



# Synergies between Gaia, ground observations & ML

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**European Space Agency** 

## Before we begin...

#### Who am I?

Gaia Archive Support Scientist(s):

- 50% Alcione Mora
- 50% Héctor Cánovas (since January 1<sup>st</sup>)

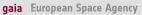


#### What do I want from you?

Suggestions and feedback for the Gaia Archive (> hcanovas@sciops.esa.int)









## Case study: ProtoPlanetary Discs









#### What is a Protoplanetary Disc?

#### **How** can we study them (Gaia + Ground. Obs)

#### **How** can we find them (Gaia + ML)

## Closing the loop

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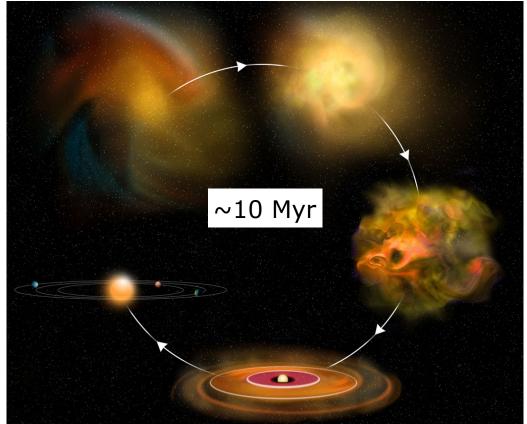
# What is a Protoplanetary Disc?

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### What is a PPdisc (I)?





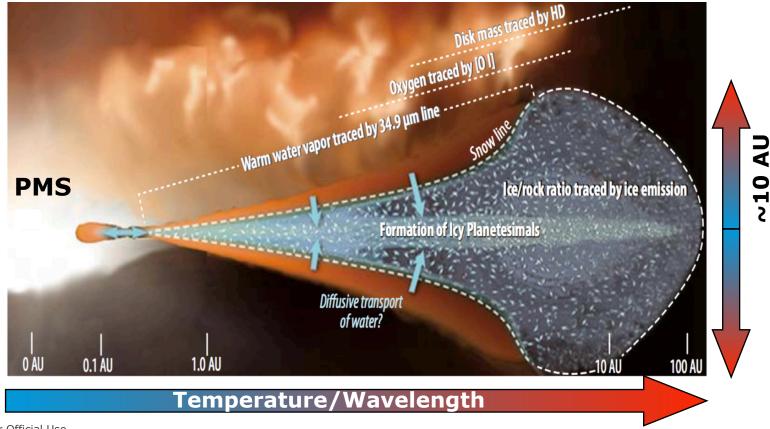
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#### What is a PPdisc (II)?





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# **How** can we study them?

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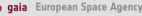
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#### **PPDiscs are made of Gas (99%) & Dust (1%)**

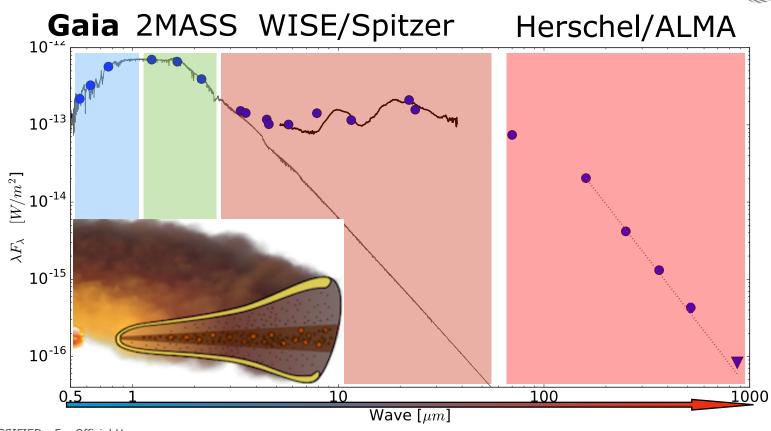
- Photometry <u>across entire spectrum</u>
- Spectra <u>across the entire spectrum</u>
- Direct Images (optical, NIR, Sub-MM, radio)

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How can we study them (I)?



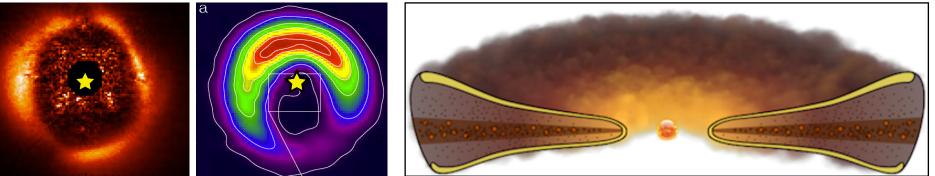


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## How can we study them (II)?



#### NIR (NaCo/VLT) Sub-mm (ALMA)



$$M(\text{gas} + \text{dust}) = \frac{F_{\nu}d^2}{\kappa_{\nu}B_{\nu}(T)}^{\text{Gaia}}$$

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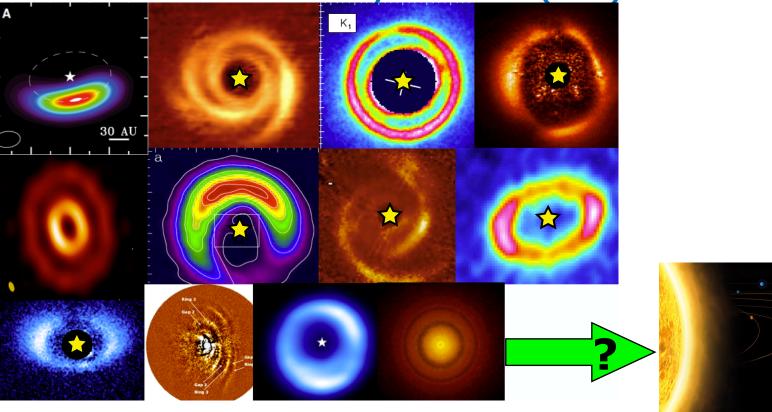
Canovas+2013, Casassus+2013<sup>11</sup>

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#### How can we study them (III)?





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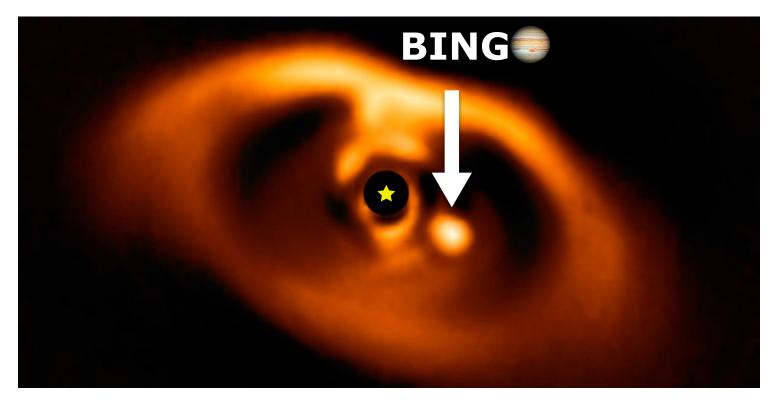
Canovas+2013, 2016a,b, Casassus+2013, van der Plas+2016...

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## How can we study them (III)?

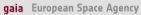




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Haffert+2019, Keppler+, Benisty+2018







# **How** can we find them? Or

# Can We find more? YES, GAIA CAN

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# How can we find them (I)?

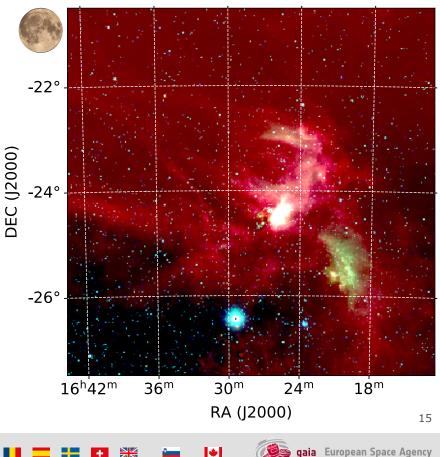


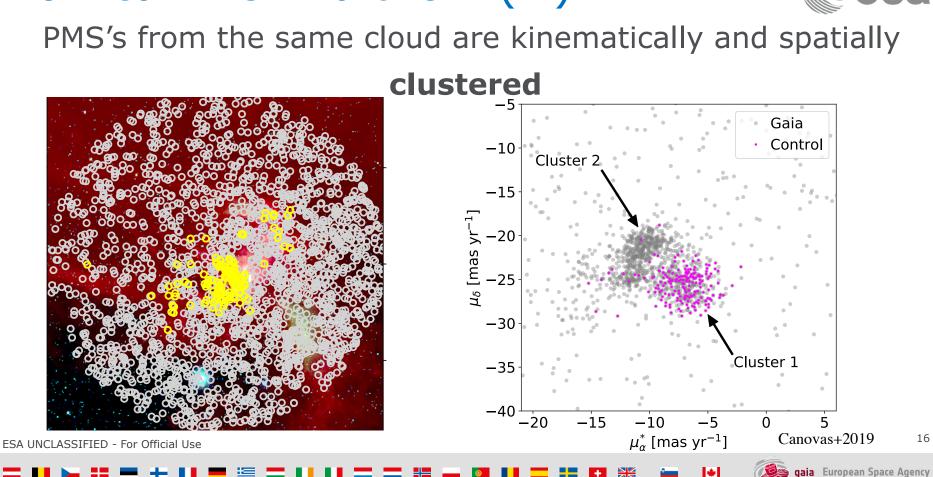
traditionally detected via:

- X-rays
- Optical Spectroscopy
- IR Emission



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## How can we find them (II)?



## How can we find them (ML I)?



- Supervised machine learning (e.g., Neural Networks/ 0 Random Forest) >> Recognise complex patterns (e.g., human faces)
- **Unsupervised** machine learning (e.g., Clustering 0 Algorithms/ K-means) >> Data Mining/Cluster detection / Outliers detection

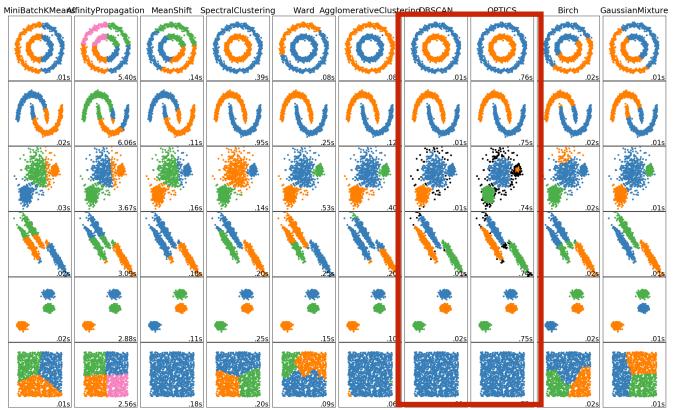
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See also e.g. Cantat-Gaudin 2018, Vioque et al. (submitted), Torres et al. 2019 17



## How can we find them (ML II)?



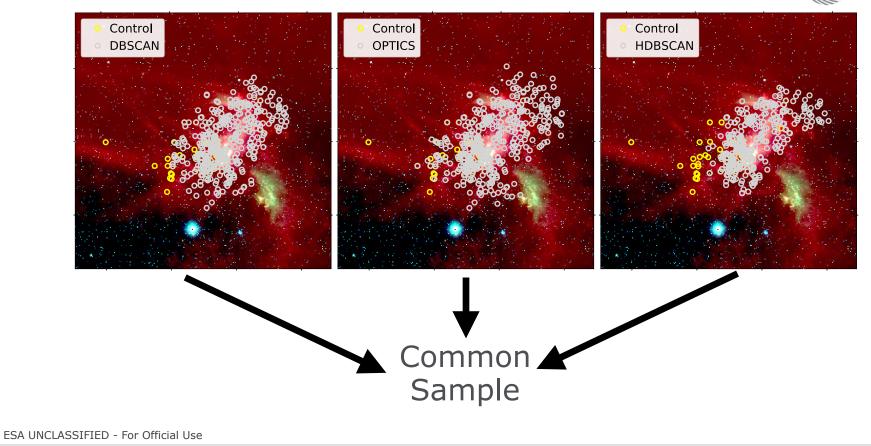


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SciKit Learn: https://scikit-learn.org/stable

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### How can we find them (ML III)?





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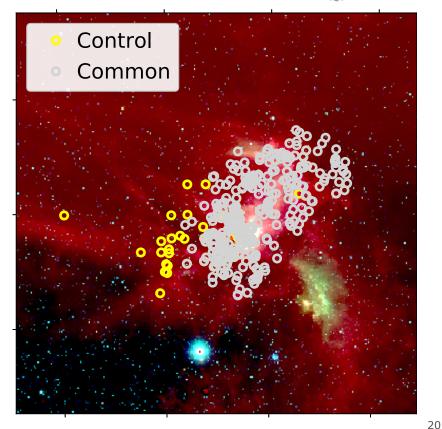
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# How can we find them (ML IV)?

- The common sample:
- 391 sources:
  - 148 > Control sample (188)
  - 243 > potential members
    - 166 > **new ones**

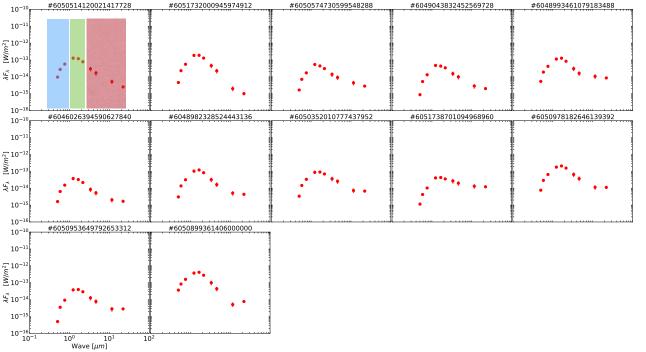




# Closing the loop (I)

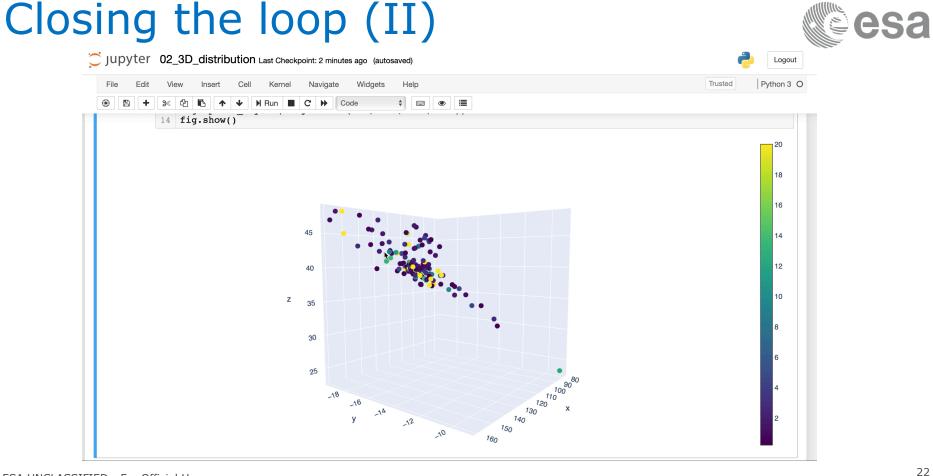


#### Gaia + 2MASS + WISE: 12 new discs (!!!)



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## ... obvious future steps...



 Obtain optical spectra from new candidates to characterise them

- Observe with ALMA (sub-mm) and/or VLT's (NIR) the new discs
- Repeat this exercise with other SFR's...









#### Thanks...

And do not forget: suggestions for the Archive are more than welcome!

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