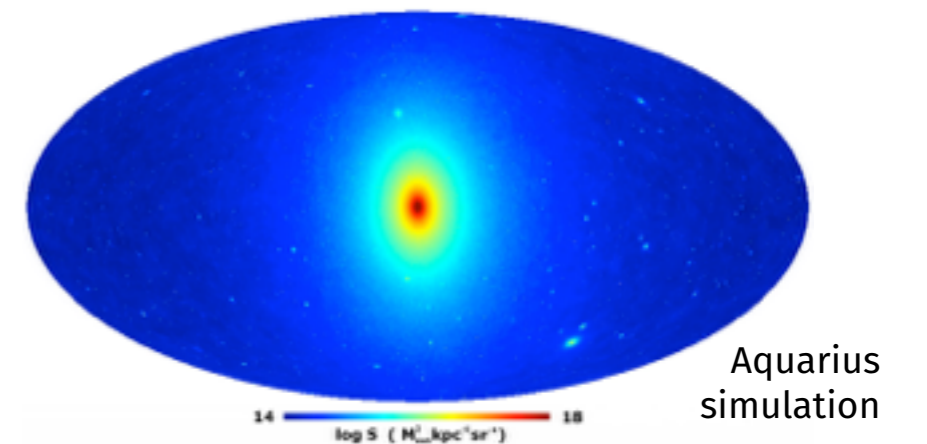
ROOT plots and output format

# CLUMPY features (II): Full-sky MW analysis with subhalos

## Skymaps of full or partial $J$ -factor sky from DM in the Milky Way halo

- Fast realistic synthetic skymaps at any instrumental resolution
  - ▶ check that we recover N-body simulation end-products from a handful of parameters
  - ▶ extend N-body simulation results by varying key parameters to study impact on halo/substructure brightness
- Resolved substructure
  - ▶ Smartly pre-select brightest subhalos for speed (e.g., reduce  $10^{15}$  total subhalos in the MW to  $\sim 10^4$  at a precision of 2% and  $\theta_{\text{int}} = 0.2^\circ$ ).
  - ▶ allows to do statistical assessment of MW substructure properties (average mass, distance, luminosity,...)
  - ▶ Application in the context of CTA and sensitivity to dark halo searches in Hütten et al., JCAP (2016)

▶ See my talk in DM session Friday, 2:45 p.m.





# CLUMPY features (III): Jeans analysis module

## From stellar kinematics to DM profile

- Light profile & velocity dispersion

$$I(R)$$

de-projection

$$\nu$$

stellar density

$$\sigma_p^2(R)$$

projection

$$\bar{v}_r^2$$

& radial velocity dispersion

- Spherical Jeans equation: solve for  $\bar{v}_r^2$

$$\frac{1}{\nu} \frac{d(\nu \bar{v}_r^2)}{dr} + \frac{2\beta_{\text{ani}} \bar{v}_r^2}{r} = -\frac{GM(r)}{r^2}$$

$\beta_{\text{ani}} = 1 - \bar{v}_\theta^2 / \bar{v}_r^2$  : anisotropy

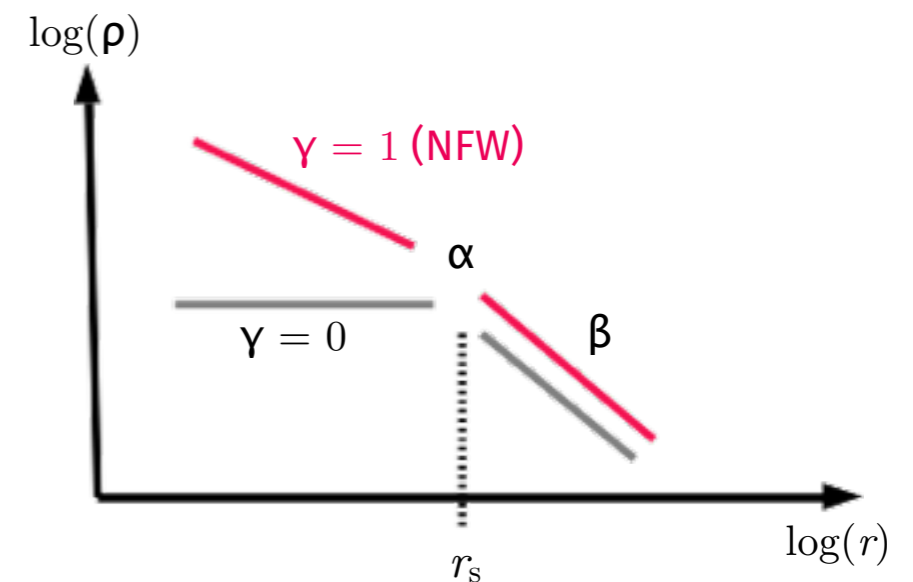
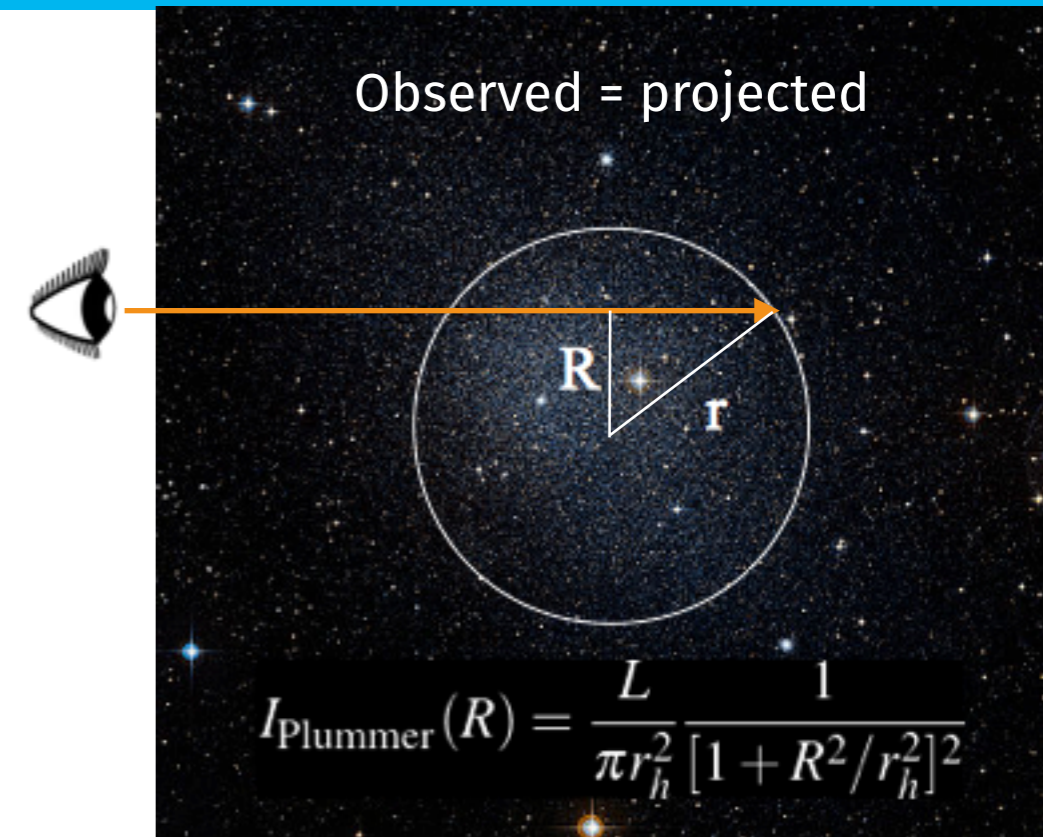
$M(r) = 4\pi \int_0^r \rho(r') r'^2 dr'$  enclosed mass

- Dark matter profile

$$\rho(r) = \frac{\rho_s}{\left(\frac{r}{r_s}\right)^\gamma \left[1 + \left(\frac{r}{r_s}\right)^\alpha\right]^{(\beta-\gamma)/\alpha}}$$

- $\chi^2$  or MCMC analysis to extract DM parameters

$\rho_s, r_s, \alpha, \beta, \gamma,$  and  $\beta_{\text{ani}}$



Data

Gravitation

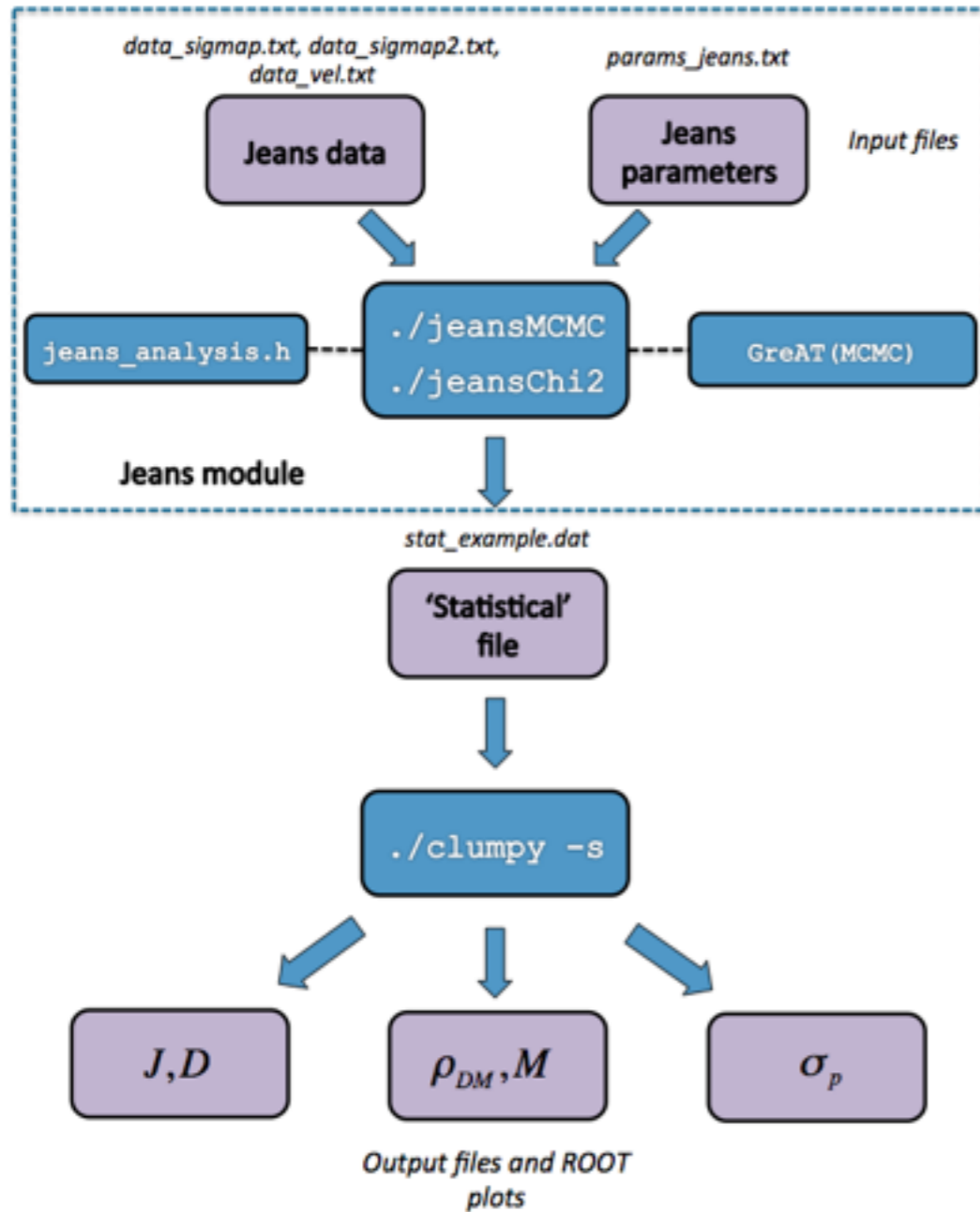
DM model

Fit



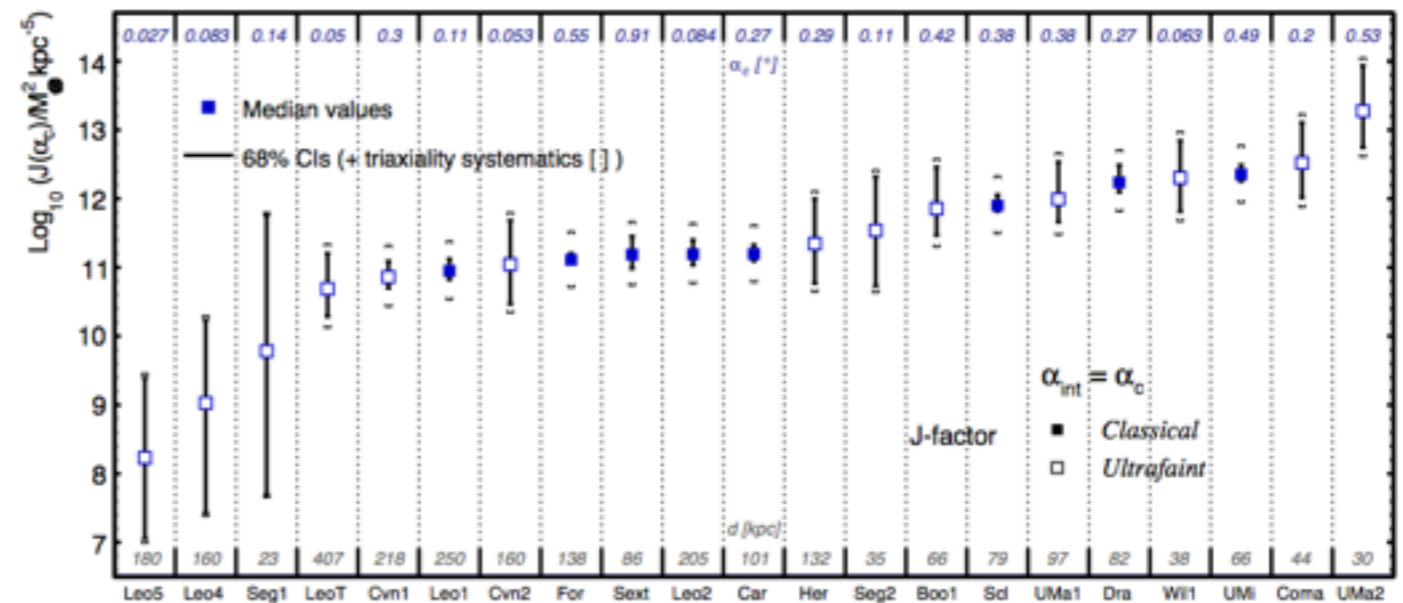
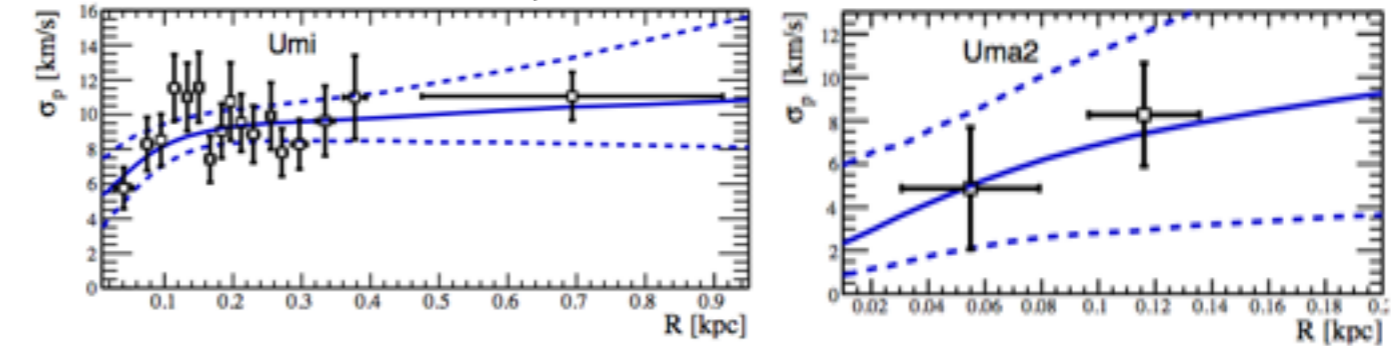
# CLUMPY features (III): Jeans analysis module

Dsph galaxy analysis: ranking and/or credible intervals



CLUMPY modules I + III together

Bonnivard et al. (2015, ApJL 808, 36 + MNRAS 453, 849)



Many new MW satellite galaxies just discovered (DES) & expected (e.g., LSST): CLUMPY can be used as soon as spectroscopic data is available



# Towards the next (3<sup>rd</sup>) release:

- **Extragalactic module IV:** Compute  $\gamma$ -ray and  $\nu$  fluxes from various extragalactic sources (total isotropic flux + variation)
- Improved output tailored to use CLUMPY with CTA tools (gammalib/ctools)
- Improved user input options (parameter file or command line options)
- Code compilation optimization for easier installation and platform-compatibility.
- Moved to git

▶ To be released within the next ~6 months (Hütten et al., in prep.)

Stay  
tuned!



CLUMPY: multi-purpose code for indirect DM detection modeling and analysis

- Code distribution and usage:
  - ▶ Open-source: reproducible and comparable  $J$ -factor calculations
  - ▶ User-friendly, fully documented using Doxygen, lots of examples & tests to run
  - ▶ All runs from single parameter file or command line (profiles, concentration, spectra...)
- Fast computation of:
  - ▶ Annihilation or decay astrophysical factors using any DM profile
  - ▶ Consistent boost from substructures
  - ▶ Integrated/differential fluxes in  $\gamma$ -rays and neutrinos, mixing user-defined branching ratios
- Four main modules / physics cases:
  - I. DM emission from list of objects (dSph galaxies, galaxy clusters)
  - II. Full-sky map mode for Galactic DM emission with substructure + additional objects from list
  - III. Jeans module: full analysis from kinematic data to  $J$ -factors for dSph
  - IV. Full-sky map mode for extragalactic DM emission (coming with the 3<sup>rd</sup> release)

Growing use in the community for state-of-the-art DM studies for many targets (dSphs, cluster, dark clumps...) and by several collaborations (ANTARES, HAWC, CTA)

Download <https://lpsc.in2p3.fr/clumpy/> + stay tuned for 3<sup>rd</sup> release!

# Thanks for your attention



# $J_{\text{tot}}$ integration, substructures, and boost factor

- Simple or „smooth“ DM density profile:  
No analytic  $J$ -factor expression for usual NFW, Einasto,..  
DM density profiles

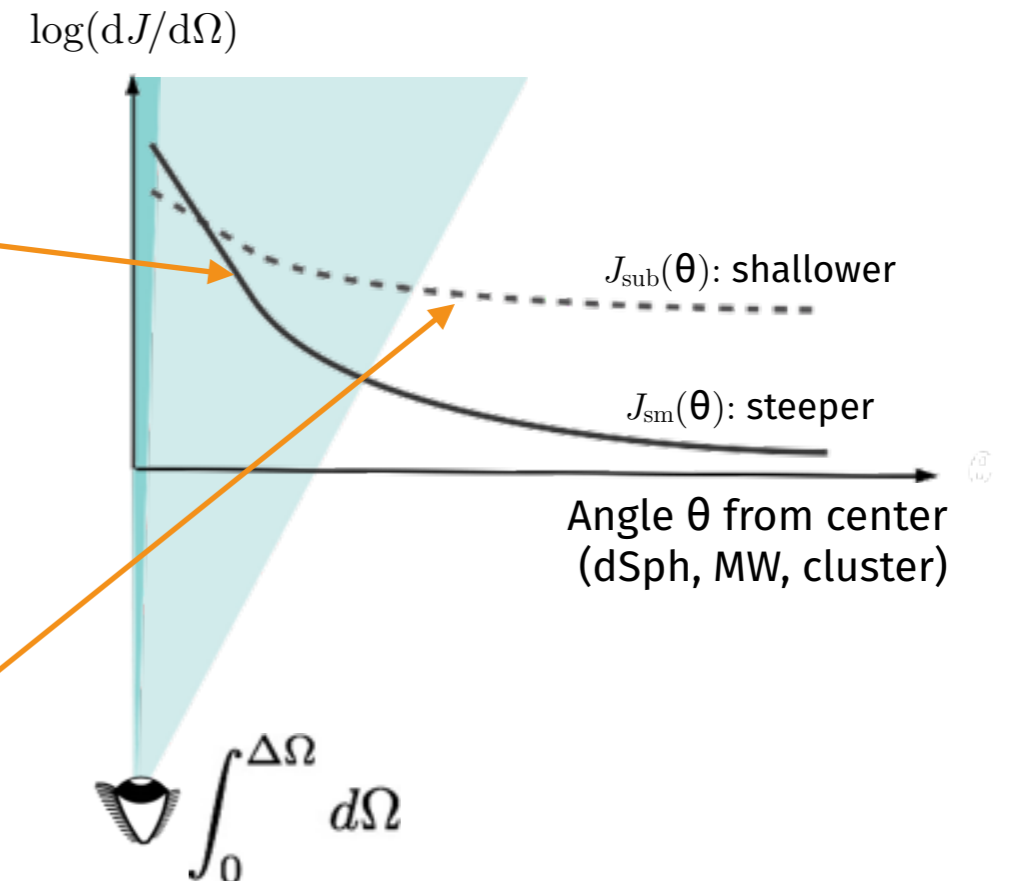
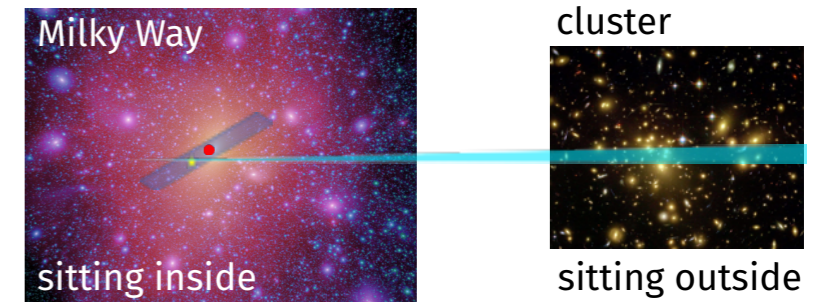
$$\frac{dJ_{\text{sm}}}{d\Omega}(\theta) = \int_{l_{\text{min}}}^{l_{\text{max}}} \rho_{\text{sm}}^2 dl$$

- numeric line-of-sight integration needed

- DM substructure:  
For DM annihilation, we have a boost from unresolved substructures in the halo,  $J = J_{\text{sm}} + \langle J_{\text{sub}} \rangle = \text{boost} \times J_{\text{sm}}$

$$\left\langle \frac{dJ_{\text{sub}}}{d\Omega}(\theta) \right\rangle = N_{\text{tot}} \int_{l_{\text{min}}}^{l_{\text{max}}} \frac{dP_V}{dV}(l) dl \int_{M_{\text{min}}}^{M_{\text{max}}} \mathcal{L}(M) \frac{dP_M}{dM} dM$$

- depending on  $dP/dV$ ,  $J_{\text{sub}}(\theta)$  not proportional to  $J_{\text{sm}}(\theta)$ !



dSph:  $\text{boost}(\theta) \sim 1 - 2$

Galaxy cluster:  $\text{boost}(\theta) \sim 10 - 100$

**CLUMPY does the fast numeric multi.-dim. integration of all the  $J$ -factor ingredients**

# $J_{\text{tot}}$ integration, substructures, and boost factor

$$J = \int_0^{\Delta\Omega} \int_{l_{\min}}^{l_{\max}} \frac{1}{l^2} \left( \rho_{\text{sm}} + \sum_i \rho_{\text{cl}}^i \right)^2 l^2 dl d\Omega$$

up to 20% of  $J_{\text{tot}}$  in some config.

$$J_{\text{sm}} \equiv \int_0^{\Delta\Omega} \int_{l_{\min}}^{l_{\max}} \rho_{\text{sm}}^2 dl d\Omega$$

$$J_{\text{cross-prod}} \equiv 2 \int_0^{\Delta\Omega} \int_{l_{\min}}^{l_{\max}} \rho_{\text{sm}} \sum_i \rho_{\text{cl}}^i dl d\Omega$$

$$J_{\text{subs}} \equiv \int_0^{\Delta\Omega} \int_{l_{\min}}^{l_{\max}} \left( \sum_i \rho_{\text{cl}}^i \right)^2 dl d\Omega$$

exact realisation (mass and position) of DM distribution unknown

Average description using mass and spatial distribution from simulations

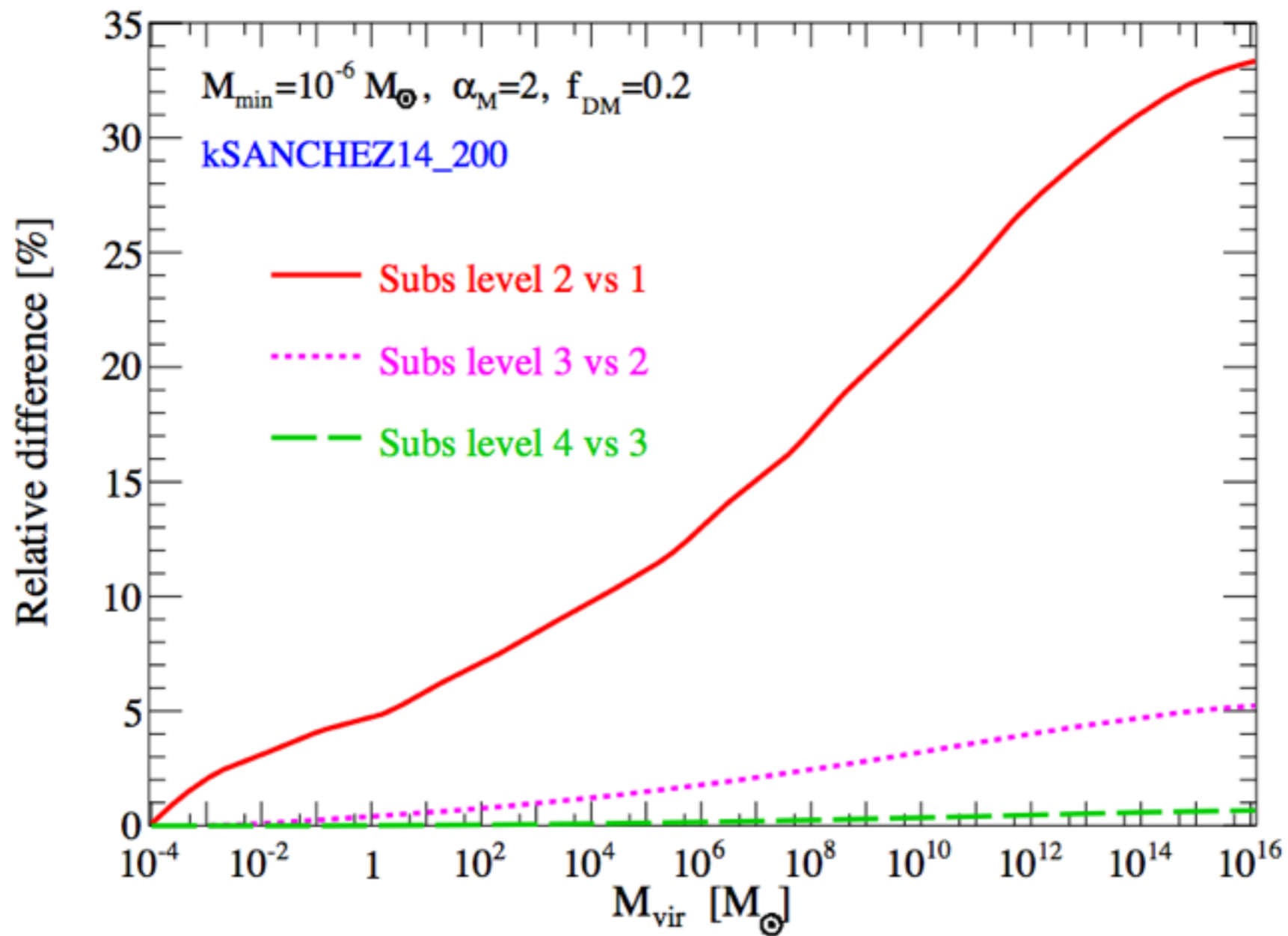
$$\langle J_{\text{cross-prod}} \rangle = 2 \int_0^{\Delta\Omega} \int_{l_{\min}}^{l_{\max}} \rho_{\text{sm}} \langle \rho_{\text{subs}} \rangle dl d\Omega$$

$$\langle J_{\text{subs}} \rangle = N_{\text{tot}} \int_0^{\Delta\Omega} \int_{l_{\min}}^{l_{\max}} \frac{d\mathcal{P}_V}{dV} dl d\Omega \int_{M_{\min}}^{M_{\max}} \mathcal{L}(M) \frac{\mathcal{P}_M}{dM} dM$$

$$\mathcal{L}(M) \equiv \int_{V_{\text{cl}}} (\rho_{\text{cl}})^2 dV$$



# Multi-level boost



- ▶ Signal converges quickly



# All parameters controlled from parameter file

Name	Definition
<b>Cosmological parameters</b> (updated from Planck results)	
gCOSMO_HUBBLE	Hubble expansion rate $h = H_0 / (100 \text{ km s}^{-1} \text{ Mpc}^{-1})$ [-]
gCOSMO_RH00_C	Critical density of the universe [ $M_\odot \text{ kpc}^{-3}$ ]
gCOSMO_OMEGAO_M	Present-day pressure-less matter density
gCOSMO_OMEGAO_LAMBDA	Present-day dark energy density
<b>Dark matter parameters</b>	
gDM_FLAG_CVIR_DIST	Distribution around $\bar{c}(M)$ from which concentrations are drawn: {kLOGNORM, kDIRAC}
gDM_LOGCVIR_STDDEV	Width of log-normal $c(M)$ distribution (if gDM_FLAG_CVIR_DIST=kLOGNORM)
gDM_SUBS_NUMBEROFLEVELS	Number of levels for subhaloes
gDM_MMIN_SUBS	Minimal mass of DM haloes [ $M_\odot$ ]
gDM_MMAXFRAC_SUBS	Defines the maximal mass of clump in host halo: $M_{\text{max}} = \text{gDM\_MMAXFRAC\_SUBS} \times M_{\text{host}}$
gDM_RHOSAT	Saturation density for DM [ $M_\odot \text{ kpc}^{-3}$ ]
<b>Generic (sub-)halo structural parameters</b> (TYPE = DSPH, GALAXY or CLUSTER)	
gTYPE_CLUMPS_{FLAG_PROFILE, ...}	Description of subhaloes for host TYPE: $c(M)$ , inner profile, shape parameters
gTYPE_DPDM_SLOPE	Slope of the clump mass function
gTYPE_DPDV_{FLAG_PROFILE, RSCALE, ...}	Spatial distribution of substructures in object TYPE
gTYPE_SUBS_MASSFRACTION	Mass fraction of the host halo in clumps
<b>Milky-Way DM (sub-)halo structural parameters</b>	
gGAL_CLUMPS_{FLAG_PROFILE, ...}	Description of Milky-way DM subhaloes
gGAL_DPDM_SLOPE	Slope of clump mass function
gGAL_DPDV_{FLAG_PROFILE, RSCALE, ...}	Spatial distribution of substructures in object TYPE
gGAL_SUBS_{M1, M2, N_INM1M2}	Number of Milky-Way subhaloes in $[M_1, M_2]$
gGAL_{RHOSOL, RSOL, RVIR}	Local DM density [ $\text{GeV cm}^{-3}$ ], distance GC–Sun [kpc], virial radius [kpc]
gGAL_TOT_{FLAG_PROFILE, RSCALE, ...}	Description of the total DM profile
gGAL_TRIAXIAL_AXES [0-3]	Dimensionless major ( $a$ ), intermediate ( $b$ ), and minor ( $c$ ) axes (see Eq. (18))
gGAL_TRIAXIAL_ROTANGLES [0-3]	Euler rotation angles for triaxial Milky-Way halo [deg]
gGAL_TRIAXIAL_IS	Switch-on or off triaxiality calculation (i.e., use or not the 2 parameters above)



# All parameters controlled from parameter file

## Particle physics ingredients (for $\gamma$ -ray and $\nu$ flux calculation)

<code>gPP_BR</code> [ <code>gN_PP_BR</code> ]	List of comma-separated values of branching ratios for the 28 channels
<code>gPP_DM_ANNIHIL_DELTA</code>	For annihilating DM, factor 2 in calculation if Majorana, 4 if Dirac
<code>gPP_DM_ANNIHIL_SIGMAV_CM3PERS</code>	For annihilating DM, velocity averaged cross-section $\langle\sigma v\rangle_0$ [ $\text{cm}^3 \text{s}^{-1}$ ]
<code>gPP_DM_DECAY_LIFETIME_S</code>	For decaying DM, lifetime $\tau_{\text{DM}}$ of DM candidate [s]
<code>gPP_DM_IS_ANNIHIL_OR_DECAY</code>	Switch for annihilating or decaying DM ( <i>replace deprecated</i> <code>gSIMU_IS_ANNIHIL_OR_DECAY</code> )
<code>gPP_DM_MASS_GEV</code>	Mass $m_{\text{DM}}$ of the DM candidate [GeV]
<code>gPP_FLAG_SPECTRUMMODEL</code>	Model to calculate final state ( <i>replace deprecated</i> <code>gDM_GAMMARAY_FLAG_SPECTRUM</code> )
<code>gPP_NUMIXING_THETA{12, 13, 23}_DEG</code>	Neutrino mixing angles [deg]

## Simulation parameters/outputs (for a given CLUMPY run)

<code>gLIST_HALOES</code>	DM haloes considered in $J$ -factor calculations [default= <code>data/list-generic.txt</code> ]
<code>gLIST_HALOES_JEANS</code>	Objects considered in Jeans's analysis [default= <code>data/list-generic-jeans.txt</code> ]
<code>gSIMU_ALPHAINT_DEG</code>	Integration angle $\alpha_{\text{int}}$ [deg] (if <code>gSIMU_HEALPIX_NSIDE</code> not -1, use HEALPix resolution)
<code>gSIMU_EPS</code>	Precision used for any operation requiring one (numerical integration, ...)
<code>gSIMU_SEED</code>	Seed of random number generator to draw clumps (if 0, from computer clock)
<code>gSIMU_FLAG_NUFLAVOUR</code>	Choice of neutrino flavour ( <code>kNUE</code> , <code>kNUMU</code> , <code>kNUTAU</code> )
<code>gSIMU_FLUX_AT_E_GEV</code>	Energy (GeV) at which to calculate fluxes
<code>gSIMU_FLUX_E_MIN</code>	Lower energy bound (GeV) for the integrated flux calculation
<code>gSIMU_FLUX_E_MAX</code>	Upper energy bound (GeV) for the integrated flux calculation
<code>gSIMU_GAUSSBEAM_GAMMA_FWHM_DEG</code>	Gaussian beam [deg] for $\gamma$ -ray detector for skymaps smoothing (no smoothing if set to -1)
<code>gSIMU_GAUSSBEAM_NEUTRINO_FWHM_DEG</code>	Gaussian beam [deg] for $\nu$ detector for skymaps smoothing (no smoothing if set to -1)
<code>gSIMU_HEALPIX_NSIDE</code>	$N_{\text{side}}$ of HEALPix maps (if -1, set to be as close as possible to $\alpha_{\text{int}}$ )
<code>gSIMU_HEALPIX_RING_WEIGHTS_DIR</code>	Ring weights directory for improved quadrature (optional)
<code>gSIMU_IS_ASTRO_OR_PP_UNITS</code>	Outputs (plots and files) in astro ( $M_{\odot}$ and kpc) or particle physics (GeV and cm) units.
<code>gSIMU_IS_WRITE_FLUXMAPS</code>	For 2D skymaps, whether to save or not $\gamma$ -ray and $\nu$ fluxes (the $J$ factor is always saved)
<code>gSIMU_IS_WRITE_FLUXMAPS_INTEG_OR_DIFF</code>	If <code>gSIMU_IS_WRITE_FLUXMAPS</code> is true, whether to save integrated or differential fluxes
<code>gSIMU_IS_WRITE_GALPOWERSPECTRUM</code>	Whether to calculate (and save) or not the DM power-spectrum for the Milky-Way
<code>gSIMU_IS_WRITE_ROOTFILES</code>	Whether to save or not <code>.root</code> files even if option <code>-p</code> is used (not enabled for skymaps and 'stat')
<code>gSIMU_OUTPUT_DIR</code>	Output directory to select other than local run (directory is <code>output/</code> if set to -1)

