Image credit: NASA/JPL-Caltech

# CLAXSON: a citizen science experiment to make the most of XMM-Newton archives

Hugo TRANIN, Postdoc, ICCUB, University of Barcelona

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XMM-Newton survey legacy for Athena and beyond

26-29 Feb 2024 Toulouse (France)

# Outline

- 1) Why
- 2) How
- 3) Results



# 1) Why use citizen science?



# Remember yesterday...

- CLAXBOI includes data preparation and value-adding
- Fully probabilistic classification
- Well-behaved on catalog-sized samples
- Both reliable and interpretable
- Samples of known XRB, CV, TDE... are still small
- ⇒ to enlarge traning samples and find anomalies, use citizen science.
- ⇒ CLAXSON platform <a href="https://xmm-ssc.irap.omp.eu/claxson/">https://xmm-ssc.irap.omp.eu/claxson/</a>



# Going further with citizen science

- Citizen science is increasingly used for classification tasks
  - → enlarging training samples
  - → making serendipitous discoveries
- Example: Galaxy Zoo (2007)
  - →1 million galaxies classified, ~50/galaxy
  - → >150 peer-reviewed publications so far

Green Peas discovered by volunteers

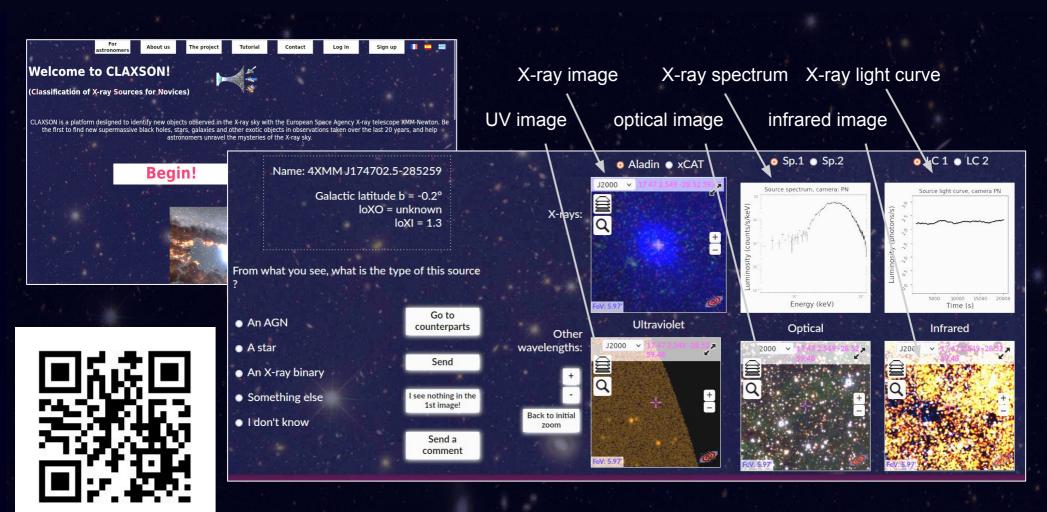


# 2) How to implement it?

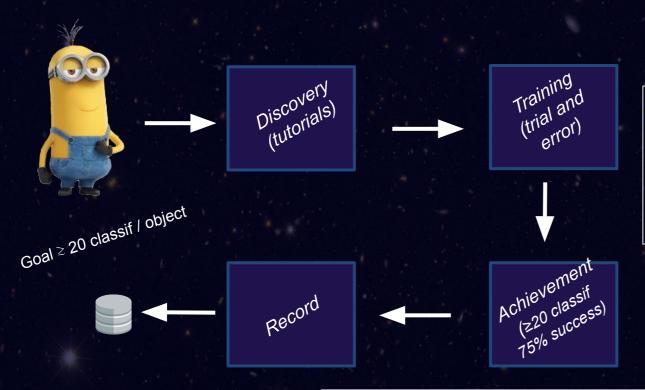


# Going further with citizen science

CLAXSON website (CLAssification of X-ray SOurces for Novices) https://xmm-ssc.irap.omp.eu/claxson



# "Wisdom of crowds"



✓ I'm training This source is an AGN. Clues that suggest that:

- it is brighter in the X-rays
- loXO is between -1 and 1
- · loXI is between -1 and 1
- its spectrum looks like a straight line sloping downwards

<u>Rank</u>	User	<u>Number of</u> <u>classifications</u>	Success rate
1	chrostek	21561	88.9
2	KrystianBykowski	21272	86
3	algol	15035	92.8
4	Marty_SAP	10000	95.3
5	SimonLeKlaxon	6063	91

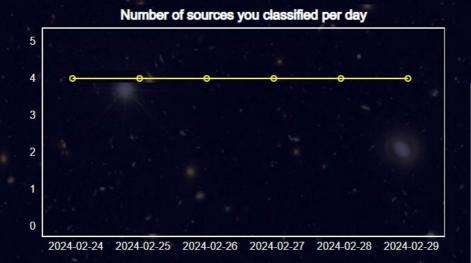
https://xmm-ssc.irap.omp.eu/claxson

## Gamification!

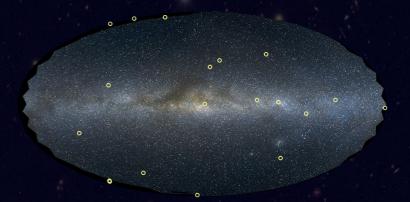
#### Leaderboard

<u>Rank</u>	User	Number of classifications	Success rate
1	chrostek	21561	88.9
2	KrystianBykowski	21272	86
3	algol	15035	92.8
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#### Daily streak



#### User's classification map



#### Dynamic weekly ranking



From what you see, what is the type of this source?

https://xmm-ssc.irap.omp.eu/claxson

# 3) Results (so far)

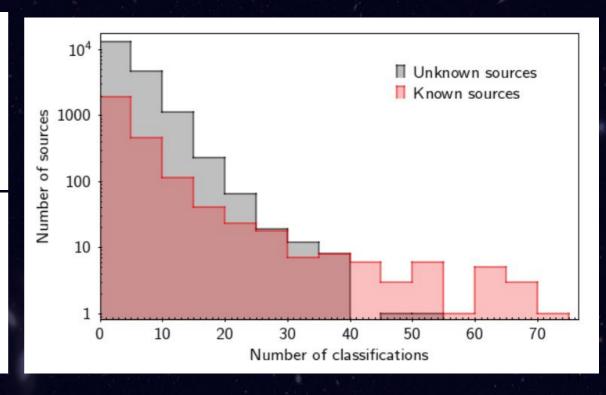


### Performance of CLAXSON classification

- So far >200 unknown sources were classified ≥ 20 times
  - ⇒ how reliable are their classifications?

Known sources				
	AGN	Star	XRB	Precision
$\rightarrow$ AGN	38	0	0	100%
$\rightarrow$ Star	1	31	1	94%
$\rightarrow$ XRB	1	0	8	89%
$\rightarrow$ Other	0	0	1	-
Recall	95%	100%	80%	

Unknown sources				
111	AGN	Star	XRB	Precision
$\rightarrow$ AGN	43	1	8	83%
$\rightarrow$ Star	5	15	4	62%
$\rightarrow$ XRB	6	1	9	60%
$\rightarrow$ Other	0	0	2	11 <u>2</u> 2
Recall	80%	88%	39%	



## Outperforming machine learning

- So far >200 unknown sources were classified ≥ 20 times
  ⇒ reliable classifications
- Of these, some ~20% disagreement between CLAXSON and CLAXBOI (especially the case for XRB).

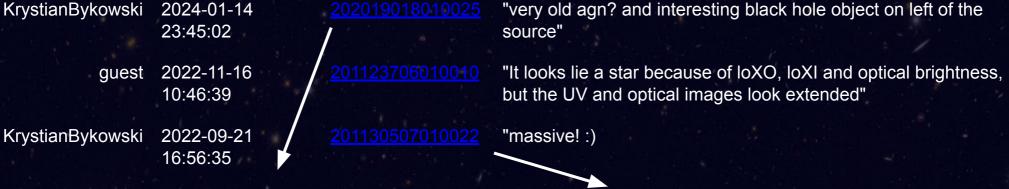
Taken from CLAXBOI

$\begin{array}{cccccccccccccccccccccccccccccccccccc$	
$\rightarrow$ Star 5 15 4 $\rightarrow$ XRB 6 1 9	recision
$\rightarrow$ XRB 6 1 9	83%
	62%
	60%
$\rightarrow$ Other 0 0 2	8 <u>2</u>
Recall 80% 88% 39%	

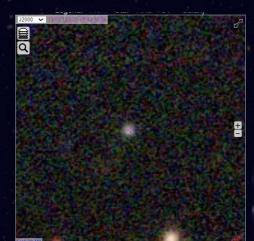
- ⇒ visual inspection
- ⇒ in most cases the CLAXSON-based classification is more trustable
  - Also useful to train the human (scientist) in the loop

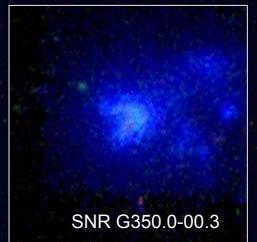
# Anomaly detection (?)

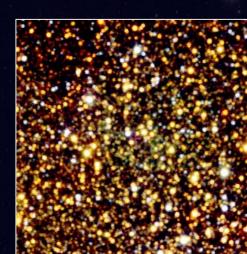
Users can leave comments to discuss each source. Examples:









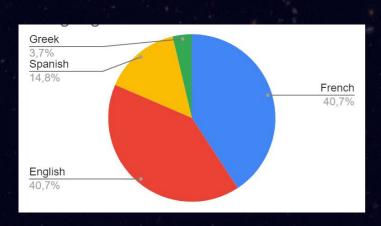


# "Challenges": expert mode for specific science

Experienced users can choose to join "challenges" with sources difficult to classify First challenge: ULX candidates in nearby galaxies

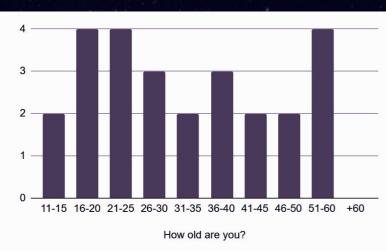


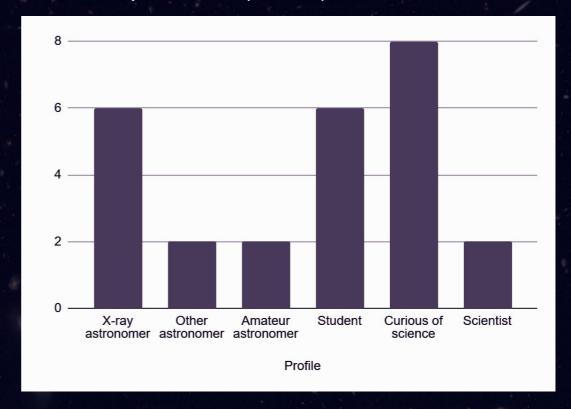
# Impact as an outreach tool



User survey May 2022 (29 answers): CLAXSON reaches a large variety of user profiles!

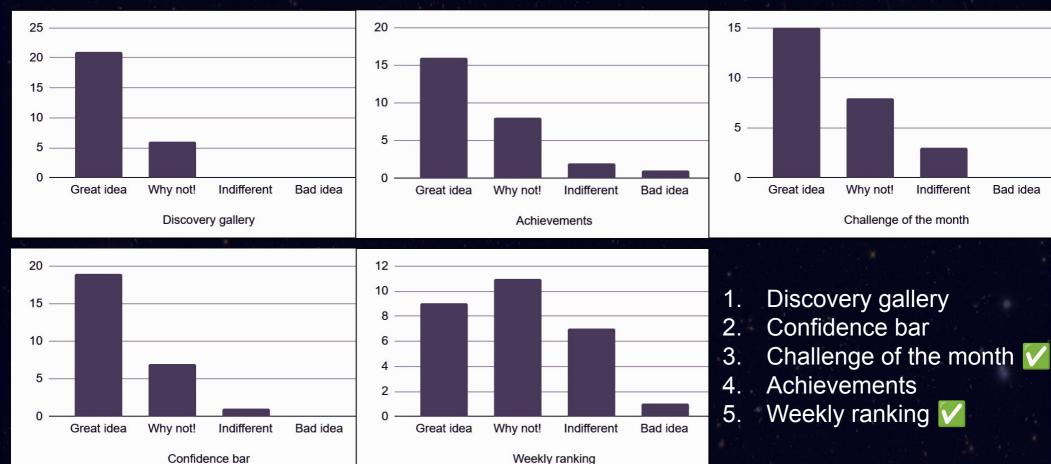
2024: >140 experienced (level 2) users





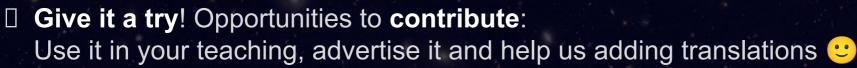
# Citizen science close to the people

Users were asked to give their opinions on a bunch of possible future developments. Here is what they replied.



## Conclusion

- CLAXSON is a citizen science platform to make the most of current and future XMM-Newton archives
- Ongoing since 2022 with capabilities to enlarge training samples / do serendipitous discoveries
- Scientific impact: encouraging results (better than ML) + train the human in the loop (+ keep them enthusiast □)
- Outreach impact: has interested all kinds of public to X-ray astronomy. Huge enthusiasm! Some very active users.



link to CLAXSON:



