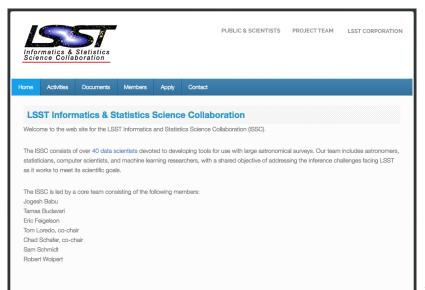
Jason McEwen www.jasonmcewen.org @jasonmcewen

Mullard Space Science Laboratory (MSSL) University College London (UCL)

Specialist Discussion Meeting on LSST, Royal Astronomical Society, May 2017

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Prospective members from U.Sbased institutions, please use the application below. Researchers affiliated with Chilean institutions are also welcome to join the ISSC, but there is a separate application process. Please contact Sebastian Lopez for more information.						
If you have questions regarding membership, please contact Chad Schafer at cschafer@cmu.edu.						
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				Jason N	IcEwen LSST ISSC	

#### LSST Informatics and Statistics Science Collaboration (ISSC) LUSC-ISSC mailing list (LUSC-ISSC@jiscmail.ac.uk)

Subscribe by sending an email to listserv@jiscmail.ac.uk, with the following details:

Subject: <BLANK> Message: SUBSCRIBE LUSC-ISSC <Firstname> <Lastname>

This mailing list will be used to keep everyone abreast of ISSC related activities.

All list members can post messages so feel free to make use of this list for general discussions of interest to members and don't hesitate if you have any questions about ISSC!

Although ISSC is a distinct science collaboration, there will be close interaction with the activities of DESC and other science collaborations to ensure informatics and statistics developments are closely related to the science goals of LSST.

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#### Conferences, meetings and visitor programmes

- Statistical Challenges in 21st Century Cosmology, Chania, 24-27 May 2016 http://cosmo21.cosmostat.org/
- Statistical Challenges in Modern Astronomy, Carnegie Mellon University, 6-10 June 2016 http://scma6.org/
- LSST@Europe 2, Belgrade, 20-24 June 2016 https://project.lsst.org/meetings/lsst-europe-2016/
- SAMSI opening workshop on Statistical, Mathematical and Computational Methods for Astronomy, North Carolina, 22-26 August 2016 https://www.samsi.info/programs-and-activities/research-workshops/2016-17-astro-openingworkshop-august-22-26-2016/
- SAMSI visitor programme, North Carolina https://www.samsi.info/programs-and-activities/year-long-research-programs/2016-17program-on-statistical-mathematical-and-computational-methods-for-astronomy-astro/
- DESC collaboration meetings

LSST ISSC Meetings Activities

#### Conferences, meetings and visitor programmes

 Biomedical and Astronomical Signal Processing (BASP) Frontiers workshop Villars, Switzerland, 29 January - 3 February 2017 Dedicated LSST informatics and statistics session http://www.baspfrontiers.org/





#### IMPORTANT DATES

01.06.2016 Session proposal deadline

01.09.2016 Abstract submission opening

01.10.2016 Abstract submission deadline

#### About the workshop

The International Biomedical and Astronomical Signal Processing (BASP) Frontiers workshop was created to promote synergies between selected topics in astronomy and biomedical sciences, around common challenges for signal processing.

Building on the success of the first workshops (2011, 2013 and 2015), BASP Frontiers 2017 will gather around 100 participants and open its floor to many interesting hot topics in theoretical, astrophysical, and biomedical signal processing, with a particular focus on imaging.

Ski and full board philosophy: Following our tradition, BASP Frontiers 2017 will take

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Jason McEwen

LSST ISSC Meetings Activities

#### Conferences, meetings and visitor programmes

 Biomedical and Astronomical Signal Processing (BASP) Frontiers workshop Villars, Switzerland, 29 January - 3 February 2017 Dedicated LSST informatics and statistics session http://www.baspfrontiers.org/

#### Organiser: Tim Eifler

17:30 - 19:45	Talks (	<i>i</i> )	
		Joo Zuntz	Sampling methods and pipeline design in modern cosmology
		Boris Leistedt	Data-driven, interpretable photometric redshifts for deep galaxy surveys wit unrepresentative training data
		Jean-Luc Starck	Space variant deconvolution of galaxy survey images
		Elena Sellentin	Estimated covariance matrices in large-scale structure observations
		Elona Cononan	Estimated Covariance matrices in large-scale structure observations
10.45 20.20	Destor	Oleg Smirnov	Estimated Covariance inances in vargescale structure doservations Challenges of Extreme Dynamic Range Imaging: The Cygnus Files
19:45 - 20:30	Posters		Challenges of Extreme Dynamic Range Imaging: The Cygnus Files
19:45 - 20:30	Posters	Olog Smirnov	Challenges of Extreme Dynamic Range Imaging: The Cygnus Files Spin-SILC: CMB polarisation component separation for next-generation experiments
19:45 - 20:30	Posters	Oleg Smirnov	Challenges of Extreme Dynamic Range Imaging: The Cygnus Files Spin-SILC: CMB polarisation component separation for next-generation experiments On Flexibeam for radio interferometry
19:45 - 20:30	Posters	Olog Smirnov	Challenges of Extreme Dynamic Range Imaging: The Cygnus Files Spin-SILC: CMB polarisation component separation for next-generation experiments

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LSST ISSC

LSST ISSC Meetings Activities

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 Biomedical and Astronomical Signal Processing (BASP) Frontiers workshop Villars, Switzerland, 29 January - 3 February 2017 Dedicated LSST informatics and statistics session http://www.baspfrontiers.org/

#### Organiser: Ben Wandelt

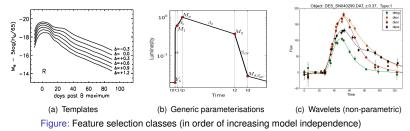


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#### Photometric supernova classification Machine learning

- Photometric supernova classification by machine learning (Lochner, McEwen, Peiris, Lahav & Winter 2016; arXiv:1603.00882)
- Go beyond single techniques to study classes.



- Integrate physics into machine learning (scale and dilation invariance).
- Understand physical requirements: representative training, redshift.

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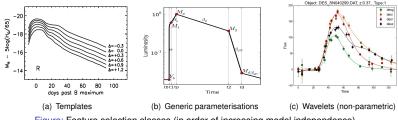


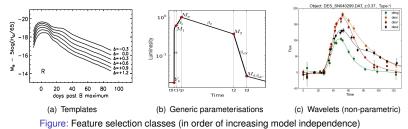
Figure: Feature selection classes (in order of increasing model independence)

- Integrate physics into machine learning (scale and dilation invariance).
- Understand physical requirements: representative training, redshift.

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#### Photometric supernova classification Machine learning

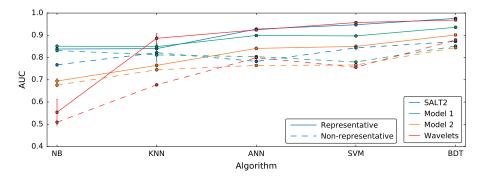
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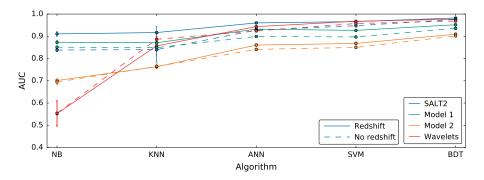
### Photometric supernova classification

Importance of representative training data



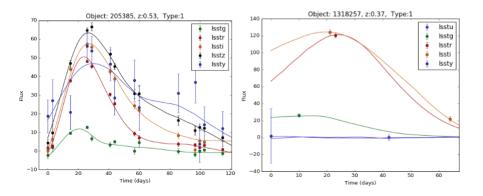
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#### Photometric supernova classification Importance of redshift



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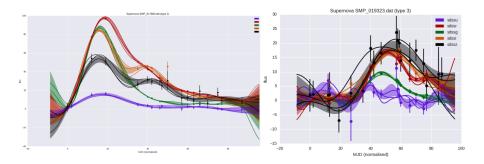
#### Photometric supernova classification Applying to LSST cadence simulations



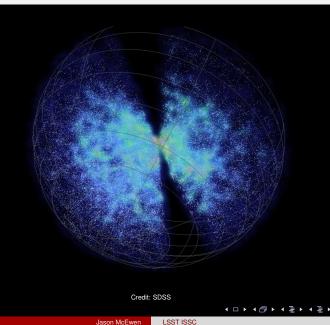
Wavelets, Deep Drilling Fields Wavelets, Wide-Fast-Deep

#### Photometric supernova classification Representative training

- Accurate Core Collapse SNe templates (CoCo) (Firth, Prajs, Sullivan, in prep.)
- Augment training data using Gaussian processes (Schuhmann *et al.*)



### LSST 3D data compression (3DDC) taskforce



## LSST 3D data compression (3DDC) taskforce

3DDC taskforce wiki page: https://confluence.slac.stanford.edu/pages/viewpage.action?pageId=195857648

3DDC taskforce Slack team: https://lsst3ddc.slack.com

Contributors: Franz Elsner, Jean-Eric Campagne, Benjamin Joachimi, Thomas Kitching, Francois Lanusse, Boris Leistedt, Jason McEwen, Hiranya Peiris, Layne Price, Anze Slosar, Edo van Uitert, ...

- Why 3D?
  - Extract more information
  - Filter non-linear scales
  - Deal with covariances
- Challenges
  - Fast transforms for data and theory
  - 3D pixelisations
  - Mask, selection effects, covariances, systematics

## LSST 3D data compression (3DDC) taskforce

#### Identified existing codes for 2D/3D transforms

	CosmicPy	C++, Py	Theory Fourier-Bessel		
	MRS3D	C++	Fourier-Bessel + wavelets		
7:1	3DEX	F90 (!)	Fourier-Bessel transform		
<u>ours!</u>	HEALPIX	C, F90, Py, IDL	2D Spherical harmonics		
Add yc	SSHT	C, Matlab	2D Spherical harmonics 3D Fourier-Laguerre + wavelets		
Ad	FLAG(LET)	C, Py, Matlab			
	LagSHT	C++	3D Fourier-Laguerre + Bessel		
	3DFast	С	Flat-sky Fourier-Bessel		

# Plan to start **Uber 3D code** <sup>™</sup>

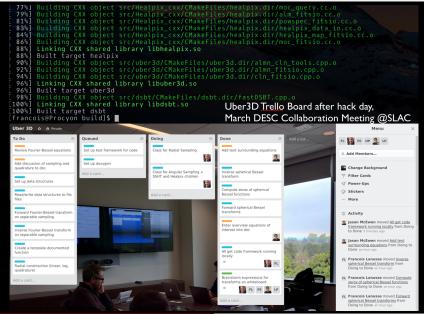
Get in touch if you'd like to contribute!



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#### LSST 3D data compression (3DDC) taskforce



Jason McEwen



## Spherical mass mapping

Planar approximations not applicable to forthcoming observations

• Cosmic shear  $_2\gamma$  related to convergence  $_0\kappa$  (integrated mass) by:

$$_{2}\gamma = 2\eth^{2} \left(\eth\bar{\eth} + \bar{\eth}\eth\right)^{-1}{}_{0}\kappa$$

$$\gamma(\boldsymbol{n}) = \int_{\mathbb{S}^2} \mathrm{d}\Omega(\boldsymbol{n}') \,_0 \kappa(\boldsymbol{n}') (\mathcal{R}_{\boldsymbol{n}} \,_2 \mathcal{K})(\boldsymbol{n}')$$

Integral form

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## Spherical mass mapping

Planar approximations not applicable to forthcoming observations

• Cosmic shear  $_2\gamma$  related to convergence  $_0\kappa$  (integrated mass) by:

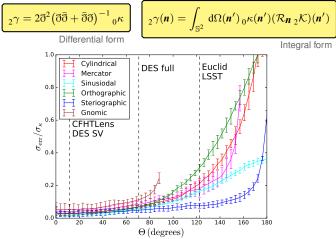


Figure: Error introduced by planar approximations in mass mapping (Wallis, McEwen, Kitching, Leistedt & Plouviez 2017; arXiv:1703.09233).

# Spherical mass mapping DES-SV observations

• Solve mass mapping problem in spherical setting, avoiding planar approximations (Wallis, McEwen, Kitching, Leistedt & Plouviez 2017; arXiv:1703.09233).

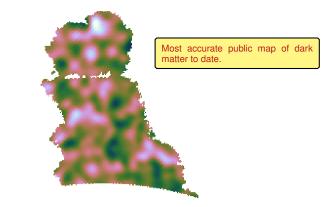


Figure: Recovered spherical convergence map  $_0\kappa$  from DES-SV observations.

https://issc.science.lsst.org/

#### Join the collaboration!

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LSST Informatics & Statistics Science Collaboration Welcome to the web site for the LSST Informatics and Statistics Science Collaboration (ISSC). The ISSC consists of over 40 data scientists devoted to developing tools for use with large astronomical surveys. Our team includes astronomers, statisticians, computer scientists, and machine learning researchers, with a shared objective of addressing the inference challenges facing LSST as it works to meet its scientific goals.							
Joges Tamas Eric Fe Tom L Chad Sam S	SC is led by a h Babu Budavari eigelson oredo, co-cha Schafer, co-cl Schmidt t Wolpert		sisting of the fo	ollowing me	mbers:		