

# Towards an Automated Processing of Gaia Eclipsing Binaries

**Christos Siopis**

Institut d'Astronomie et d'Astrophysique  
Université Libre de Bruxelles  
Belgium

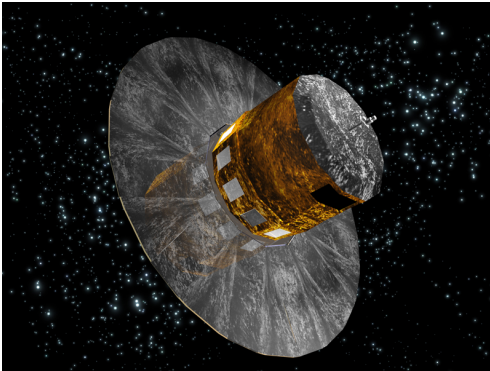
*10th Hel.A.S. Conference, Ioannina, Greece*



**gaia**

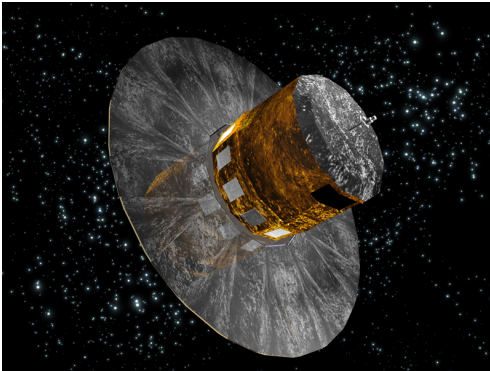


# The Gaia Mission



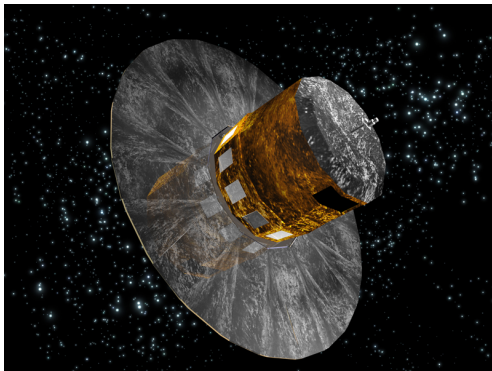
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- ▶ Goal: To provide a 6D map of the Galaxy
- ▶ Gaia is a scanning mission
  - ▶ no pointing
  - ▶ no change in schedule
  - ▶ 30-200 transits per object (~80 transits on average)
- ▶  $\sim 10^9$  stars to  $V = 20 - 22$
- ▶  $\sim 10^6 - 10^7$  galaxies
- ▶  $\sim 500,000$  quasars
- ▶  $\sim 3 \times 10^5$  solar system objects
- ▶  $\sim 10^4$  exoplanets

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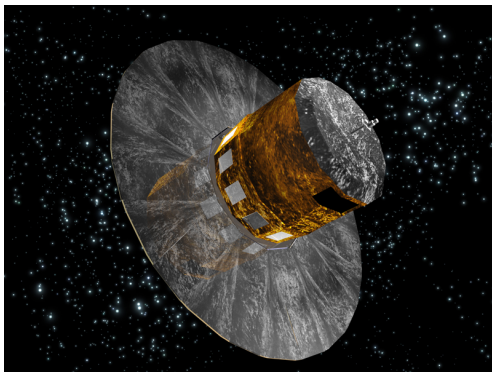
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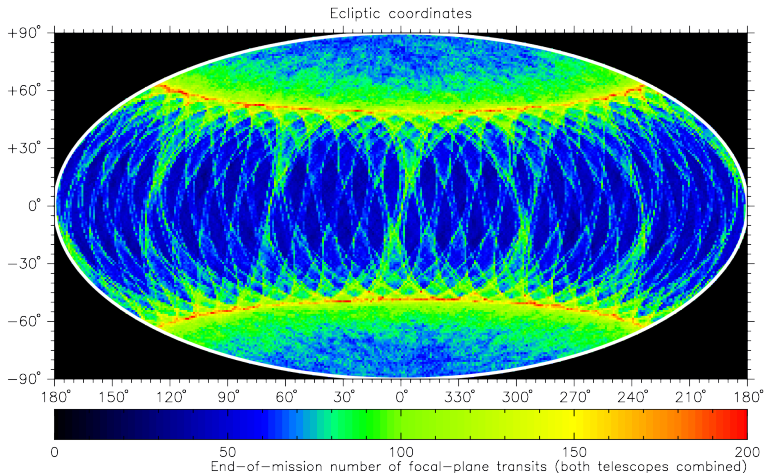
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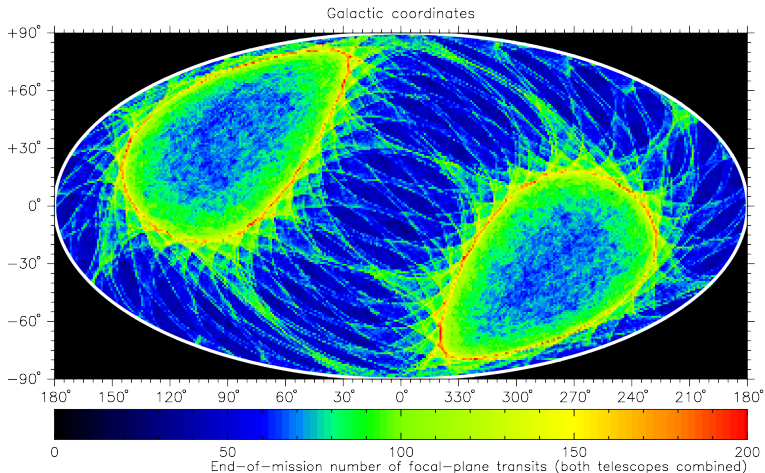


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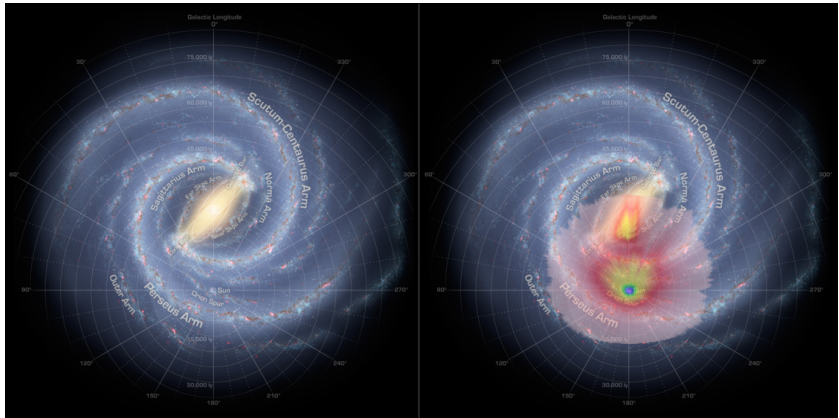
# Gaia sky coverage – Ecliptic coordinates



## Gaia sky coverage – Galactic coordinates

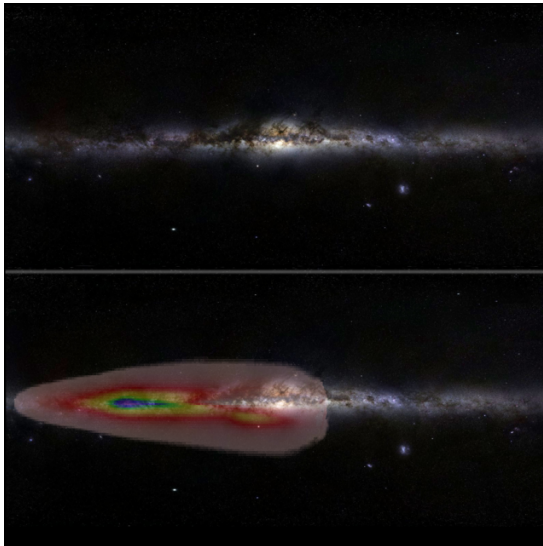


# Gaia Catalog Coverage: View from Galactic Pole

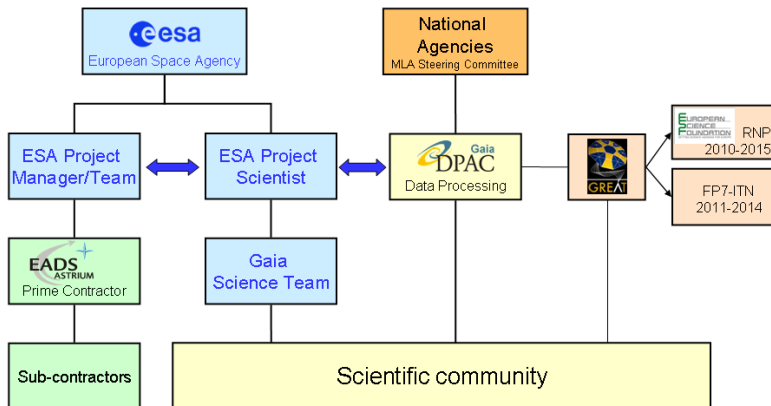




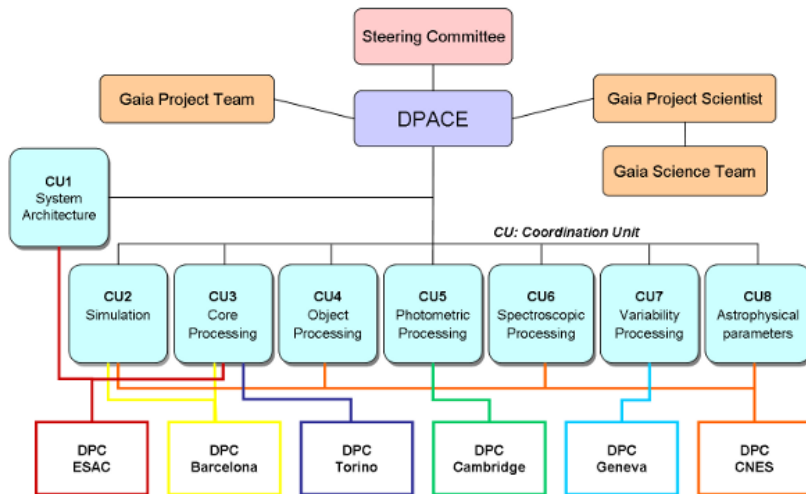
# Gaia Catalog Coverage: View from Galactic Equator



# The Gaia Organization Diagram



# DPAC: Data Processing & Analysis Consortium



*DPAC: Data Processing Centre*

# GREAT: Gaia Research for European Astronomy Training ( [www.ast.cam.ac.uk/ioa/GREAT/](http://www.ast.cam.ac.uk/ioa/GREAT/) )

- ▶ GREAT ITN (Initial Training Network) programme
- ▶ GREAT ESF (European Science Foundation) programme
  - ▶ A pan-European research infrastructure to facilitate the fullest exploitation of the Gaia Catalog
  - ▶ Funding for workshops, conferences, training events, exchange visits, ...
  - ▶ Some key topic areas:
    - Orbital structure, and evolution of the Milky Way
    - Galactic dynamics & archaeology
    - Stellar astrophysics
    - Binary stars
    - Planets & exoplanets
    - The Solar System

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  - ▶ Brandon Tingley (now at IAC)
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  - ▶ Need for automated processing
  - ▶ DPAC enforces deadlines, programming guidelines, ...
    - ▶ Software must be implemented in Java!
    - ▶ Performance requirements
  - ▶ 5 (6?)-year baseline
    - ▶ Constrains EB periods
    - ▶ Slightly simplifies modeling
  - ▶ Important points of light curve not necessarily sampled
    - ▶ A consequence of the Gaia scanning law
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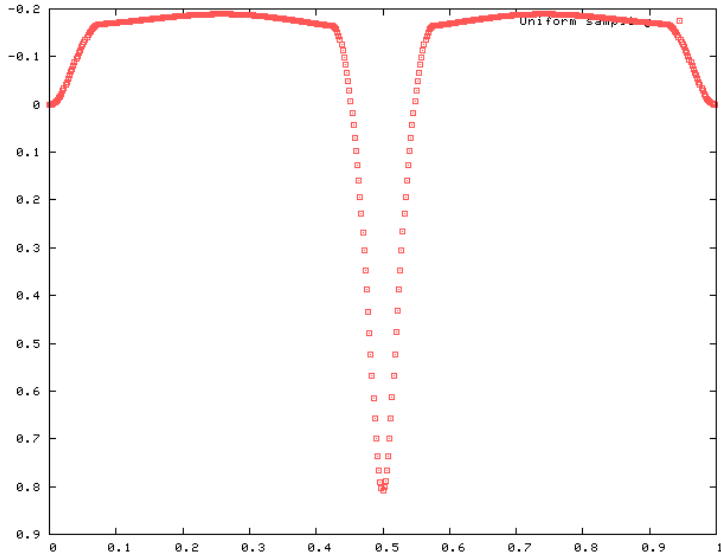
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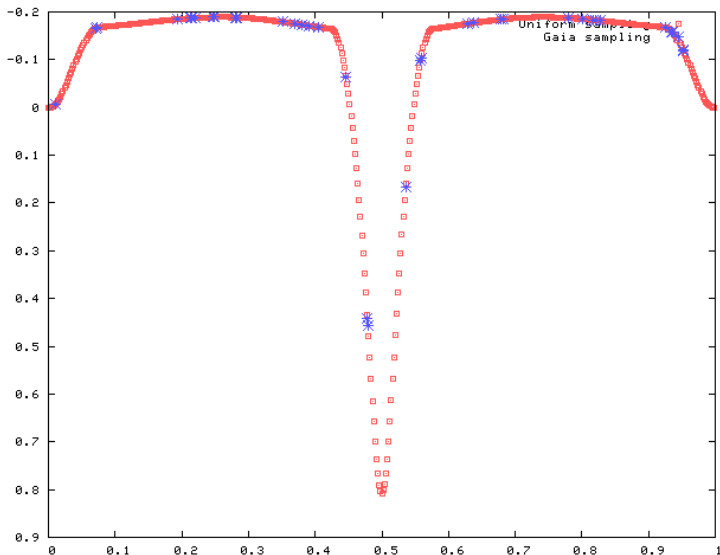
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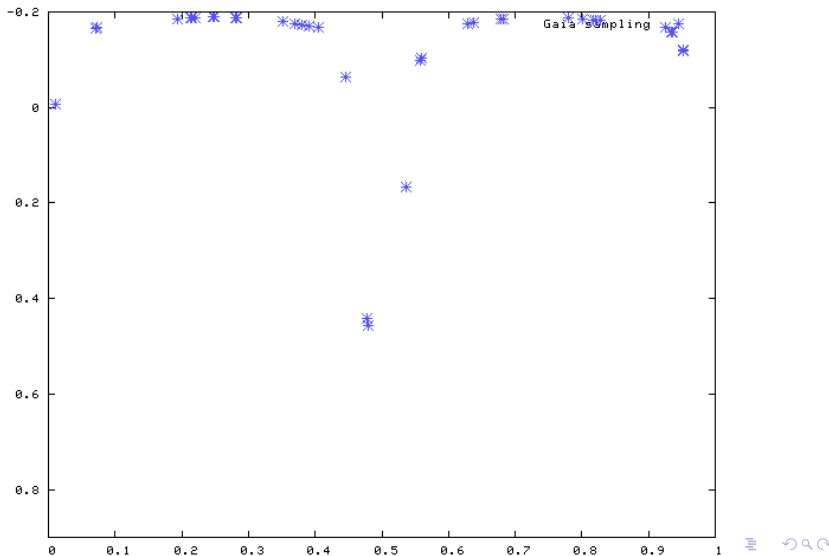


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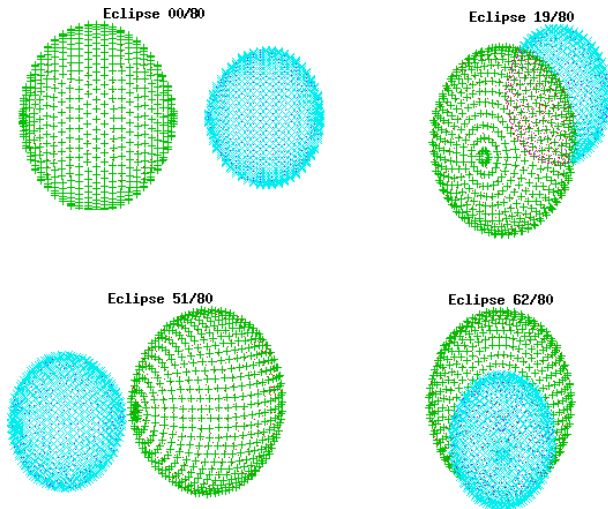
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- ▶ EB Model Generator: Given a set of epochs  $\{t_i\}$  and physical parameters  $\mathbf{p}$ , generate EB physical model  $\mathcal{M}(t_i; \mathbf{p})$ 
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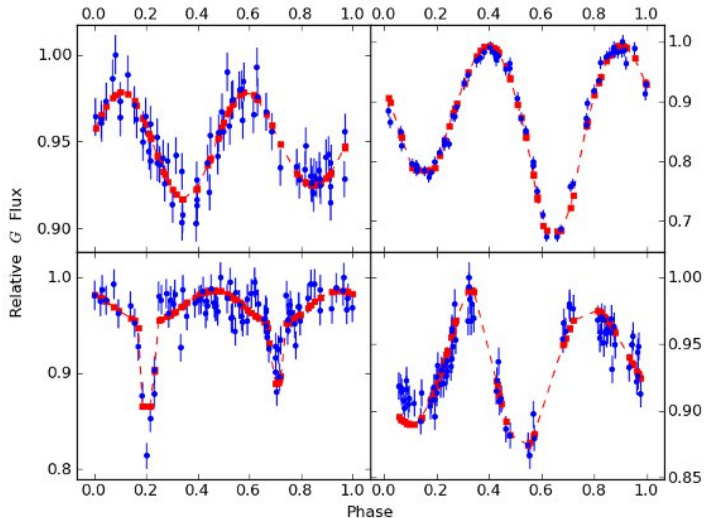
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# Remaining Work

- ▶ Detailed validation against, *e.g.*, Wilson-Devinney code
- ▶ Fine-tuning of the fitting procedure
- ▶ Extensive testing using EB light-curve data sets from the literature
- ▶ Implementation of error estimation
- ▶ Provide useful output to EB community (GAP/CU9)
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