

Maximum classification with minimum training

Enabling Astronomical Transient discoveries in the Rubin era: the Fink-Brazil Workshop 8 May 2024, CBPF - Rio de Janeiro, Brazil

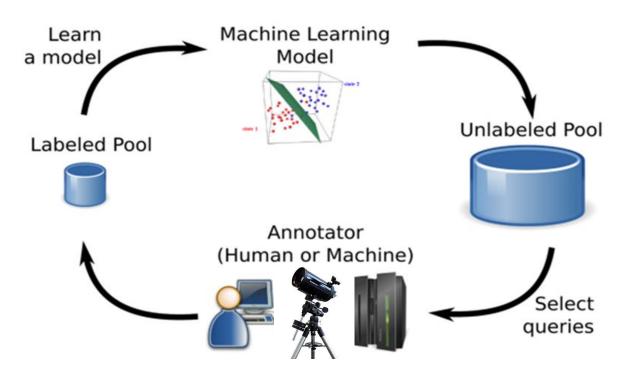






Active Learning

Optimal classification, minimum training

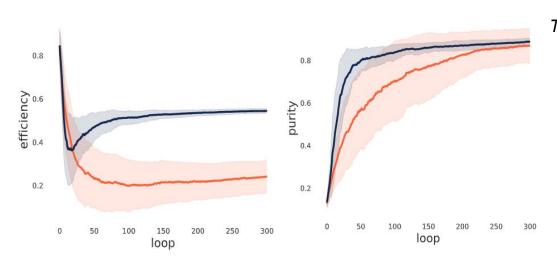


Case study: Early SN la classification



Results after 300 loops:

Training: 310 alerts Testing: > 52 000 alerts



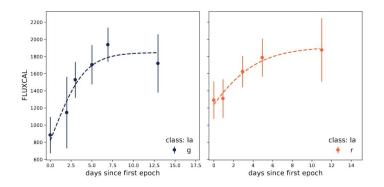
Choose training sample which lead to better results and train a Random Forest classifier ...



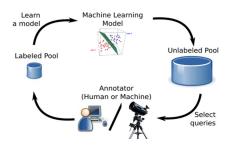
Trained ML model



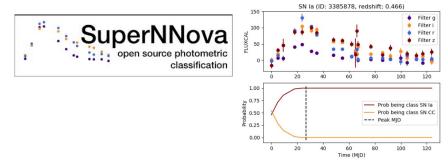
Sigmoid features from Leoni et al., 2022



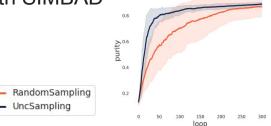
Off-line train with Active Learning



Agreement with SuperNNova



- Less than 20 detected points
- At least 3 points per filter
- Xmatch with SIMBAD





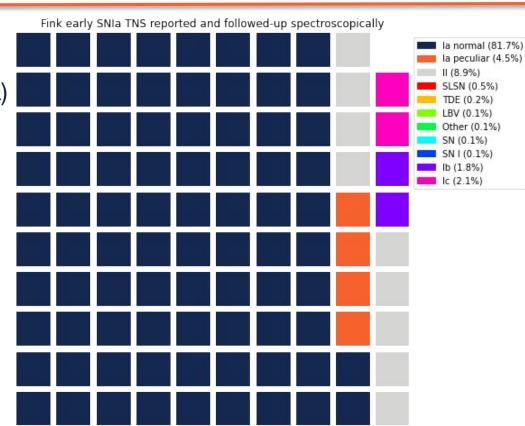
Not a known transient/variable + Score (early SNIa & SNN SN | SNIa)

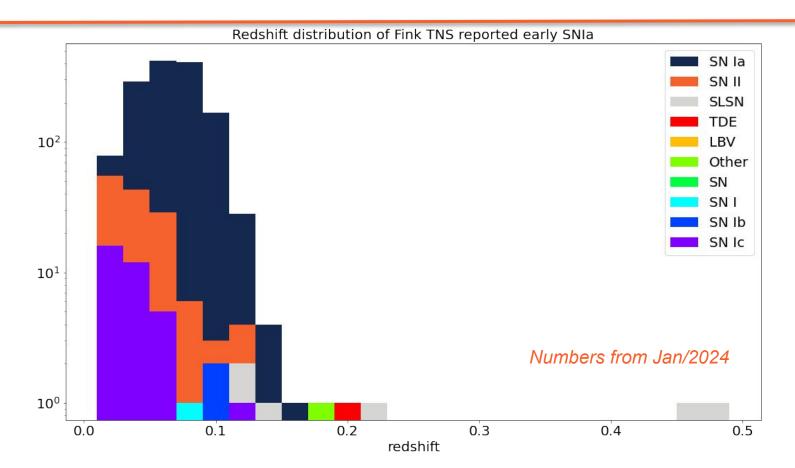
> = 3017 reported to TNS = 1632 followed-up

Marco, Emille, Julien, +++

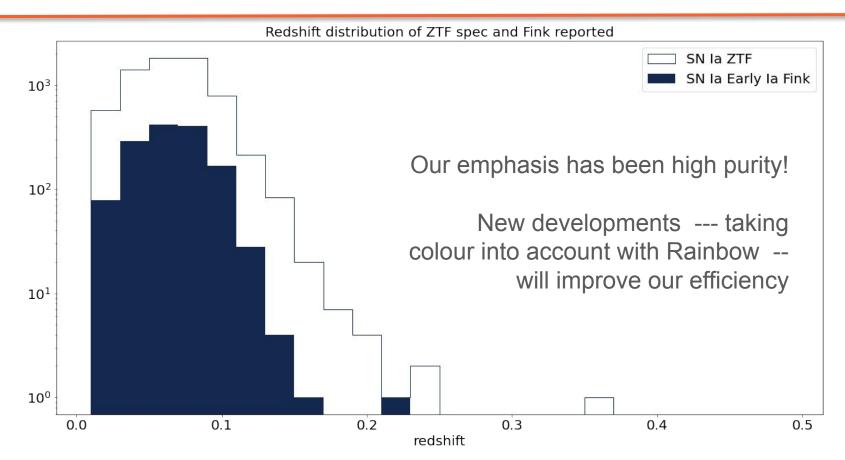
Numbers from Jan/2024









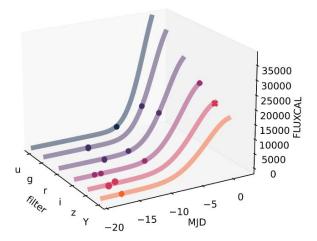


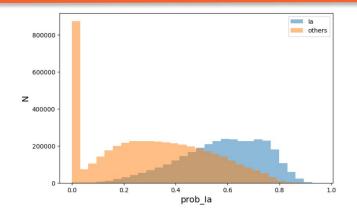


ELAsTiCC challenge

- Cadence is far from ideal
- We needed to be able to extract features with a lower number of points

Example of light curve fitted with sigmoid + rainbow





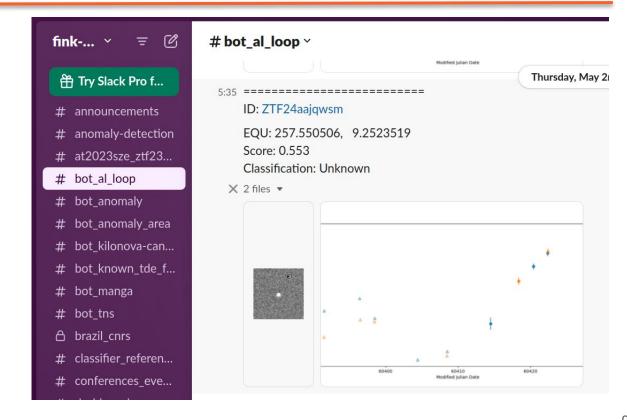
Threshold	Efficiency	Purity
0.5	0.70	0.70
0.6	0.49	0.77
0.7	0.26	0.85



Active Learning for real

Candidates in the decision boundary are sent to observation at the Siding Spring Observatory, Australia



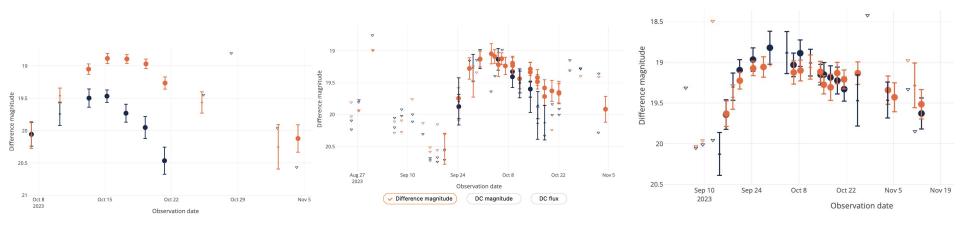




AL: improving training sets

Aka: follow-up to identify early non conclusive SNe Ia or non Ia

2 CV, 16 SN Ia, 1 SN Ib, 2 SN Ibn, 1 SN Ic, 5 SN II, and others low SNR



ANU 2.3m IFU for spectroscopic follow-up + extra spectra by DEBASS and ePESSTO+



Take home message

- Machine Learning models trained or real data are complementary to those trained on simulations
- Real data training will always be within the small-data regime
- Active learning is a way to remove the human from the loop, for classification of well known classes
- The technique is class-independent
- For Rubin all of this should be automated

