## **Searches of lensed Transients** and Variables

Time Domain Cosmology with Strong Gravitational Lensing, Jan 25, 2021

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- Types of transient/variable sources
  - Quasars
  - Supernovae and GWs
  - Others GRBs & FRBs
- Types of searches
  - (Machine Learning) Algorithms Visual inspection / Citizen Science

## Imaging/Continuum

- Radio:
  - MIT-Greenbank Survey (Burke 1989)
  - JVAS (Patnaik et al. 1992, Browne et al. 1998)
  - CLASS (Myers et al. 2002)
- ptical:
  - HST Snapshot Survey (Bahcall, Maoz, et al. 1992)

Other optical (HST-based) searches e.g. CANDELS, GEMS, GOODS and COSMOS - but for lensed galaxies



#### Quasars

0128+437 0218+357 0445+123 MG0414+054 CLASS • . . gravitational lenses 0631+519 0712+472 0739+366 0850+054 1030+074 1127+385 ٠ : 1152+199 1422+231 1555+375 1359+154 1600+434 1608+656 • 1933+503 2108+213 . 2319+051 1938+666 2045+265 2114+022 ٠ 1.1

### Imaging+Spectroscopy

- Hamburg ESO Survey
  - e.g. Wisotzki et al. 1996, 2000, 2001
- SDSS/BOSS spectroscopy:
  - Oguri et al. 2006: SQLS morphology+colors+ modeling+ SDSS image visual inspection
  - AM et al. 2016: BQLS morphology+colors+BOSS image visual inspection
  - Jackson et al. 2012: MUSCLES visual inspection of all quasars visible in UKIDSS

#### Quasars







Inada et al. 2012





### Imaging/Continuum

Catalog-based

- WISE +/ Gaia+/ DES (STRIDES)
  - Agnello,...AM, et al. 2018: Color cuts + multiplets + visual inspection
  - Agnello & Spiniello 2019: 5 methods ; cuts based on morphology, multiplets, spectra, color, multi-wavelength
  - Lemon et al. 2017, 2018, 2019, 2020: GAIA based; comp. fitting+ variability (see next talk)
- PanSTARRS
  - Rusu,..AM, et al. 2019: AGN catalog + cuts on parameters (color, magnitude, etc.)+ GAIA+ visual inspection



### Imaging/Continuum

Modelling-based

- Chan, ..., AM, et al. 2015, 2020
  - CHITAH algorithm + trained on mock lenses from CFHTLS data
  - Applied to HSC-Wide for discovering quads, in particular



### Variability

- Method only:
  - Kochanek et al. 2006: Difference imaging
- Method+Application:
  - Lacki et al. 2009: SDSS Supernova Survey + SQLS
    - images+light curves; look for extended variable sources; success limited by the survey design
  - Chao,.., AM et al. 2020a and 2020b: HSC-Transient Survey
    - Apply difference imaging to variables and mock lensed quasars
    - Images with large effective area and sufficiently large number of blobs are candidates

#### Quasars





Chao et al.



### Light curves

#### • Method primarily:

- GRAL: Krone-Martins et al. 2019:
  - Quasar light curves + images from CRTS
  - Apply entropy and wavelet transforms method to select doubles
- Shu et al. 2020
  - Autocorrelation of light curves
  - Tested on COSMOGRAIL curves of 22 CLASS lenses
  - improvements possible by including additional information such as multi-filter, morphological and astrometric data

#### Quasars



### Machine learning

- Method primarily:
  - Agnello et al. (2015): Preselect targets from catalogs with ANNs + Identify candidates with pattern recognition algorithm
  - Williams et al. (2017): Gaussian Mixture Models + color cuts + visual inspection
  - Khramtsov et al. (2019): Catboost (decision tree based algorithm) + KiDS

#### Quasars



Khramtsov et al. 2019

### Machine learning

- Method+Application (for Quads):
  - GRAL Krone-Martins et al. 2018, Delchambre et al. 2019
    - Extremely randomized Trees on GAIA DR2
  - Ablai, AM et al. (in prep)
    - Simulated lensed quasars with microlensing injected on real DES galaxies included in the Training sample
    - Novel techniques e.g. Polar convolution and architecture e.g. Argus

#### Quasars



Ablai, AM et al. (in prep)

## **Citizen Science : Space Warps**

# spacewarps.org

Pls: Marshall, Verma, AM

Marshall et al. 2016, AM et al. 2016



- Classification: Semi-automated or pure visual inspection
- Multiple classifications are combined in a Bayesian framework to assign probabilities to each image to contain a lens
- Candidate lensed quasars discovered in Hyper Suprime Cam survey while looking for lensed galaxies

#### **Classification Interface**





Sonnenfeld, Verma, AM et al. 2020



### Lensed SNe

### Proposed Techniques

- Color-magnitude (Quimby, Oguri, AM et al. 2014)
- Lens photometry (Goldstein & Nugent 2016)
- Follow-up of cluster lenses (e.g. SN Refsdal from the GLASS program follow-up of clusters from MACS or CLASH program)
- Cross-matching of ZTF transients with existing samples of lenses
  - https://www.iucaa.in/~navin/ztf\_alerts.html by Navin Chaurasia (IUCAA)





Quimby, Oguri, AM et al. 2020



SN Refsdal, HST/WFC3

### Lensed GWs

- Method primarily:
  - Posterior overlap of image pairs e.g. Haris et al. 2018
  - Sub-threshold searches e.g. Li et al. 2019
- Searches in real GW data:
  - First two observing runs LIGO/VIRGO
  - Work ongoing in more recent data









Haris et al. 2018

### Lensed GRBs/FRBs

- GRBs:
  - Hurley et al. 2019: Data from Konus-Wind
    - sky localization, light curve similarities
    - comparison of energy spectra; blind and targeted search
  - Ahlgren et al. 2020: Data from Fermi-GBM
    - Cuts on position, time-averaged spectral properties, relative duration
    - cross-correlation of light curves
- FRBs:
  - See Adi Zitrin's talk





Ahlgren et al. 2020



- Imaging (multi-wavelength), Spectroscopy, Variability, Light curves, Modeling, Citizen Science and Machine learning
- New challenges in stage 4 surveys:
  - (DESI, PFS), Radio (SKA, LOFAR), GW experiments

• e.g. X-rays (eROSITA), Optical imaging (LSST, Euclid), Optical spectra