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# Density-based debris cloud propagation and collision risk estimation through a binning approach

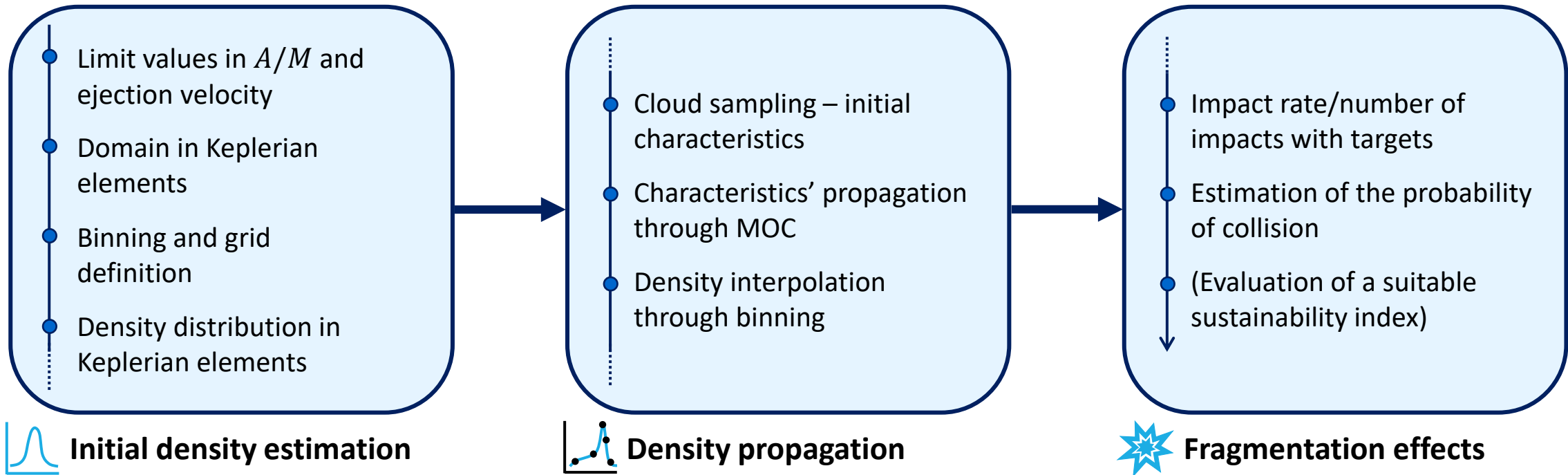
Lorenzo Giudici, Juan Luis Gonzalo, Mirko Trisolini, Camilla Colombo

6<sup>th</sup> Space Debris Modelling & Remediation Workshop

Milano, Italy | 18<sup>th</sup>-20<sup>th</sup> May 2022

# The model – Starling V2.0

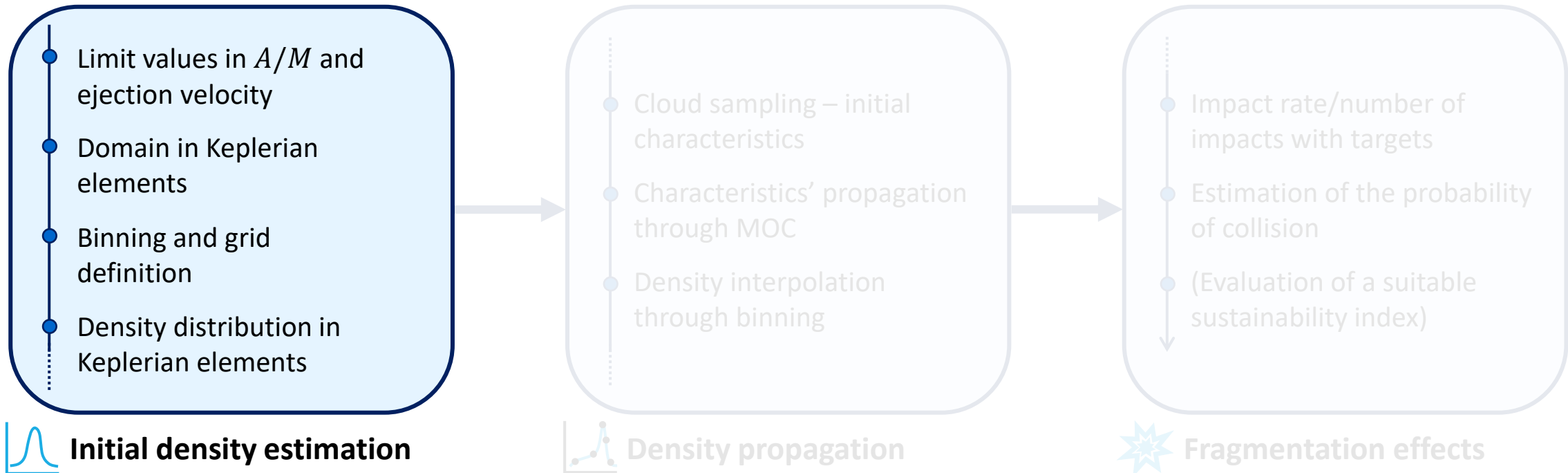
## Block diagram



- Giudici L., Colombo C., Trisolini M., Gonzalo J. L., Letizia F., Frey S., “Space debris cloud propagation through phase space domain binning,” Aerospace Europe Conference, Warsaw, Poland, 23-26 Nov. 2021.
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# Initial density estimation

Limit values in  $A/M$  and ejection velocity

- The fragments' characterisation relies on the probabilistic reformulation of the NASA Standard Breakup Model\*, according to 3 PDF:
  1. **Characteristic length:**  $p_\lambda$
  2. **Area-to-mass ratio:**  $p_{\chi|\lambda}$  (conditional)
  3. **Ejection velocity:**  $p_{v|\chi}$  (conditional)

$\lambda = \log_{10}(L), v = \log_{10}(\Delta v), \chi = \log_{10}(A/M), L = \text{characteristic length}, \Delta v = \text{ejection velocity}, A/M = \text{area-to-mass ratio}$

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  - Division of the domain in  $\chi$  in  $N_\chi$  bins
  - Cumulative density function  $F_\chi, F_v$
  - User-defined accuracy level  $\xi \in [0,1)$ 

Fraction of fragments probabilistically described by the model

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$N_\chi + 2$  equations solved numerically through:

- Root finding algorithms
- Function minimisation routines

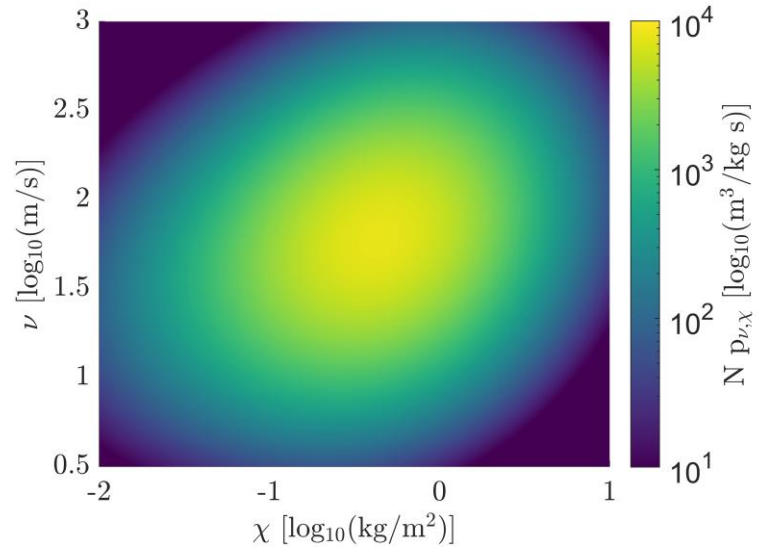
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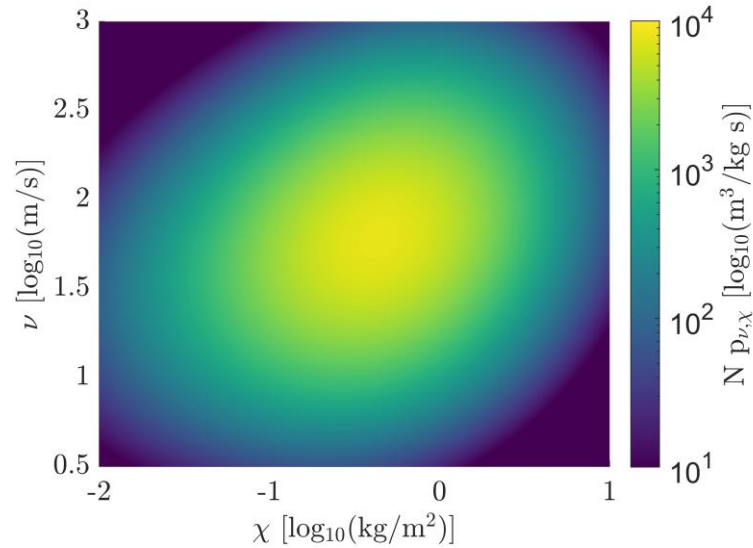


*Rocket body explosion, distribution in  $(\chi, \nu)$*



# Initial density estimation

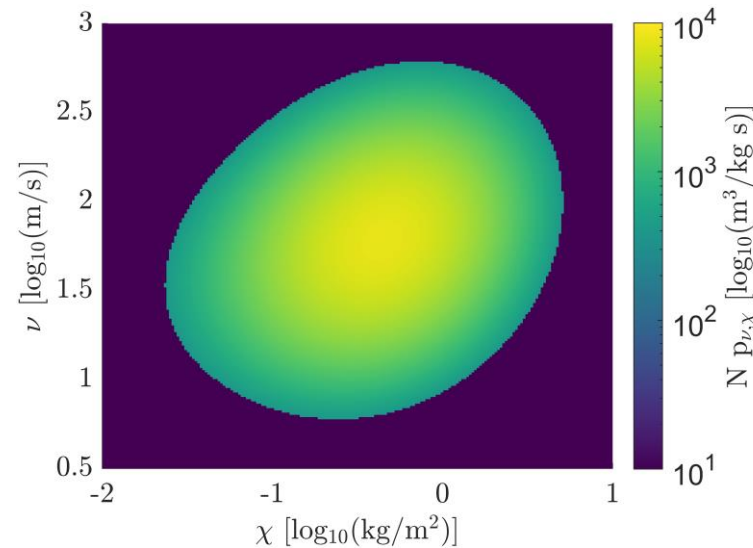
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$$p_{\min} = \bar{p}_{\chi, \nu}(\xi) : \int_{\bar{p}_{\chi, \nu}(\xi)}^{\infty} dp_{\chi, \nu} = \xi$$

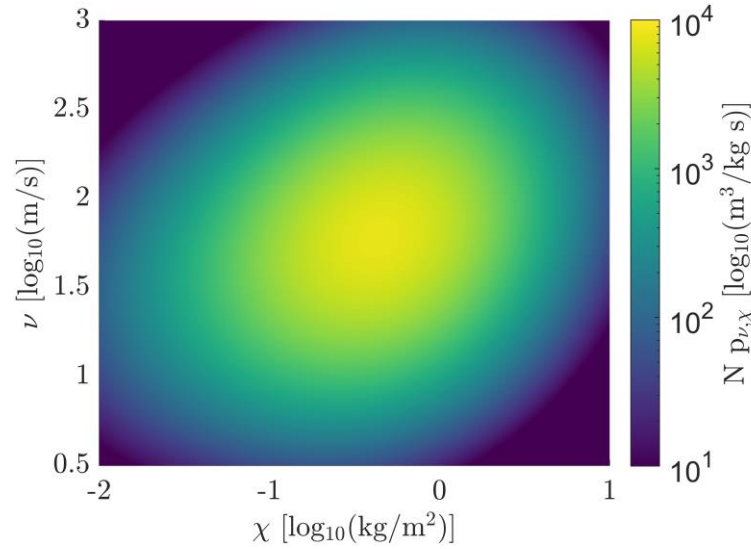
Rocket body explosion, distribution in  $(\chi, \nu)$  containing 95 % of the fragments' population





# Initial density estimation

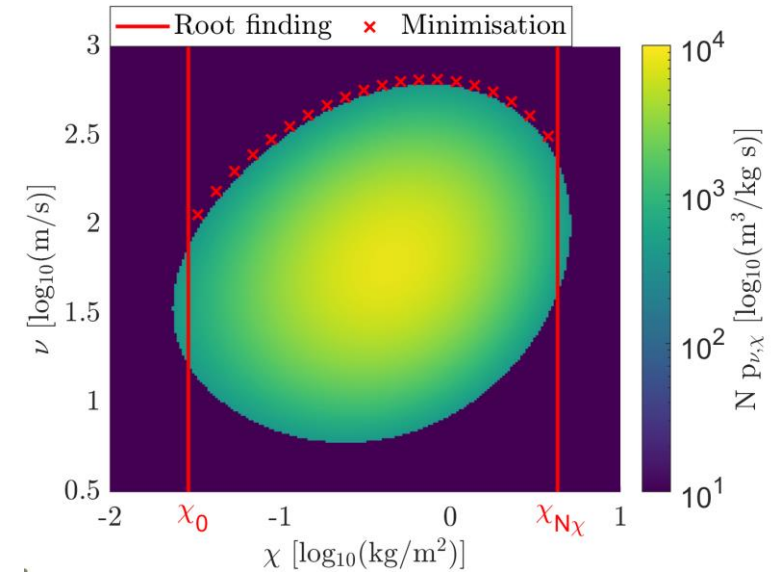
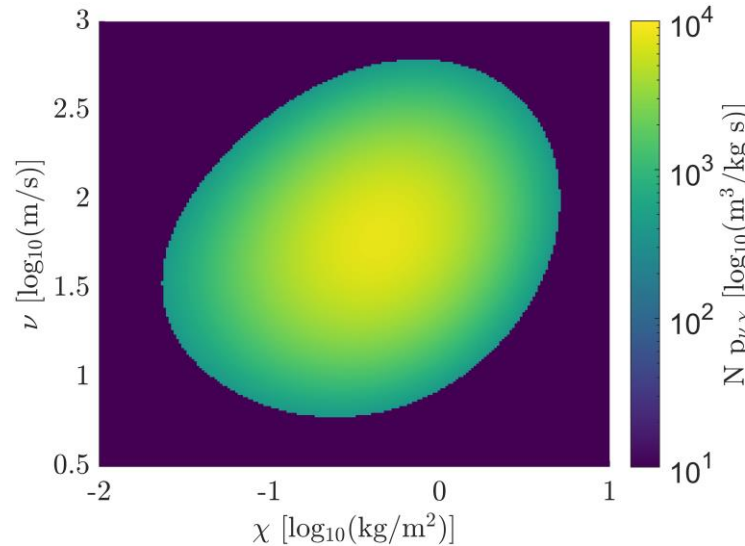
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Rocket body explosion, distribution in  $(\chi, \nu)$  containing 95 % of the fragments' population – Predicted limits in  $\chi$  and  $\nu$  with  $\xi = 0.95$

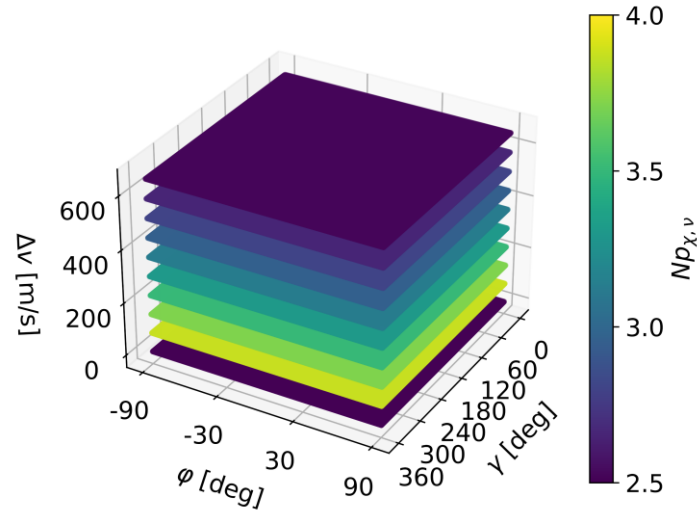
# Initial density estimation

## Dimensionality preserving transformation

### Cartesian coordinates (+ $A/M$ )

- Fragments share same initial position  $\mathbf{r}_P$
- 3D isotropic distribution in ejection velocity vector  $\Delta\mathbf{v}$

*3D density distribution in ejection velocity*



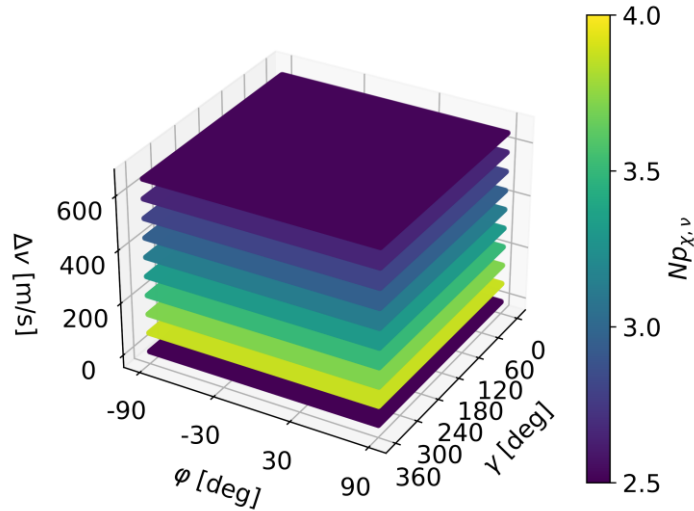
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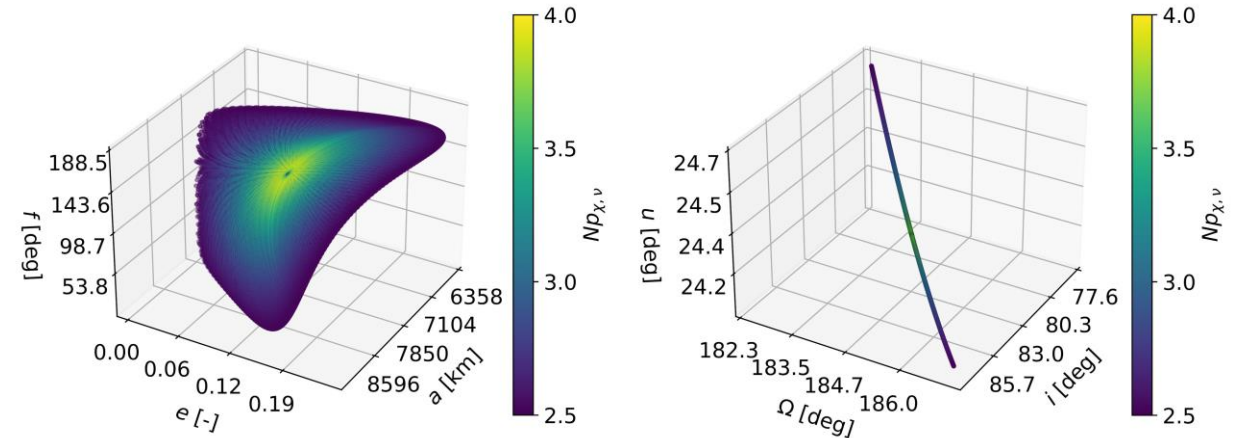
3D density distribution in ejection velocity



### Keplerian elements (+ $A/M$ )

- Given  $\mathbf{r}_P$ , for each  $(a, e, i)$  there exist 4 possible  $(\Omega_k, \omega_k, f_k)$  that guarantee intersection

3D density distribution in Keplerian elements, made up of a surface- and line-like distributions



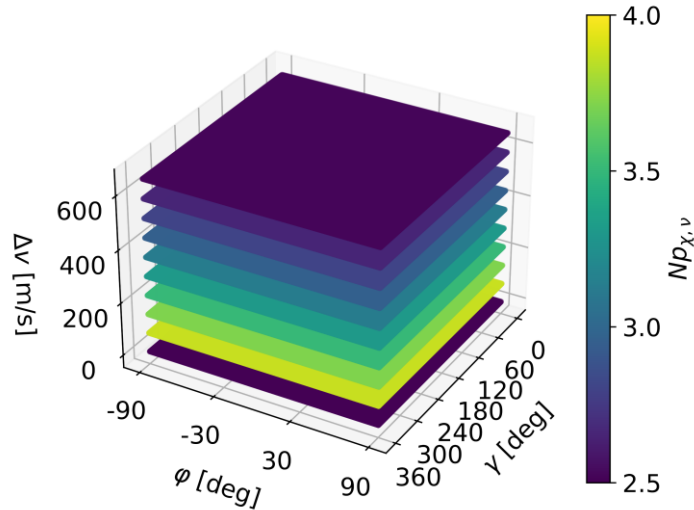
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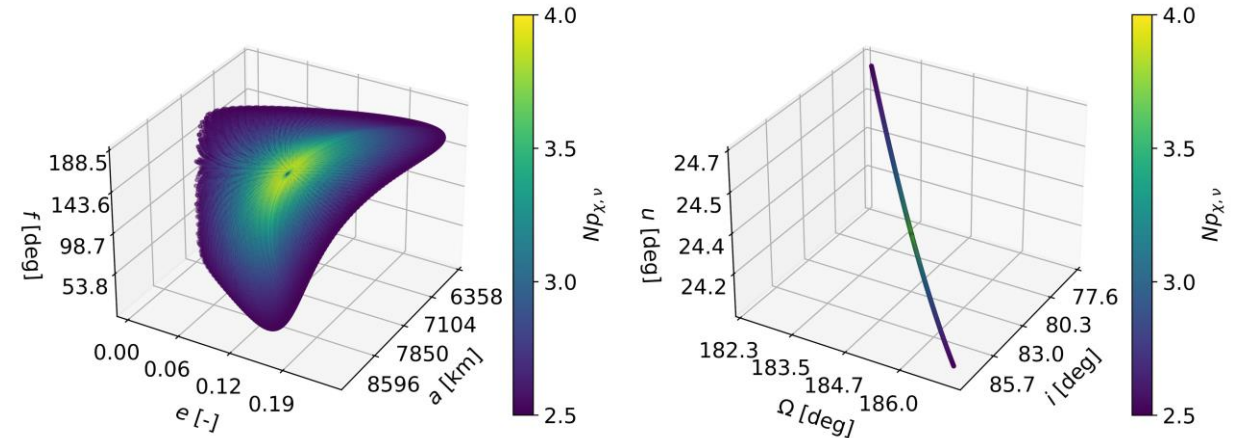
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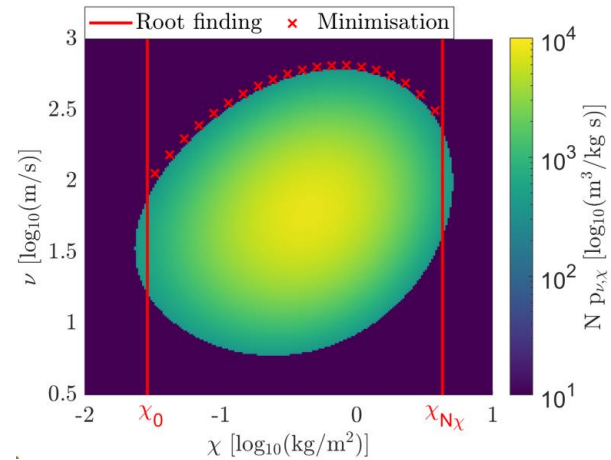
Domain in Keplerian elements defined in the subset  $(a, e, i)$

# Initial density estimation

## Domain in Keplerian elements

*Fragmentation properties*

2D distribution in  $A/M$  and  $\Delta v$ , bounded by  $(\chi_0, \chi_{N\chi}, \nu_j)$



Domain in Keplerian elements defined in the subset  $(a, e, i)$

# Initial density estimation

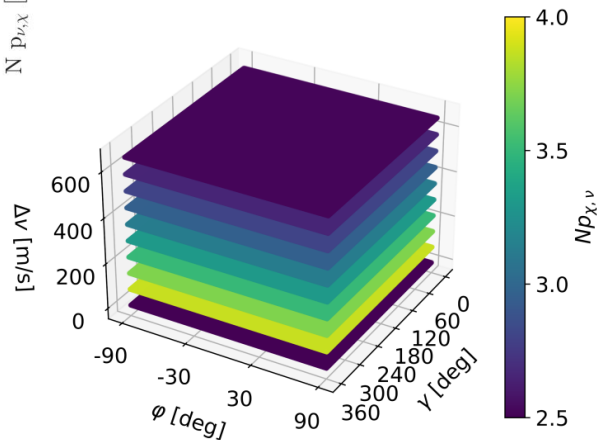
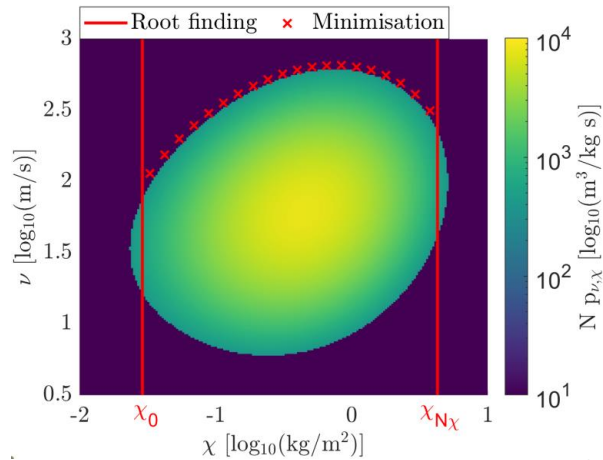
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Isotropic  $\Delta v$  distribution

4D distribution in  $A/M, \Delta v, \gamma$  and  $\phi$



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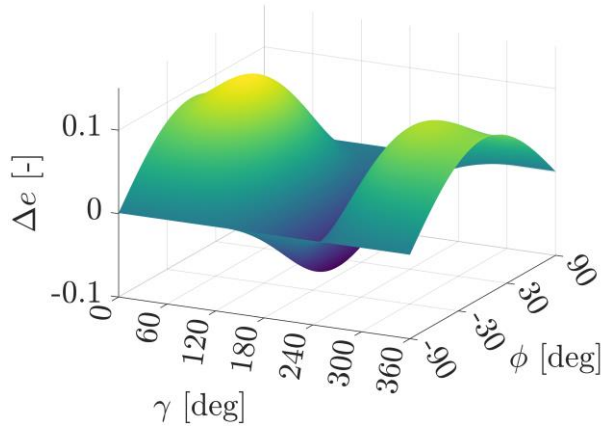
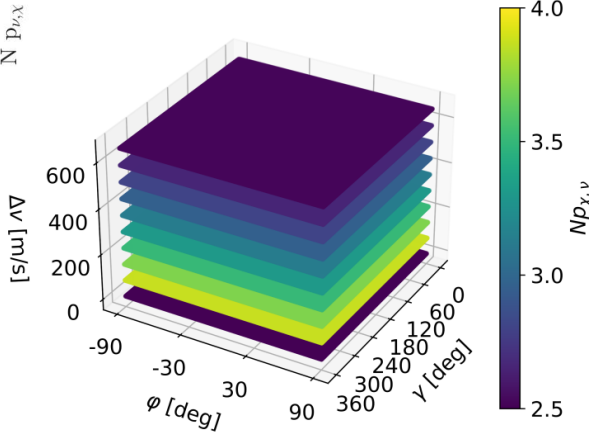
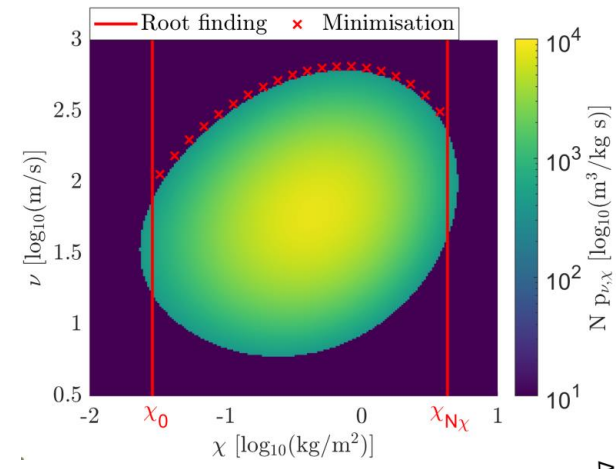
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4D distribution in  $A/M, \Delta v, \gamma$  and  $\phi$

Relations  $\Delta\alpha = f(\Delta v)$

Variations  $\Delta a, \Delta e, \Delta i$  as function of  $\Delta v$

Domain in Keplerian elements defined in the subset  $(a, e, i)$





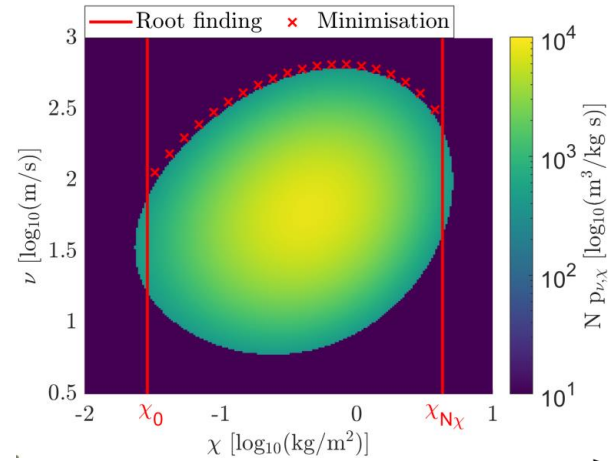
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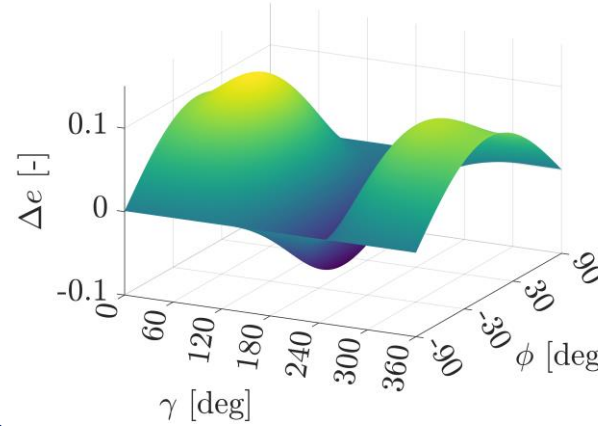
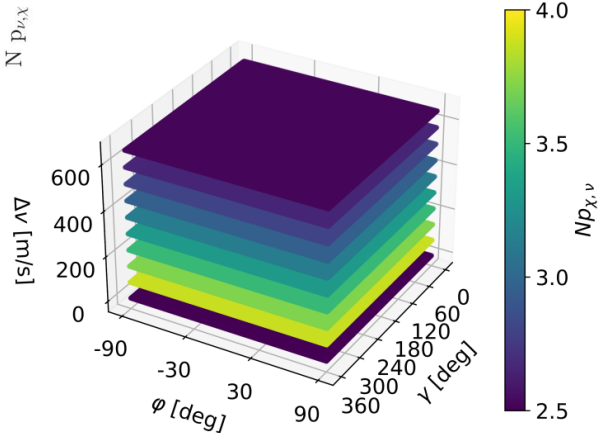
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Relations  $\Delta\alpha = f(\Delta v)$



Variations  $\Delta a, \Delta e, \Delta i$  as function of  $\Delta v$

If  $\xi$  is high enough:

- Averaging over  $\gamma, \phi \rightarrow \overline{\Delta\alpha} = \overline{\Delta\alpha}(\Delta v)$
- Maximisation over  $\Delta v \rightarrow \mathcal{D}_\alpha$

Domain in Keplerian elements defined in the subset  $(a, e, i)$

# Initial density estimation

## Density distribution in Keplerian elements

Density distribution approximated through a **binning approach**:

- Domain divided into bins with size proportional to the average density gradient:

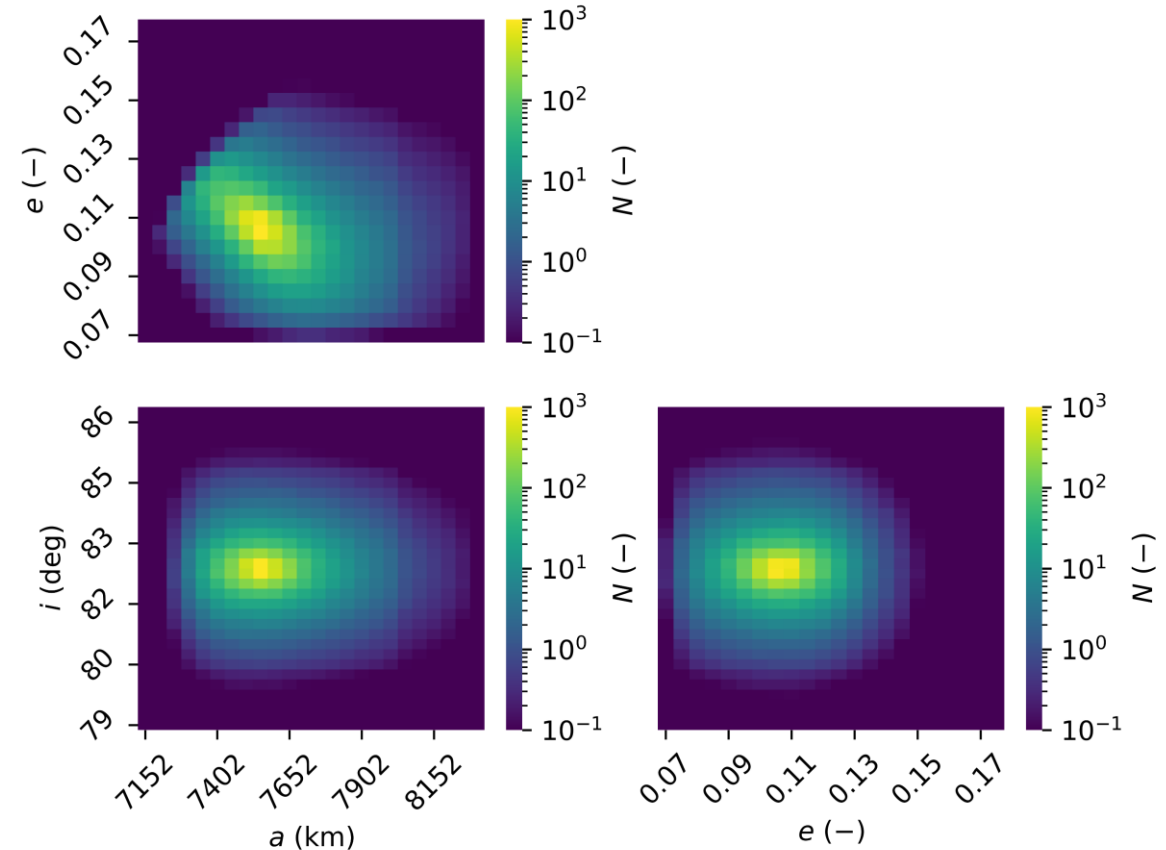
$$\delta \alpha \propto \nabla_{\alpha} p_{v,\chi}$$

- Density in Keplerian elements obtained through change of variable transformation:

$$p_{\alpha,A/M} = \frac{p_{\Delta v,A/M}(\psi_{s \rightarrow \alpha}^{-1}(\alpha))}{|\det J_{s \rightarrow \alpha}|}$$

- Density in each bin averaged through Monte Carlo integration

Initial density distribution in semi-major axis, eccentricity and inclination for the hypothetical explosion of satellite Cosmos-2292 in LEO

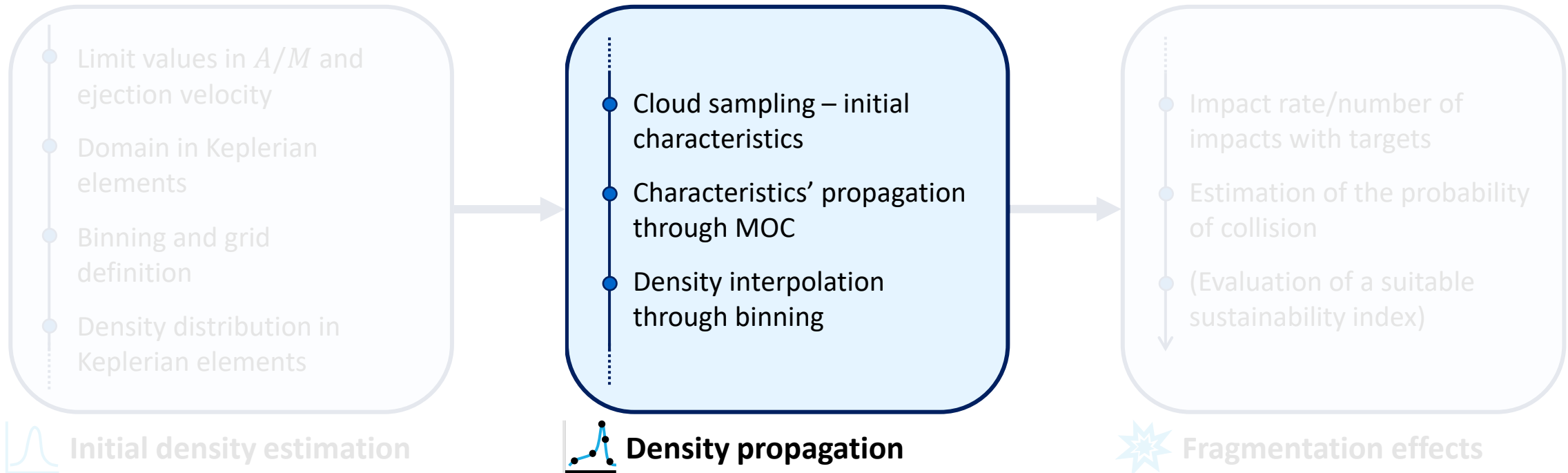


$\psi_{s \rightarrow \alpha}$  = transformation from  $(v_x, v_y, v_z)$  to  $(a, e, i)$ ,  $J_{s \rightarrow \alpha}$  = Jacobian of the transformation  $\psi_{s \rightarrow \alpha}$

➤ Frey S., “Evolution and hazard analysis of orbital fragmentation continua,” PhD thesis, Politecnico di Milano, 2020, Supervisors: Colombo C., Lemmens S., Krag., H.

# The model – Starling V2.0

## Block diagram



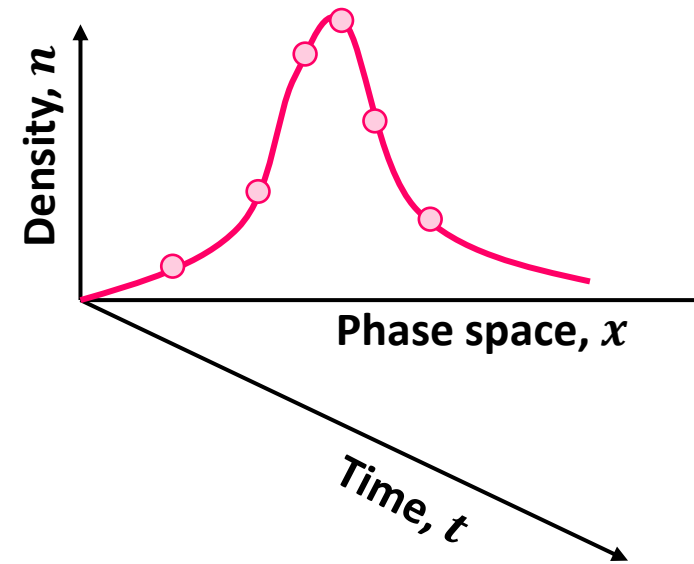
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# Cloud propagation

## Sampling, Method Of Characteristics, and interpolation

### 1. Cloud sampling:

- The samples are randomly extracted from the initial distribution
- The samples are in the subset  $\mathcal{x} := \left(a, e, i, \frac{A}{M}\right)$



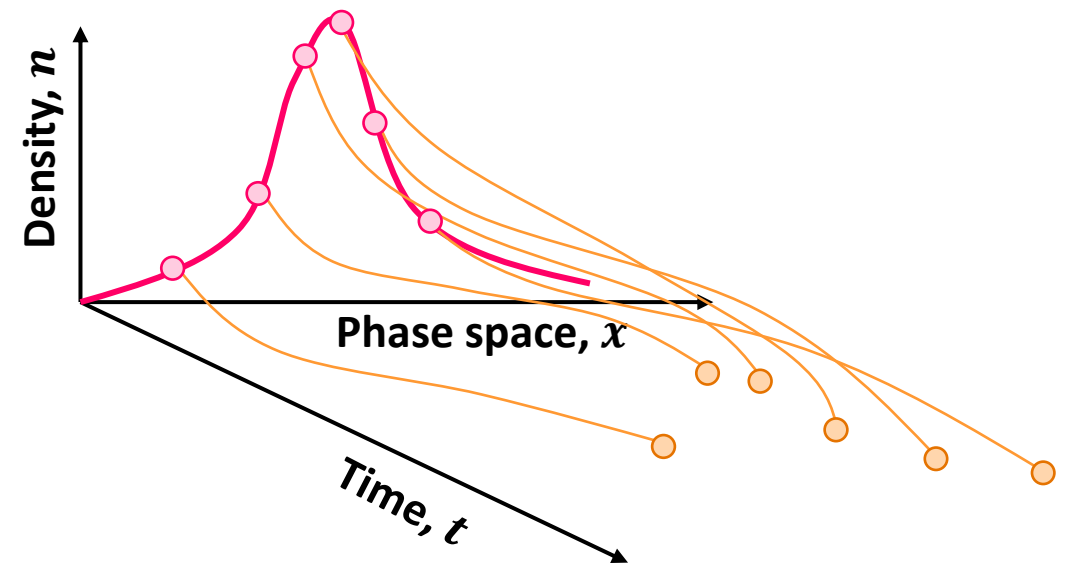
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### 2. Characteristics' propagation:

$$\text{MOC: } \begin{cases} \frac{dn}{dt} = -n \nabla \cdot \mathbf{F} \\ \frac{dy}{dt} = \mathbf{F} \end{cases}, \quad \mathbf{y} := \left(a, e, i, \Omega, \omega, f, \frac{A}{M}\right)$$



## Sampling, Method Of Characteristics, and interpolation

### 1. Cloud sampling:

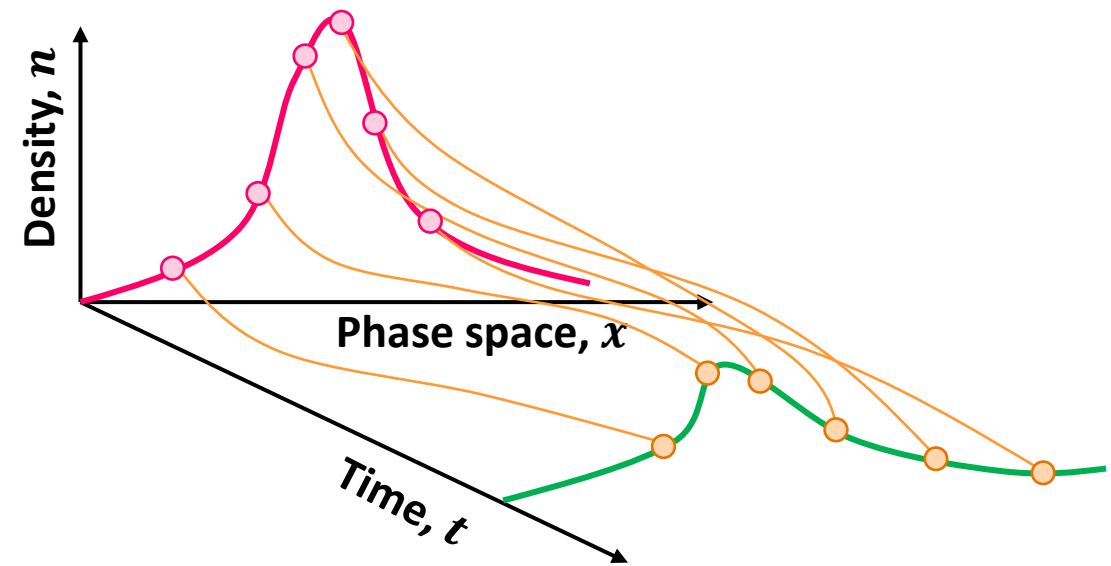
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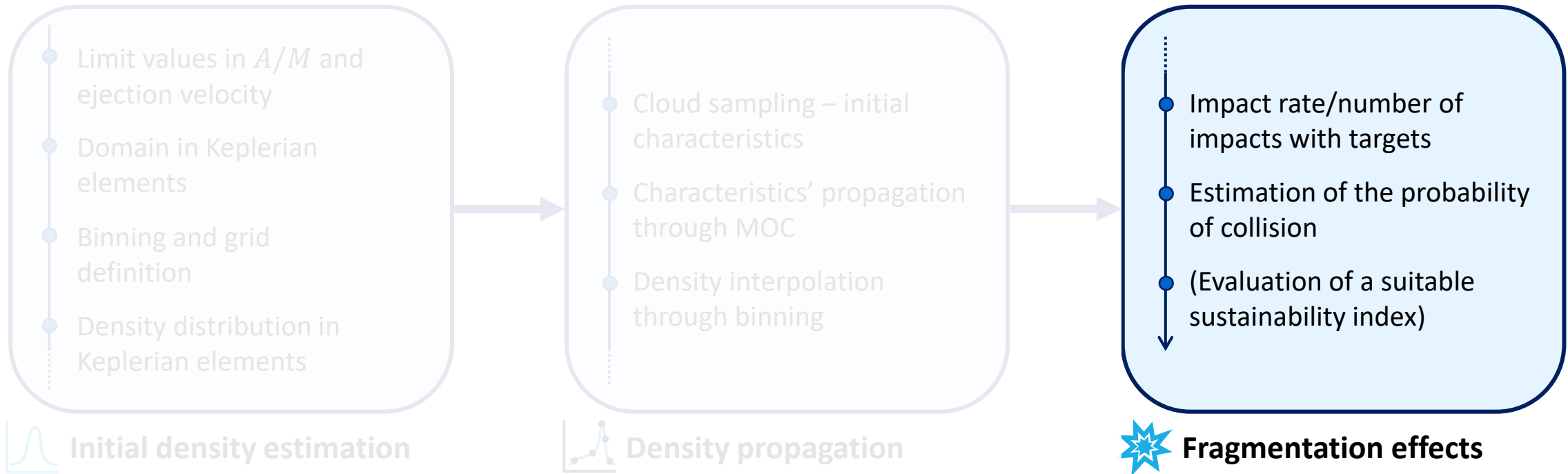
### 3. Density interpolation:

- Binning in (up to) 6D phase space  $\left(a, e, i, \Omega, \omega, \frac{A}{M}\right)$
- Nearest-neighbour – like interpolation



# The model – Starling V2.0

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# Fragmentation effects

## Estimation of the impact rate

**Impact rate:** flux of fragments over the target area assuming

- Fixed target position  $\mathbf{r}_t \rightarrow$  Computed  $N$  times for  $N$  target's mean anomaly  $M \in [0, 2\pi)$
- Area of the target  $A_c \gg$  Area of the fragments  $A_f$

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It can be computed from the **phase space density**:

1. In **Cartesian** coordinates

$$\dot{\eta}(\mathbf{r}_t, \mathbf{v}_t) = A_c \iiint_{\mathbb{R}^3} n_s(\mathbf{r}_t, \mathbf{v}) \|\mathbf{v} - \mathbf{v}_t\| d\mathbf{v}$$

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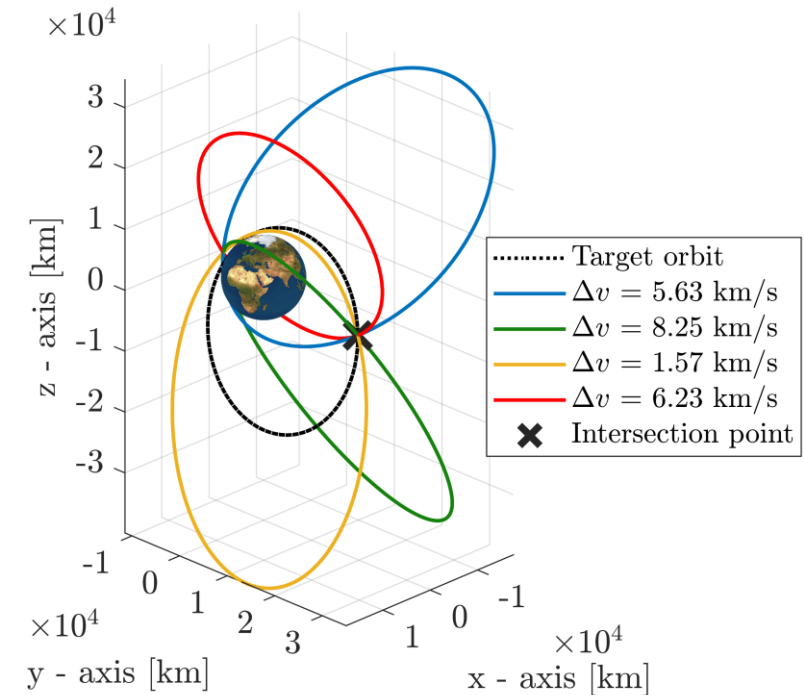
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2. In **Keplerian** elements

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$\boldsymbol{\alpha} = (a, e, i), \boldsymbol{\beta} = (\Omega, \omega, f), J_{\mathbf{r} \rightarrow \boldsymbol{\beta}} =$  Jacobian of the transformation from  $\mathbf{r}$  to  $\boldsymbol{\beta}$

4 possible intersections, fixed  $\mathbf{r}_t$  and  $(a, e, i)$



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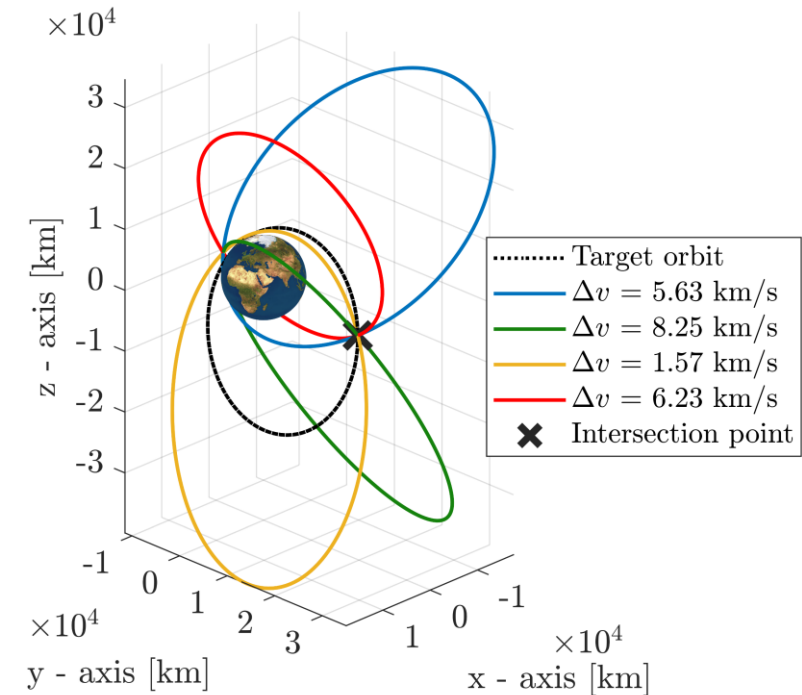
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4 possible intersections, fixed  $\mathbf{r}_t$  and  $(a, e, i)$



**Integrated semi-analytical** in:

- Semi-major axis, eccentricity, inclination  $(a, e, i)$
- Perigee radius, apogee radius, inclination  $(r_p, r_a, i)$

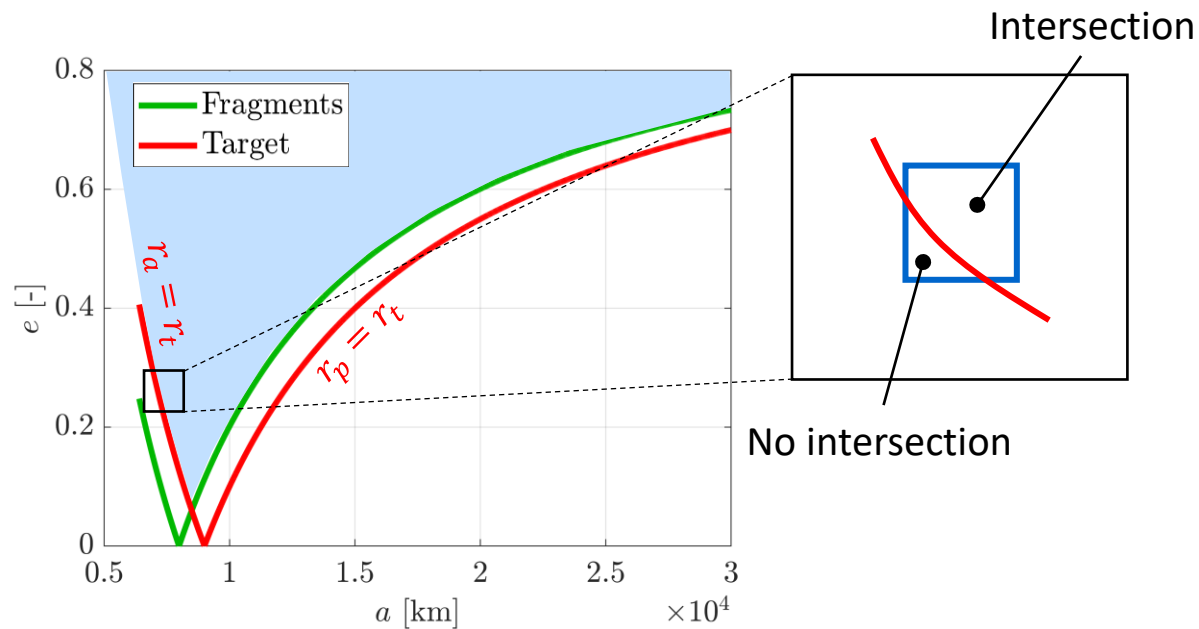
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# Fragmentation effects

## Impact rate with binning approach

### Integration in $a, e, i$

- Elliptic integrals from the integration in  $i$
- Easy solution of the integration in  $a, e$
- Analytical solution not available in the entire domain

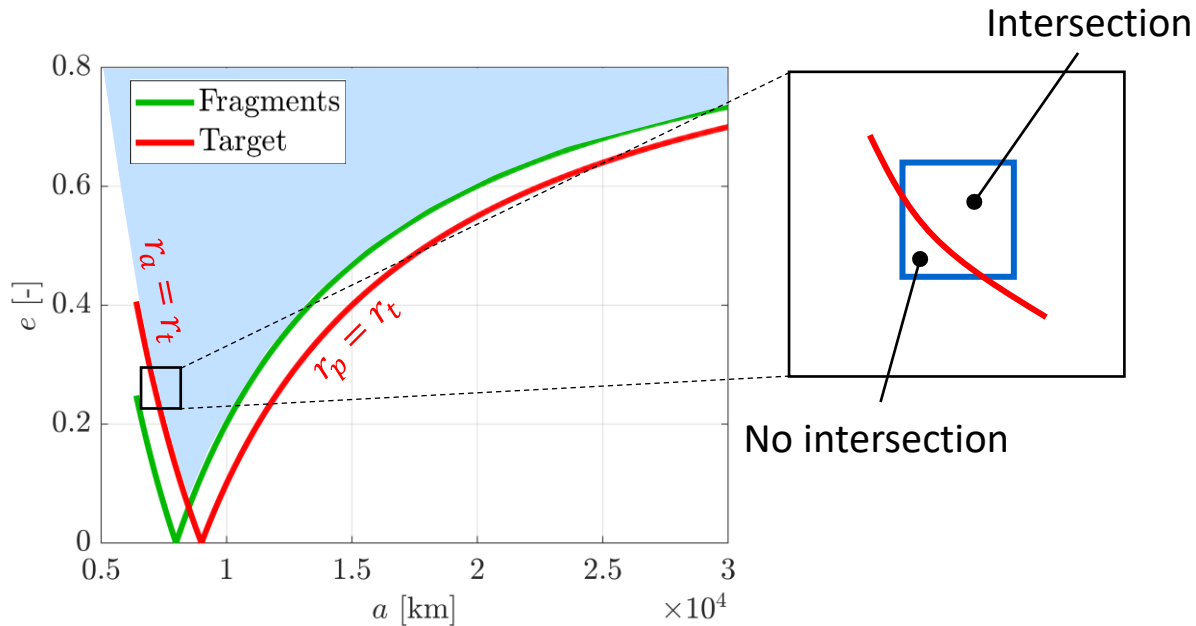


Curves  $r_a = r_t$  and  $r_p = r_t$  in the  $(a, e)$  domain

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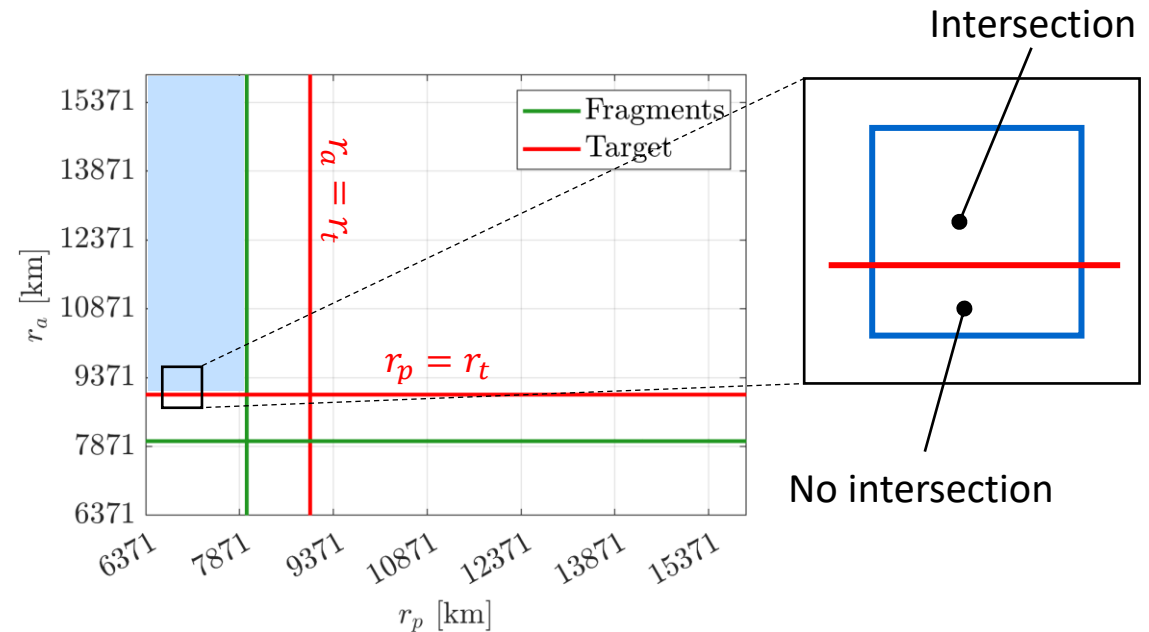
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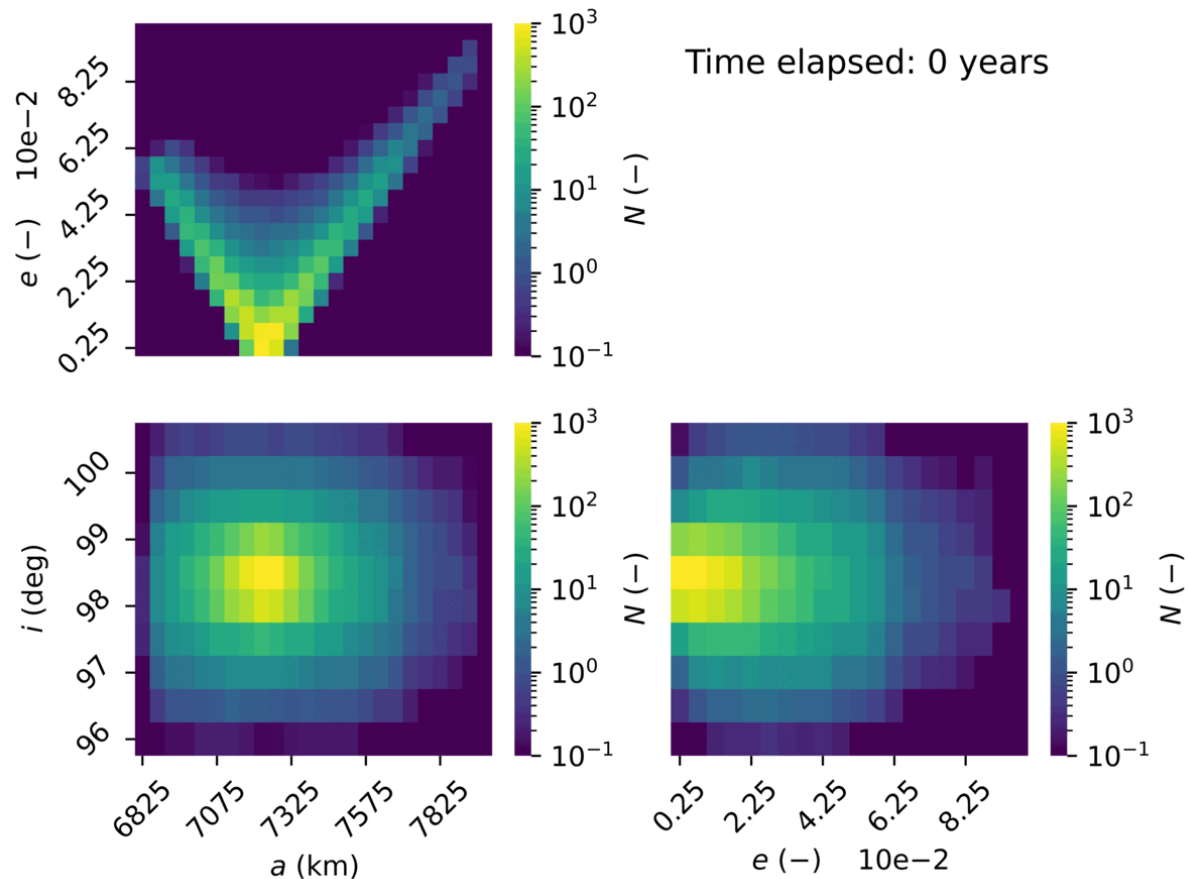
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Curves  $r_a = r_t$  and  $r_p = r_t$  in the  $(r_p, r_a)$  domain

## Fengyun-1C fragmentation under $J_2$ and drag



*Density distribution over time under  $J_2$  and drag perturbations*

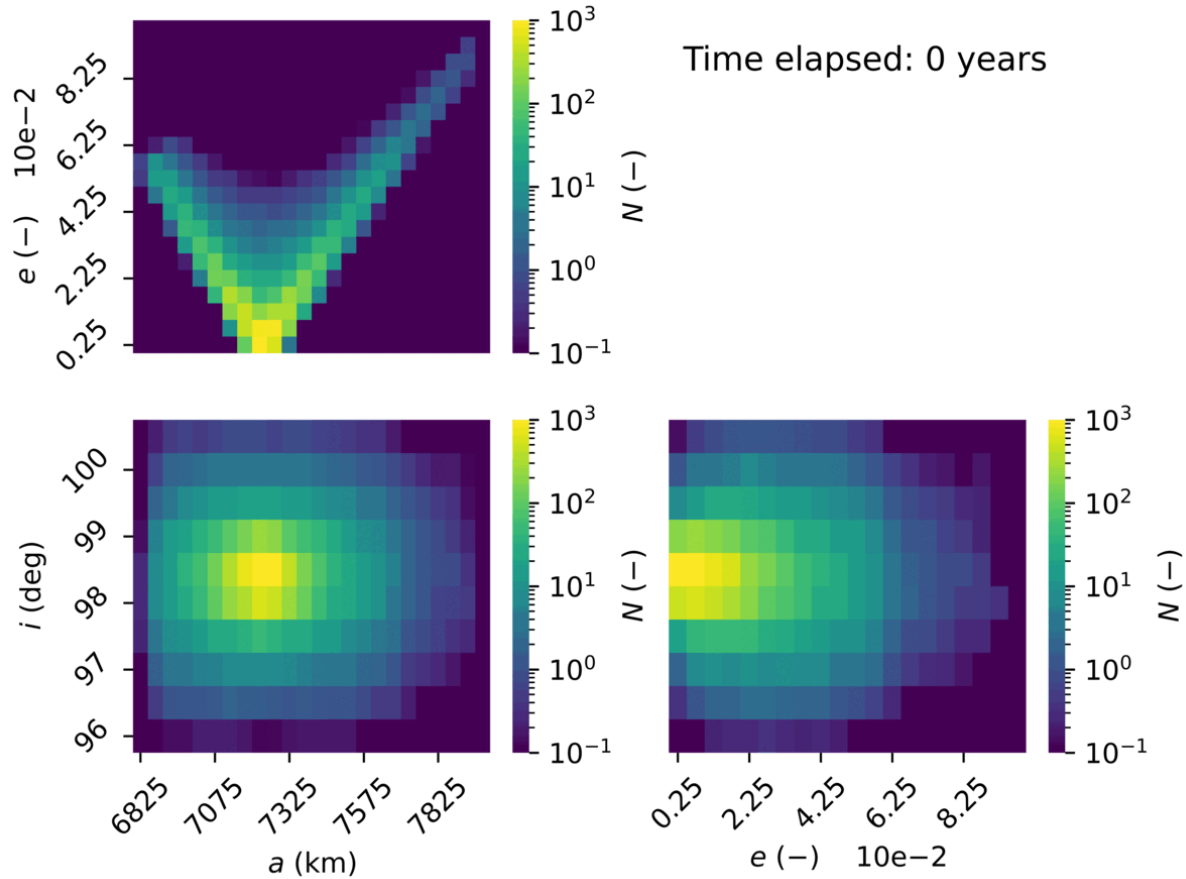
**Parent orbit:**  $a = 7231$  km,  $e = 0.001$ ,  $i = 98.6$  deg,  $\Omega = 106.1$  deg,  $\omega = 262.0$  deg,  $f = 133.5$  deg



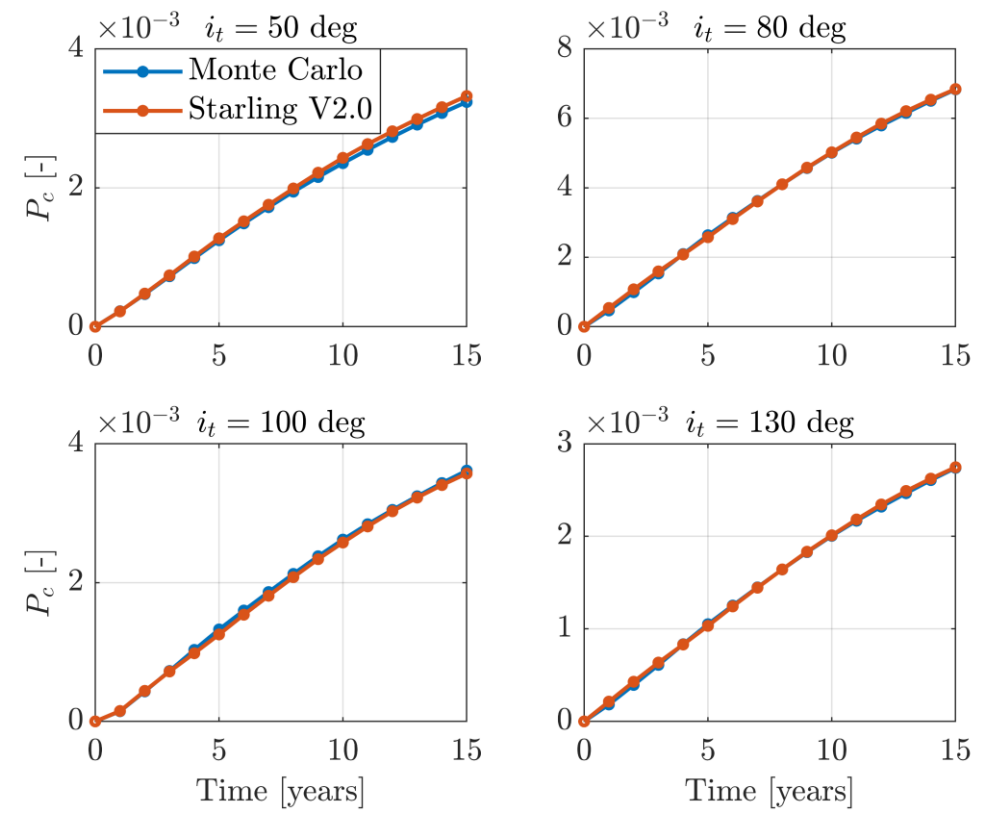
# Applications

## Fengyun-1C fragmentation under $J_2$ and drag

$$P_c = 1 - e^{-\int \dot{\eta} dt}$$



Density distribution over time under  $J_2$  and drag perturbations

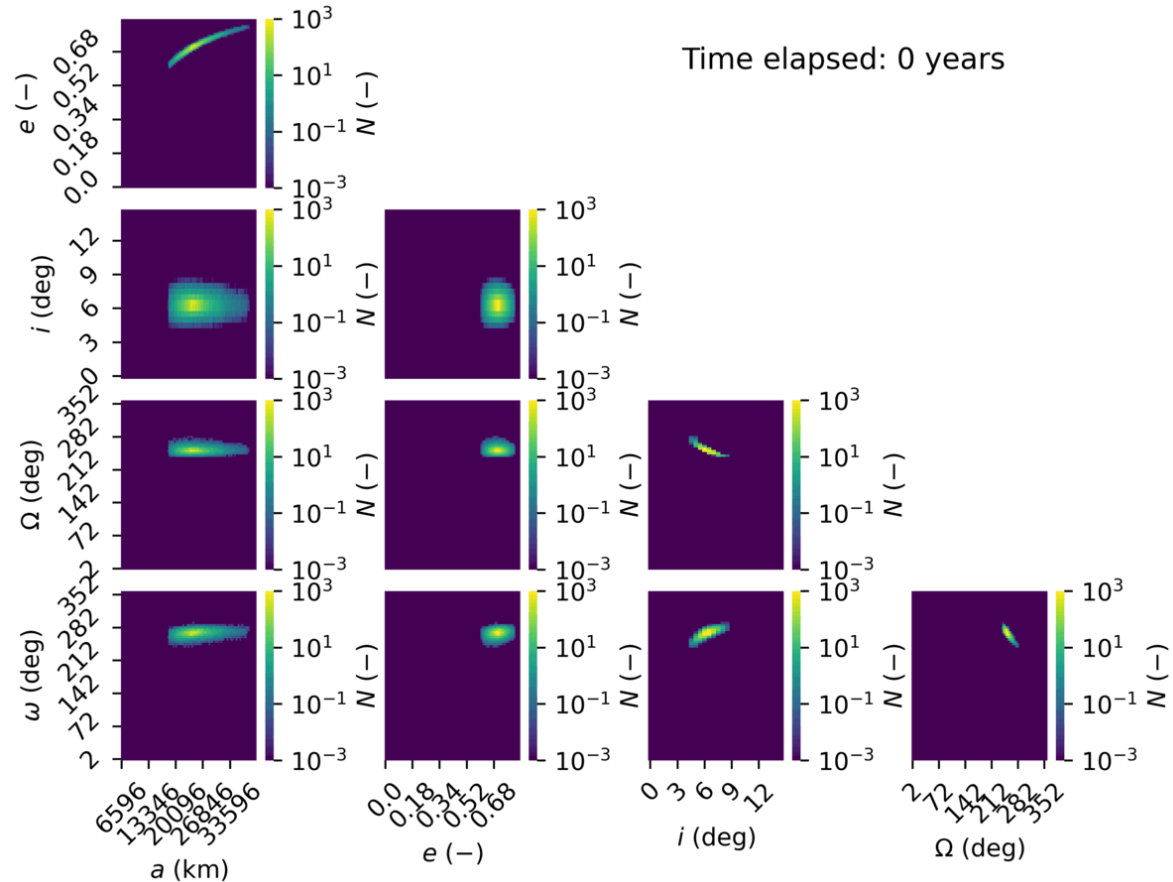


Collision probability over time for different values of target inclination – Accuracy analysis against Monte Carlo

**Target orbit:**  $a = 7171$  km,  $e = 0.0$ ,  $i = 50/80/100/130$  deg,  $\Omega = 0.0$  deg,  $\omega = 0.0$  deg

# Application

Ariane 5 explosion in GTO under  $J_2$ , drag, SRP, Moon + Sun

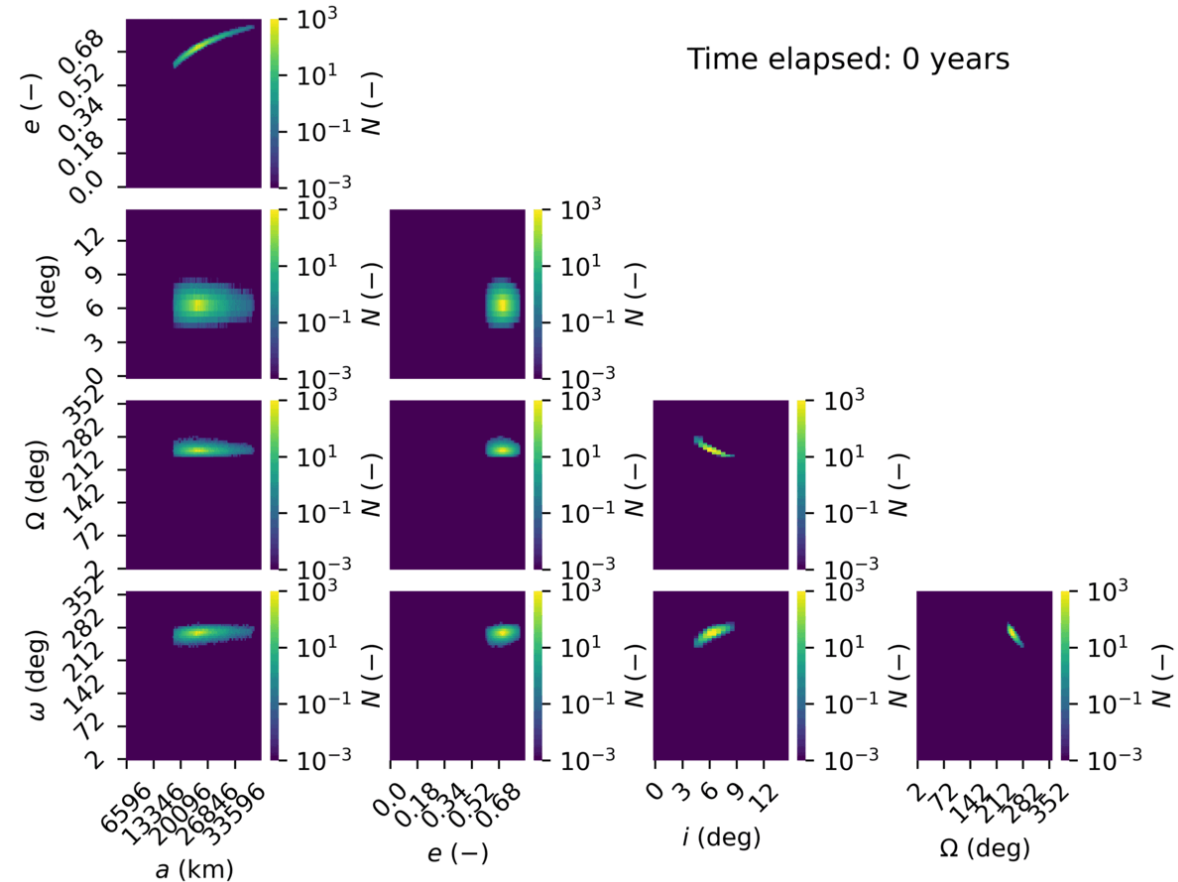


Density distribution over time under  $J_2$ , Drag, SRP, Moon and Sun perturbations

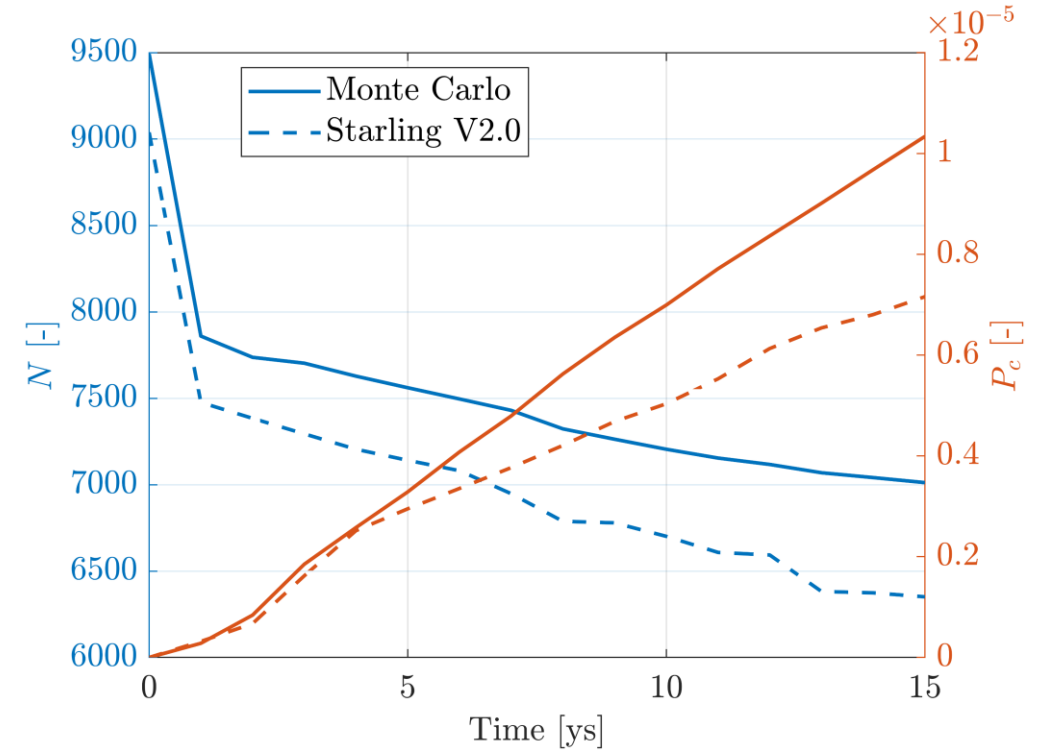
**Parent orbit:**  $a = 24443$  km,  $e = 0.709$ ,  $i = 6.5$  deg,  $\Omega = 253.2$  deg,  $\omega = 271.8$  deg,  $f = 43.5$  deg

# Application

## Ariane 5 explosion in GTO under $J_2$ , drag, SRP, Moon + Sun



Number of fragments and collision probability with Syracuse 4A over time – Accuracy analysis against Monte Carlo



Density distribution over time under  $J_2$ , Drag, SRP, Moon and Sun perturbations

**Target orbit (Syracuse 4A):**  $a = 24131$  km,  $e = 0.725$ ,  $i = 6.0$  deg,  $\Omega = 264.8$  deg,  $\omega = 167.3$  deg

## Conclusions

- The **probabilistic definition of the phase space domain** allows to accurately target the phase space reachable by the ejected fragments
- The **automatised definition of the grid** in Keplerian elements reduces the user's responsibilities, granting accuracy independently of the fragmentation type
- The **semi-analytical computation of the impact rate** dramatically improved the accuracy and efficiency in the estimation of the fragmentation effects
- The **model**, being **agnostic to the force model**, proved validity under complex dynamical regimes

## Future works

- **Extensive validation** of the model against Monte Carlo simulations
- Application of the model for estimating **sustainability indices in any orbital region**



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# Density-based debris cloud propagation and collision risk estimation through a binning approach

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