

# Modelling the Milky Way in the Gaia era

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# **MW dynamics main questions**

- Decipher the structure of the Galaxy, and of each of its components (stellar pops, gas), including its dark matter distribution, in configuration space and phase-space (total mass? core vs. cusp?, ...)
- Understand the various steps in the Galaxy formation process, understand internal secular processes (e.g., effect of spiral arms, bar) and external environmental ones (e.g., interactions with satellites)
- What are the exact roles of spirals (+ today's number of arms, pitch angle, pattern speed?) and the bar (length, pattern speed?) in the secular evolution (radial migration), how did they evolve? ...

## **MW dynamical models**



## **Jeans theorem**

If integrable system:  $df_0/dt = 0 \Leftrightarrow f_0(I_1,I_2,I_3)$ 

- Natural phase-space coordinates for regular orbits in (quasi)-integrable systems: actions J and angles θ
   = phase-space canonical coordinates such that H=H(J)
   => f<sub>0</sub> (J) with J adiabatic invariants
- A triplet of actions defines a regular orbit, angles tell us where the star is along that orbit
- Phase-space is filled by orbital tori

=> use AGAMA (Vasiliev 2019)

# ACTIONFINDER

- Deep learning algorithm (Ibata et al. 2021) designed to transform a sample of phase-space measurements along orbits in an (unknown) static potential into action and angle coordinates, using the fact that stars along a same orbit have the same actions
- Start from "toy" potential (isochrone) with known actions and search for canonical transform:

$$G = G(\theta, \mathbf{J}') \qquad \longrightarrow \qquad \mathbf{J} = \mathbf{J}' + \frac{\partial G}{\partial \theta} \\ \theta' = \theta + \frac{\partial G}{\partial \mathbf{J}'}.$$

The neural network then **searches for G**, minimizing a loss function (basically the spread in actions along each orbit)

# ACTIONFINDER

With 8 points per orbit and 128 orbits (hence 1024 phase-space points), recovers the actions and angles from the Torus machinery of Binney & McMillan with 0.6% precision

But most importantly: recovers the (unknown) Hamiltonian and therefore Galactic potential

# Stellar streams nearly trace orbits

#### Streams (Ibata et al., Gaia EDR3):

32 streams in Gaia DR2, 7 new ones without an obvious progenitor in EDR3

Find single stellar pops. and integrate streams orbits in a tube by exploring all distances and radial vel. until sream candidate found (STREAMFINDER)



**15 with a globular cluster progenitor** (good distance, SSP template, and GC on the actual orbit)

# **Modelling the MW disc**

Adjust comination of parametric DFs:

$$f_{0}(J_{R}, J_{\phi}, J_{z}) = \frac{\Omega(R_{g}(J_{\phi}))}{(2\pi)^{3/2} 2\kappa(R_{g}(J_{\phi}))} \frac{\tilde{\Sigma}(R_{g}(J_{\phi}))}{\tilde{\sigma}_{r}^{2}(R_{g}(J_{\phi}))\tilde{\sigma}_{z}^{2}(R_{g}(J_{\phi}))z_{0}} \times e^{-\frac{J_{R}\kappa}{\tilde{\sigma}_{r}^{2}} - \frac{J_{z}\nu}{\tilde{\sigma}_{z}^{2}}}$$
radial distribution in  $R_{g}(J_{\phi})$ 
velocity ellipsoid together with the velocity disp.dependence in previous factor

Even better: non-parametric DF: adjust with neural nets

**But not so « simple »**: the disc is perturbed by both internal non-axisymmetries and external perturbations!

## **Modelling the MW disc**



Local velocity space

Galactocentric radial velocity map

# Expressing the bar potential in actions and angles



Al Kazwini et al. (2021)

# **Linearized CBE**



Integrate from zero amplitude bar to plateau of constant amplitude:

$$f_{1}(\boldsymbol{J},\boldsymbol{\theta},t) = \operatorname{Re}\left\{\sum_{j,l=-n}^{n} f_{jml} \operatorname{e}^{\operatorname{i}[j\theta_{R}+m(\theta_{\varphi}-\Omega_{p}t)+l\theta_{z}]}\right\}$$
$$f_{jml} = \phi_{jml} \times \frac{j\frac{\partial f_{0}}{\partial J_{R}} + m\frac{\partial f_{0}}{\partial J_{\varphi}} + l\frac{\partial f_{0}}{\partial J_{z}}}{j\omega_{R} + m(\omega_{\varphi}-\Omega_{p}) + l\omega_{z}}$$
Monari et al. (2016)

E.g., imposing  $f_1 < f_0$  for resonance (1,2,0) of a fast bar:



Displacement of the resonance with z (corotation moves faster) + depends on the potential => new constraints with Gaia DR3

# **Treating resonances**

Consider in-plane resonances (l,m): use **Arnold averaging principle** => change to slow angles that almost don't evolve at resonance and **average over fast angles :** 

$$\begin{aligned} \theta_{\rm s} &= l \theta_R + m \left( \theta_{\phi} - \Omega_{\rm b} t \right), & J_{\phi} = m J_{\rm s}, \\ \theta_{\rm f} &= \theta_R, & J_R = l J_{\rm s} + J_{\rm f}. \end{aligned}$$

$$\overline{H} = H_0(J_{\mathbf{f}}, J_{\mathbf{s}}) - m\Omega_{\mathbf{b}}J_{\mathbf{s}} + \operatorname{Re}\left\{ \boldsymbol{\phi}_{lm}(J_{\mathbf{f}}, J_{\mathbf{s}}) \mathrm{e}^{\mathrm{i}\boldsymbol{\theta}_{\mathbf{s}}} \right\}$$

For each  $J_f$ , define  $J_{sres}$  such that  $\omega_s=0$  and expand around  $J_{sres}$ 

⇒ Hamiltonian of a pendulum of angle  $\theta_s$ ⇒ New canonical transform to pendulum actions and angles  $(J_p, \theta_p)$ ⇒ Phase-mix the original DF over  $\theta_p$ 

#### **Treating resonances**



Monari et al. (2019)

 $V_{\odot} = 0$  km/s, declining RC allows to get a more realistic  $V_{\odot} = 8$  km/s

## **Ridges as a function of azimuth**

$$\begin{aligned} \theta_{\rm s} &= l \theta_R + m \left( \theta_{\phi} - \Omega_{\rm b} t \right), & J_{\phi} = m J_{\rm s}, \\ \theta_{\rm f} &= \theta_R, & J_R = l J_{\rm s} + J_{\rm f}. \end{aligned}$$

At the (l,m) = (1,2) OLR, the azimuthal angles of trapped orbits can vary fast while the angular momentum varies slowly.

But NOT at the (1,m)=(0,2) CR, where any large change in azimuthal angle is accompanied by a large change of angular momentum

=> The  $J_{\Phi}$  location of the CR varies faster in azimuth than the OLR

## **Ridges as a function of azimuth**



400 pc annulus around the Sun (StarHorse bayesian distance estimates) Monari et al. 2019

#### The disk is vertically perturbed too



 $\Rightarrow$  Can traditional Jeans modelling be applied? NO (Haines et al. 2019)  $\Rightarrow$  Can we neglect self-gravity of the disc? NO (Khoperskov et al. 2019)

Similar (but less intense) phase spirals survive > 1 Gyr after bar buckling

# The disk is vertically perturbed too

#### Taking self-gravity into account needs simultaneously solving CBE and Poisson

=> Use bi-orthogonal basis functions that solve Poisson (basis functions appropriate for thickened disks)

$$\psi^{\mathbf{s}}(\mathbf{x},t) = \sum_{p} a_{p}(t)\psi^{(p)}(\mathbf{x}); \ \psi^{\mathbf{e}}(\mathbf{x},t) = \sum_{p} b_{p}(t)\psi^{(p)}(\mathbf{x})$$
 The Sgr dwarf potential  

$$a_{p}(t) = -\int d\mathbf{x} \int d\mathbf{v} \ f_{l}(\mathbf{x},\mathbf{v},t) \ \psi^{(p)*}(\mathbf{x}) \qquad \text{[equivalent to integrating over J and } \boldsymbol{\theta}]$$
insert solution of linearized CBE and develop  
the perturbing potential ( $\Psi$ s+ $\Psi$ e) on the basis  
functions (as a sum over q)  

$$\mathbf{a}(t) = \int_{0}^{t} d\tau \ \mathbf{M}(t-\tau) \left[\mathbf{a}(\tau) + \mathbf{b}(\tau)\right] \qquad \text{Work led by}$$
S. Rozier

$$\mathbf{M}_{pq}(t) = -\mathrm{i}\,(2\pi)^3 \,\sum_{\mathbf{n}} \int d\mathbf{J}\,\mathbf{n} \cdot \frac{\partial F_0}{\partial \mathbf{J}} \,\psi_{\mathbf{n}}^{(p)*}(\mathbf{J}) \,\psi_{\mathbf{n}}^{(q)}(\mathbf{J}) \,\mathrm{e}^{-\mathrm{i}\,\mathbf{n}\cdot\mathbf{\Omega}\,t}$$



# **Conclusion and next steps**

- Detected dozens of streams => probes of the Galactic potential making use of ACTIONFINDER (+ self-consistent phase-space modelling of DM and testing alternatives)
- Disc: 2D analytic formalism for resonances of bar and spirals
   ⇒ MW bar with CR at 6 kpc qualitatively reproduces a surprisingly large amount of features in local action-space and velocity-space
- Next step: combine the treatment at resonances with the linear response to combine the bar an spiral arms (when no resonance overlap), **fit** to data on larger scales (velocity field, ridges,...)
- Vertically perturbed disk => Jeans modelling inappropriate
- ⇒ We need to work on the appropriate analytic formalism (Matrix method, SEGAL ANR)

# **Data: what's next?**

Next year: Gaia DR3 will improve even more the observational situation (e.g., RVS data for 3.5x10<sup>7</sup> stars down to G~15)

Next year: WEAVE as spectroscopic counterpart to Gaia. High-res survey (R~20000) will allow chemical labelling to G~16 for ~1.2x10<sup>6</sup> stars

+ Low-res surveys (disk and HighLat) for  $\sim 2.75 \times 10^6$  stars (R~5000) deep in the disk and halo down to G~20