

# WFIRST

## Harnessing the Power of the WFIRST- Coronagraph

A Coordinated Plan for Exoplanet and Disk Science



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David Ciardi (NExScI / Caltech)

Hannah Jang-Condell (Wyoming)

Stephen Kane (SFSU)

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Aki Roberge, Avi Mandell, Michael McElwain (NASA GSFC)

Stuart Shaklan, Renyu Hu (JPL)

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## Exoplanet Data Challenge

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# Exoplanet Data Challenge\*

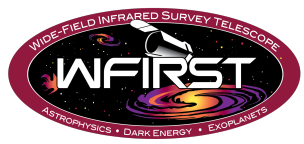
**Exoplanet Data Challenge #1:** Test spectral retrieval using synthetic planet spectra with instrumental noise. This exercise will help reveal model-dependent interpretations of noisy data. It is led by Sergi Hildebrandt and Maggie Turnbull. Cycle 1: 2016-17. Cycle 2: 2017-18.

**Exoplanet Data Challenge #2:** Test post-processing and source extraction techniques with spectral image cubes containing only a star and planets, processed with a simple instrument model. This exercise is intended as practice to begin developing the techniques. It is led by Maxime Rizzo and Aki Roberge. Cycle 1: 2017-18

**Exoplanet Data Challenge #3:** Add astrophysical background sources to the data cubes, processed with the project's WFIRST instrument model.

**Exoplanet Data Challenge #4:** Add interplanetary dust for a complete exercise in harvesting scientific results from realistic simulated data

(\*) In the proposal, the Exoplanet Data Challenge (EDC) was called Community Data Challenge (CDC)



# Exoplanet Data Challenge

Exoplanet Data Challenge #1: Test spectral retrieval using synthetic planet spectra with instrumental noise. This exercise will help reveal model-dependent interpretations of noisy data. It is led by Sergi Hildebrandt and Maggie Turnbull.

**Cycle 1:** 2016-17. Simple planet atmospheres and simple WFIRST IFS instrumental models.

**Cycle 2:** 2017-18. More realistic atmospheres and latest available WFIRST IFS and CGI instrumental models.

The Exoplanet Data Challenge is possible thanks to a collaborative effort of many people across several institutions.



Pat Irwin  
JoAnn Eberhardt  
Ryan Garland



Tyler Robinson



Mark Marley  
Roxana Lupu  
Mikey Nayak



Larry Sromovsky  
Pat Fry



SETI INSTITUTE  
Margaret Turnbull (PI)



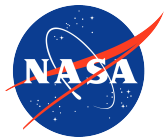
Maxime Rizzo  
Aki Roberge



David Ciardi  
Davy Kirkpatrick



Jacob Lustig-Yaeger

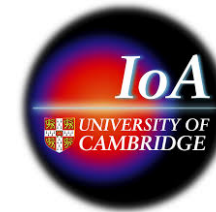


**Jet Propulsion Laboratory**  
California Institute of Technology

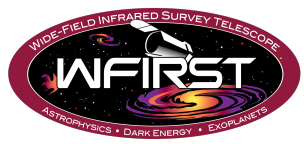
Renyu Hu  
Sergi Hildebrandt  
Stuart Shaklan



Bijan Nemati  
Carlos Mendoza



Nikku Madhusudha



# Exoplanet Data Challenge

EDC Wiki space

The screenshot shows a web browser interface for the IPAC Staff Wiki. On the left is a navigation sidebar with a tree view. The main content area displays the page title, a purpose statement, registration information, and a list of key milestones.

**ipac**

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IPAC Staff Wiki

- > How - To
- ▼ **Exoplanet Data Challenge**
  - > Simulated Exoplanet Data
    - Forward Modeling Exercise I
    - Forward Modeling Exercise II
    - Forward Modeling Exercise III
  - EDC 2016 Registrants
  - References
  - Retrieval Outputs and Units
    - Retrieval Exercise I
    - Retrieval Exercise II
  - > Meeting notes
  - Q&A
  - Useful Links
  - Submit Results
  - > People & Codes
    - Turnbull CGI SIT Proposal
    - > Turnbull CGI SIT (Private)

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IPAC Staff Wiki > Exoplanet Data Challenge 2016-2017

## Exoplanet Data Challenge 2016-2017

**Purpose:** Test spectral retrieval using simple synthetic planet spectra

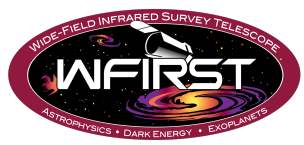
[Registration page](#)

**Start Date:** 15 August 2016

**Report Due Date:** March/April 2017

**KEY MILESTONES AND DATES**

- March/April 2017: completion of retrieval exercises and report to project on EDC results
- 23 December: first results on the retrieval exercise
- 7 December: results from the forward modeling exercise
- 15 August: release of CDC to public
- 18 July - use Sagan workshop as advertisement
- 15 July - first draft of stuff to deliver to the community
- 20 June - telecon with community members
- 31 May - complete reach out to community members
- 13 May - initial email contact
- 09 May - initial list of contacts agreed upon



# Exoplanet Data Challenge: Cycle 1

Methodology of the atmospheric retrieval data production and analysis:

- Data created for different signal to noise ratios: SNR=5, 10 and 20
- For different spectral resolution: R=20, 50 and 70
- Blind analysis: only planet spectra, mass and orbital phase given.
- Results for two Jupiter-like planets (super-Neptune in cycle 2)
- Data analyzed with different atmospheric models (one cloud, two clouds, one cloud and haze, two clouds and haze)

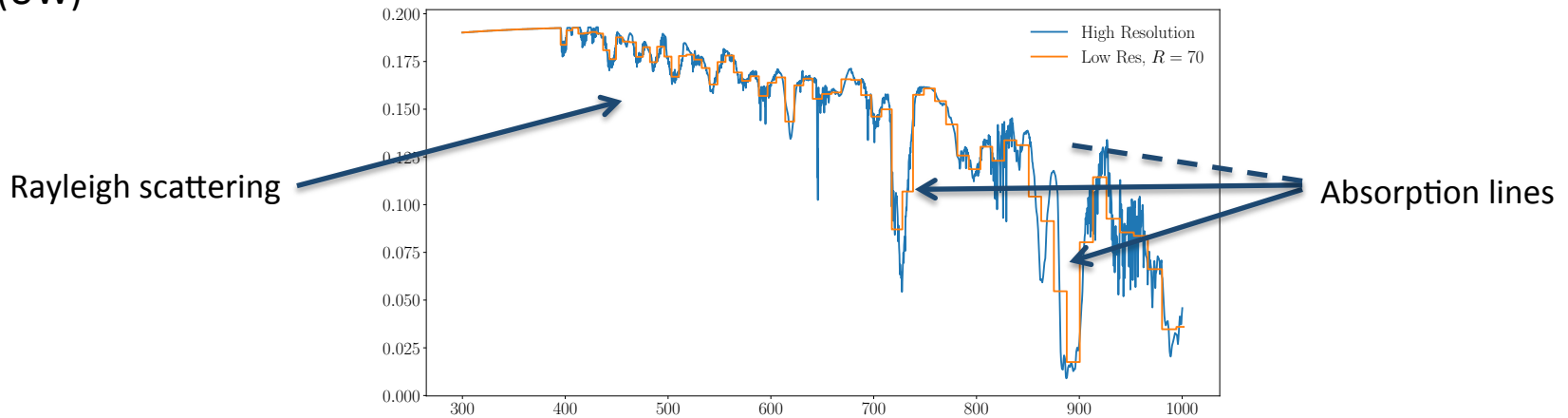
PS: SNR=10 and R=50 may now be the maximum values for WFIRST. Still results from the cases with R70 and/or SNR20 remain highly informative.



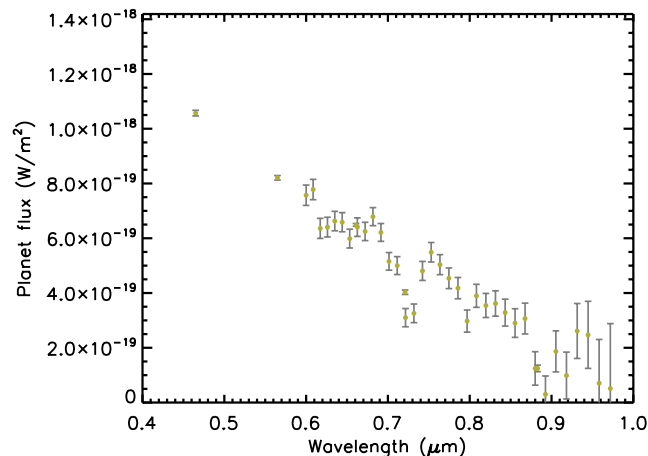
# Exoplanet Data Challenge: Cycle 1

## Sample of simulated data

- **High Resolution** spectra from Renyu Hu (JPL), resampled at **lower resolution** by Jake Lustig-Yaeger (UW)



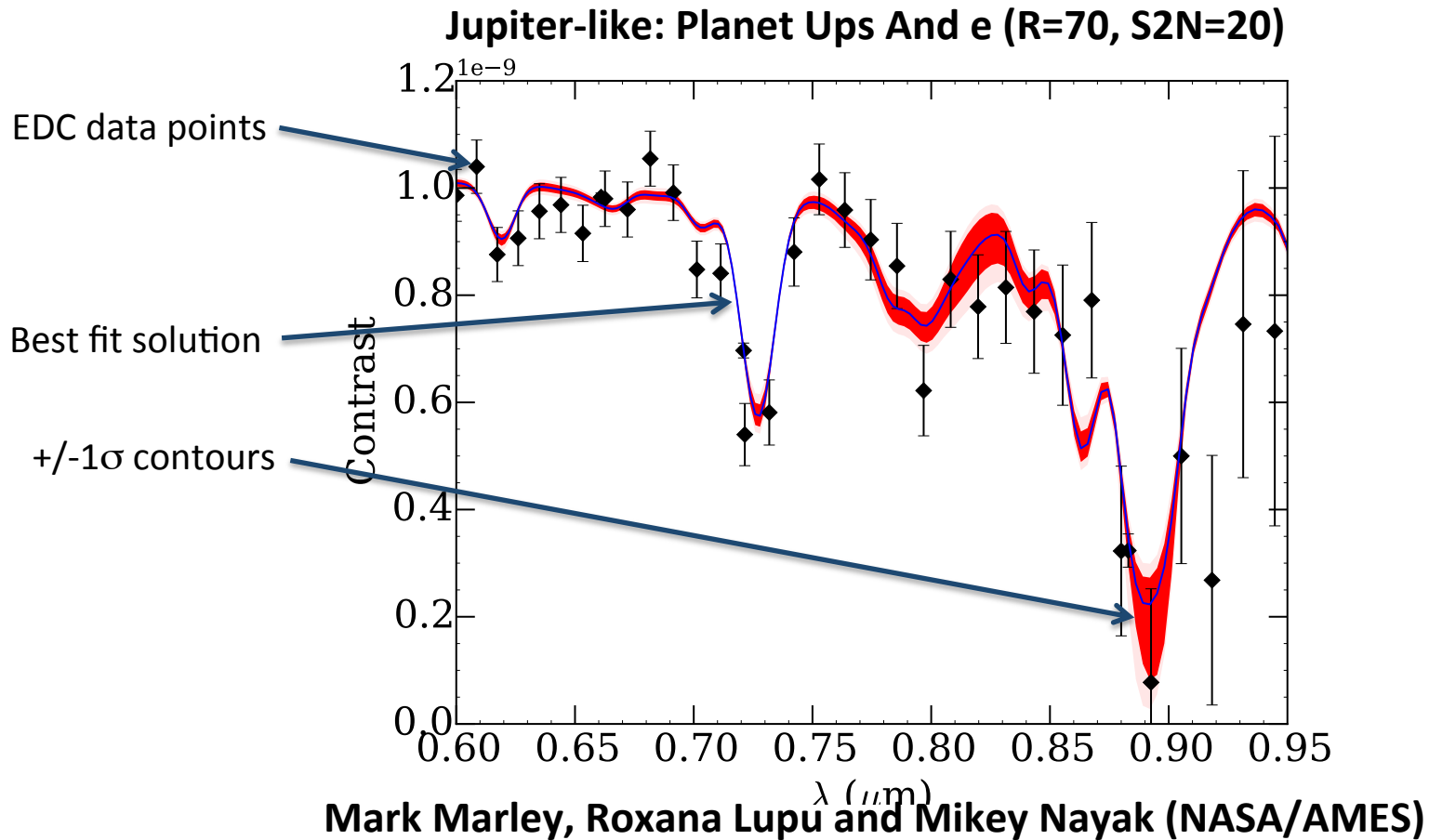
- Addition of instrumental noise and binned into WFIRST resolution by Tyler Robinson (USC)



This is the product given to the EDC participants

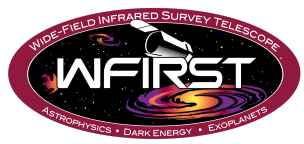


# Exoplanet Data Challenge: Cycle 1 Results

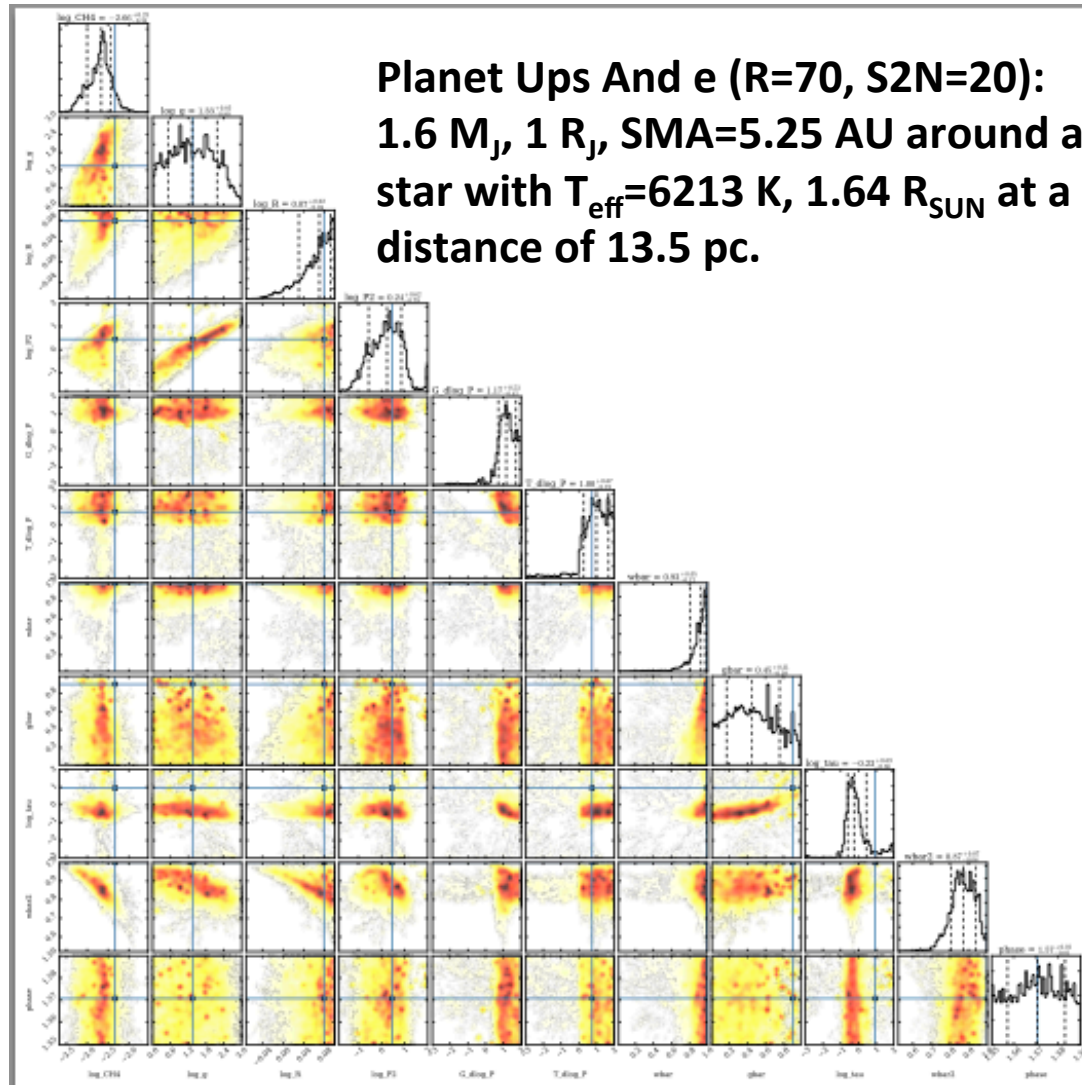


Obtaining results for one atmospheric model is computationally expensive (order of 1 week, 64 core machine). Some times bad fits happen, and the fit needs to be resubmitted.

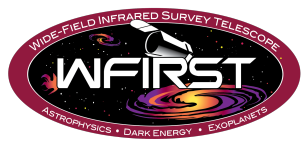




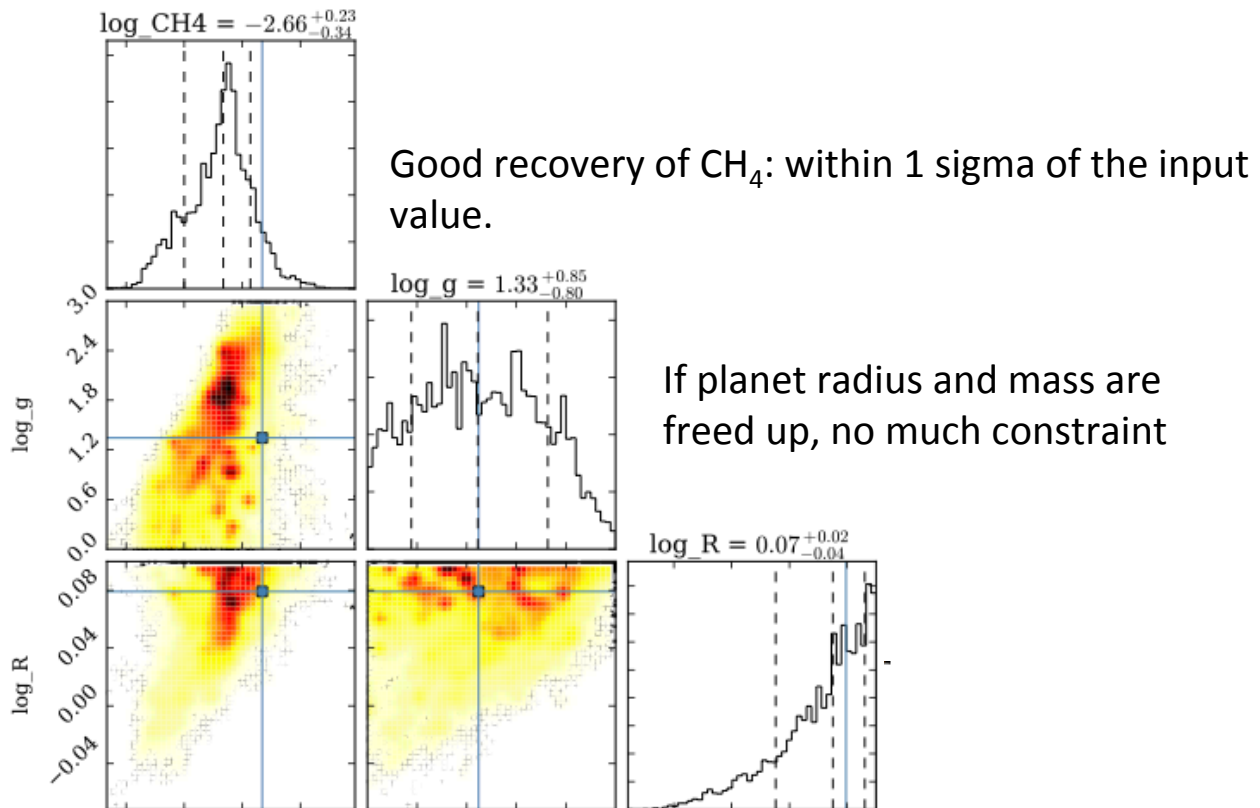
# Exoplanet Data Challenge: Cycle 1 Results



Mark Marley, Roxana Lupu and Mikey Nayak (NASA/AMES)



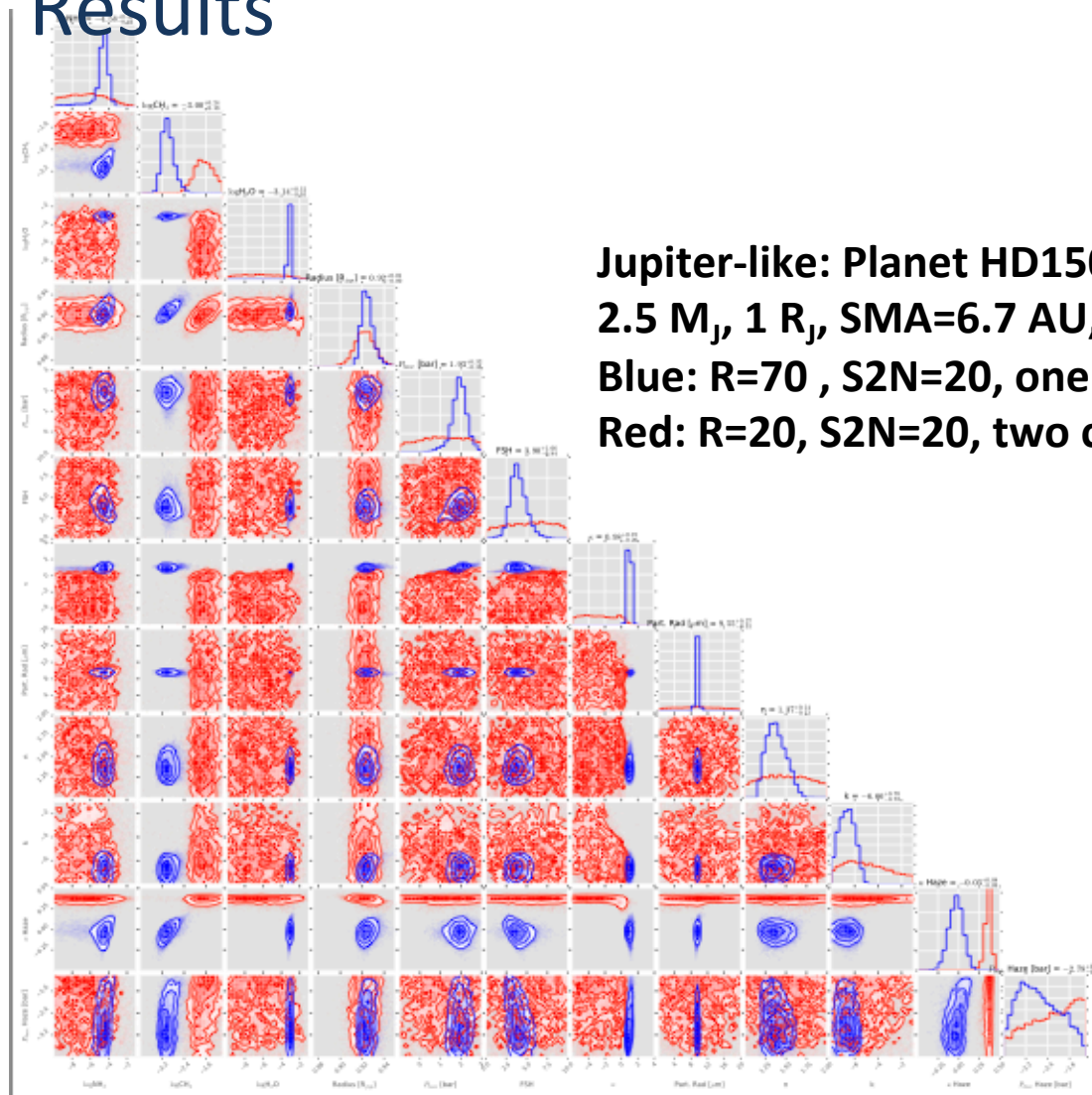
# Exoplanet Data Challenge: Cycle 1 Results



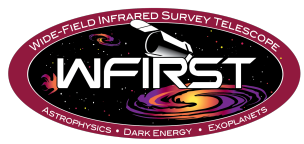


# Exoplanet Data Challenge: Cycle 1

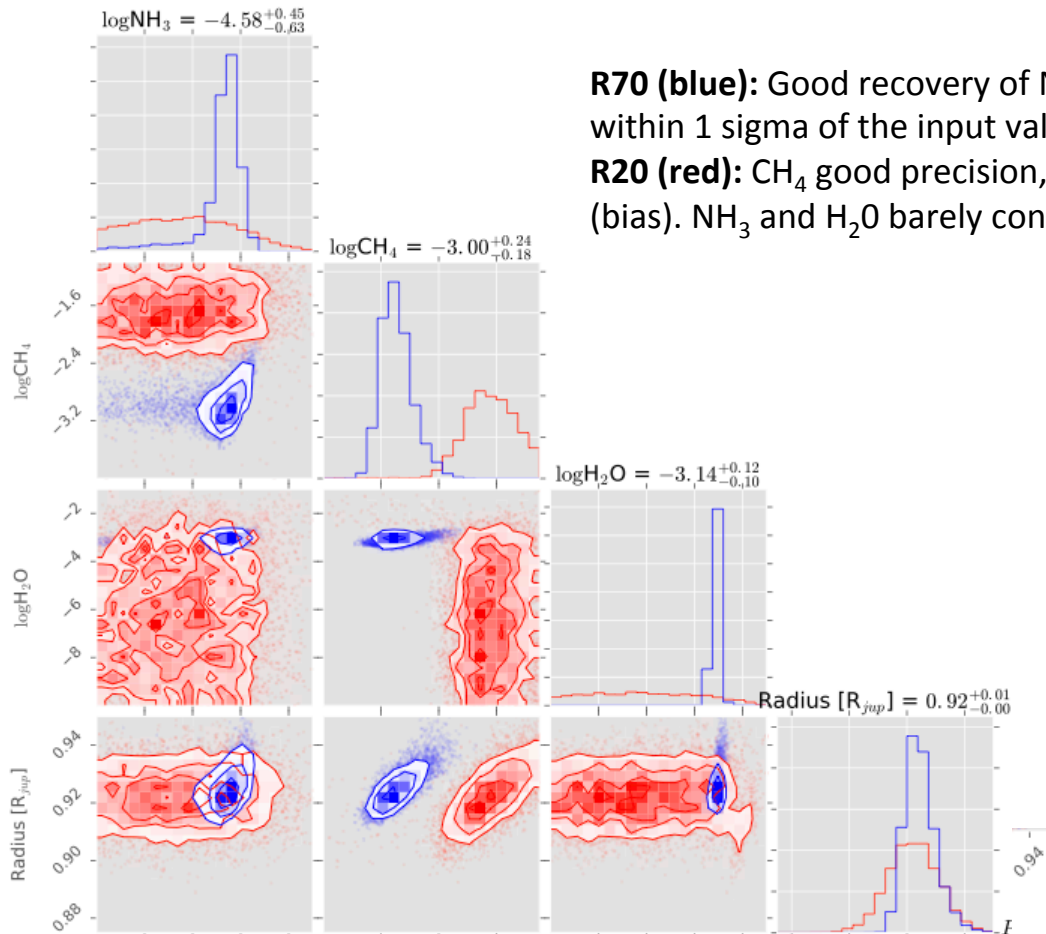
## Results



**Jupiter-like: Planet HD150706b:**  
2.5  $M_J$ , 1  $R_J$ , SMA=6.7 AU, Sun-like star at 28.2 pc  
Blue: R=70 , S2N=20, one cloud  
Red: R=20, S2N=20, two clouds and haze



# Exoplanet Data Challenge: Cycle 1 Results



**R70 (blue):** Good recovery of  $\text{NH}_3$ ,  $\text{H}_2\text{O}$  and  $\text{CH}_4$ : within 1 sigma of the input value.

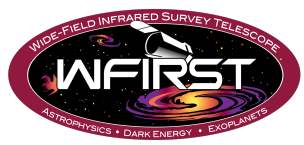
**R20 (red):**  $\text{CH}_4$  good precision, but bad accuracy (bias).  $\text{NH}_3$  and  $\text{H}_2\text{O}$  barely constrained

Radius (mass is given to the teams) good precision, but significantly biased ( $8\sigma$ )



# Exoplanet Data Challenge: Cycle 1 Summary

- Very valuable information for **WFIRST**.
- Really helpful **comparison** among different retrieval teams: absorption line tables, numerical simplifications, integration methods, simplified retrieval model versus forward model.
- If the planet mass is known, **R70** has enough information for 2 clouds to be detected with reasonable results (Jupiter-like planet around a Sun-like star at 6.7 AU and 28.2 pc).
- Even if the planet mass is known, **R20** is complicated for more information than just a haze, but not a cloud and a haze. Enough information for 1 cloud with reasonable results on  $\text{CH}_4$ ,  $\text{H}_2\text{O}$ ,  $\text{NH}_3$  and the radius. (Jupiter-like planet around a Sun-like star at 6.7 AU and 28.2 pc).
- Jupiter-like planet around slightly brighter star than the Sun at 13.5 pc can't determine radius and mass, though  $\text{CH}_4$  is well determined.



# Exoplanet Data Challenge: Cycle 2

- **Cycle 2:** 2017-18. More realistic atmospheres and latest available WFIRST IFS and CGI instrumental models
- **Planets** to be considered:
  - 1 JUPITER-LIKE PLANET
  - 1 SUPER-NEPTUNE
- No Super Earth until the results from these two planets are obtained
- Impose expected SNR and Resolution Power from Mission specs

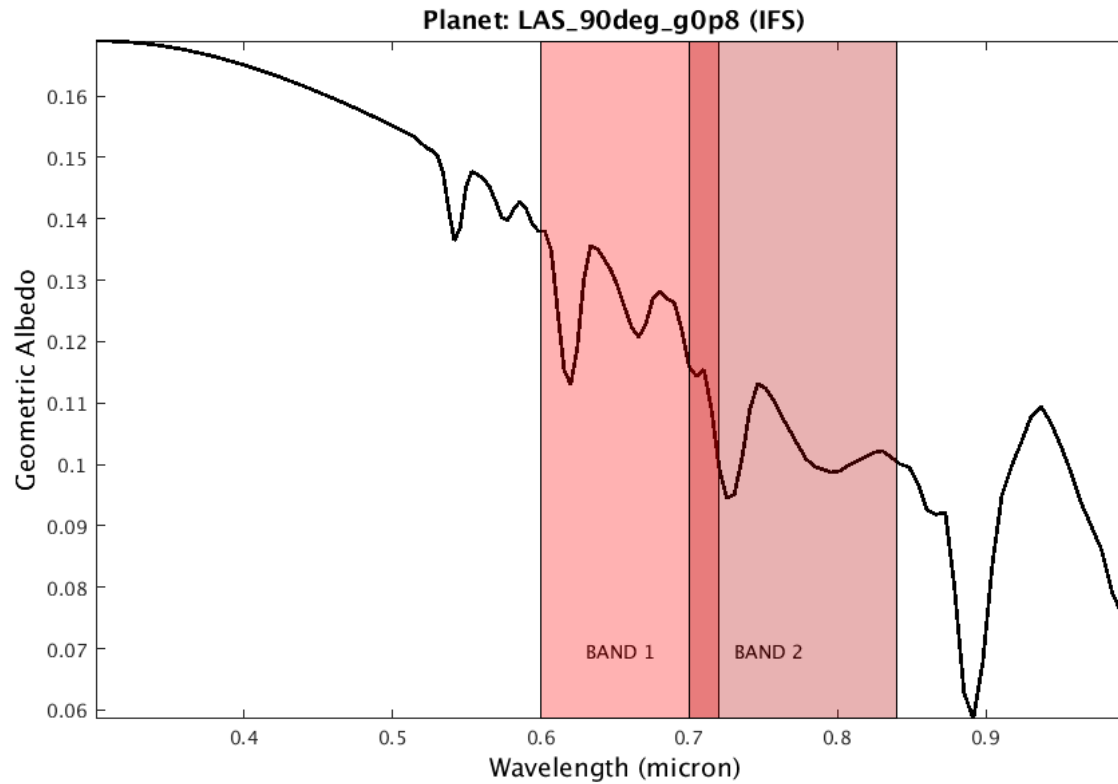
**Example:** Jupiter-like planet, with  $1 M_J$  and  $1 R_J$  in quadrature at 3 AU from a G0V star. Data for the planet flux produced by Larry Sromovsky (SSEC). Other parameters:

Uniformly mixed cloud from 0.1 to 0.2 bars: single-scattering albedo = 0.99, optical depth = 5, Methane vmr =  $1E-3$  ( $n_{CH_4}/n_{H_2}=1.197E-3$ ),  $n_{He}/n_{H_2} = 0.19585$ , isothermal atmosphere at  $T=140K$ , NQUAD=16 hemisphere, NAZIMUTH=16 for radiation transfer,  $n_{gauss}=n_{tcheb}=18$  for disk-average integration, RESOLVING POWER = 70, number of wavelengths=170, Collision-induced Absorption assumes Equilibrium  $H_2$ , Atmosphere has 57 log-spaced layers from  $5E-4$  to 40 bars, Surface albedo=0.0, gravity =  $20 m/s^2$ .



# Exoplanet Data Challenge: Cycle 2

## Simulated data

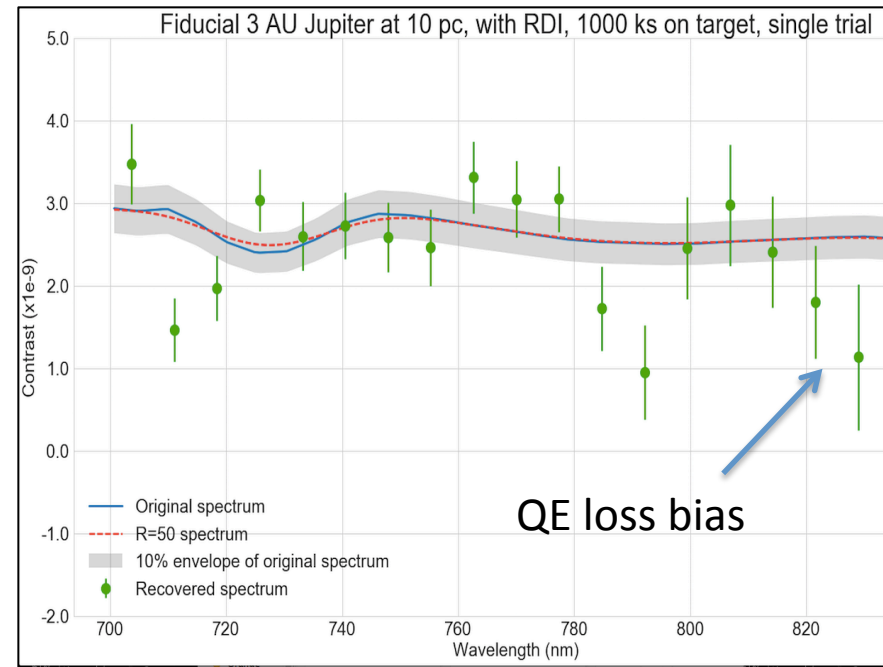
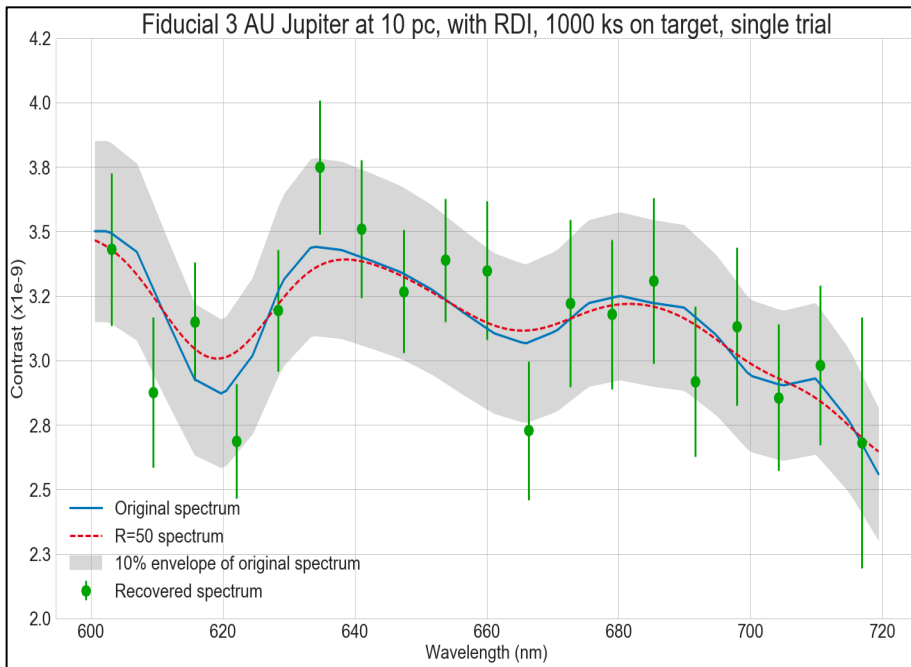




# Exoplanet Data Challenge: Cycle 2

## Simulated data

Planet flux data are then processed through the WFIRST IFS simulator



**Credit:** Maxime Rizzo (GFSC).

PS: RDI = Reference Differential Imaging (for PSF subtraction and flux estimation)

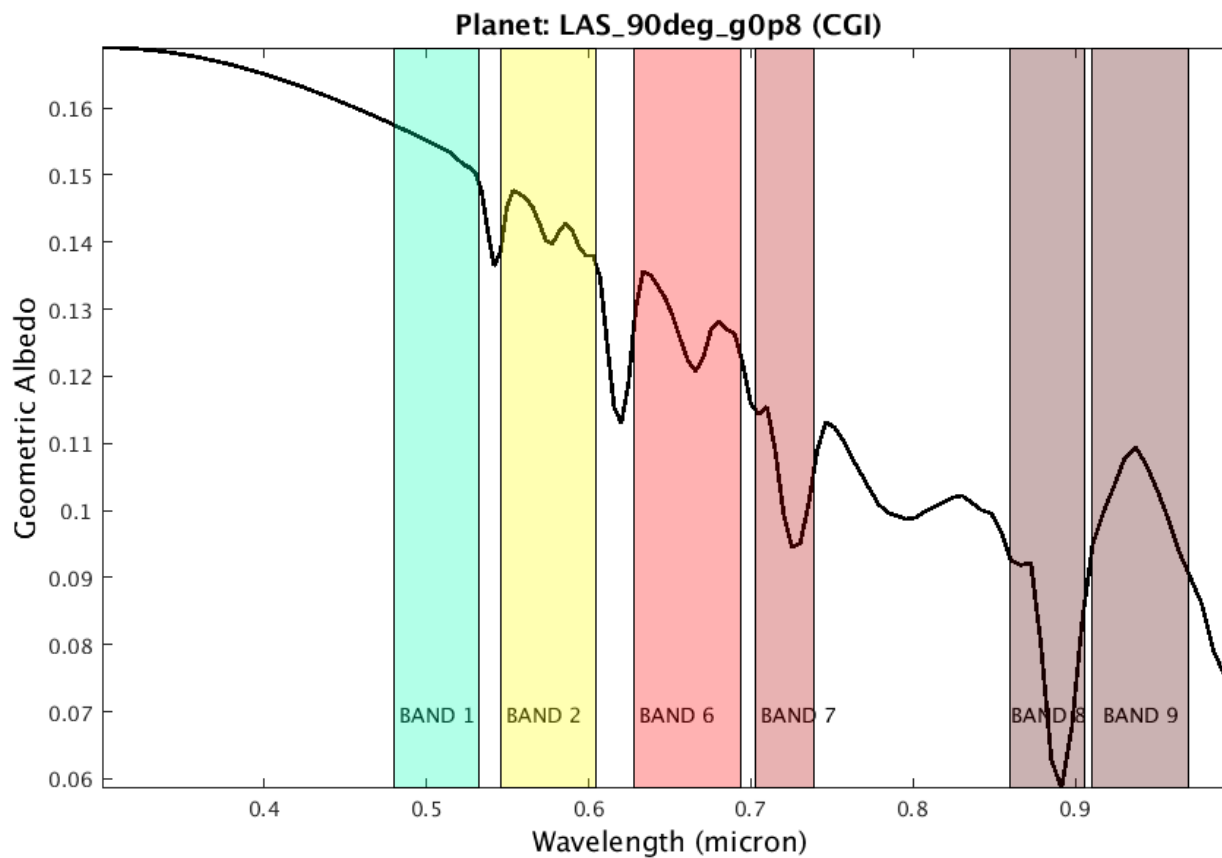




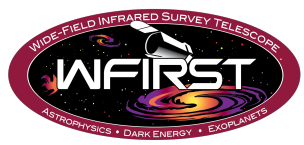
# Exoplanet Data Challenge: Cycle 2

## Simulated data

We may add photometric points from the CGI, in addition to the IFS, measurement using some relatively small portion of the IFS integration time.







# Exoplanet Data Challenge: Cycle 2

## Simulated data

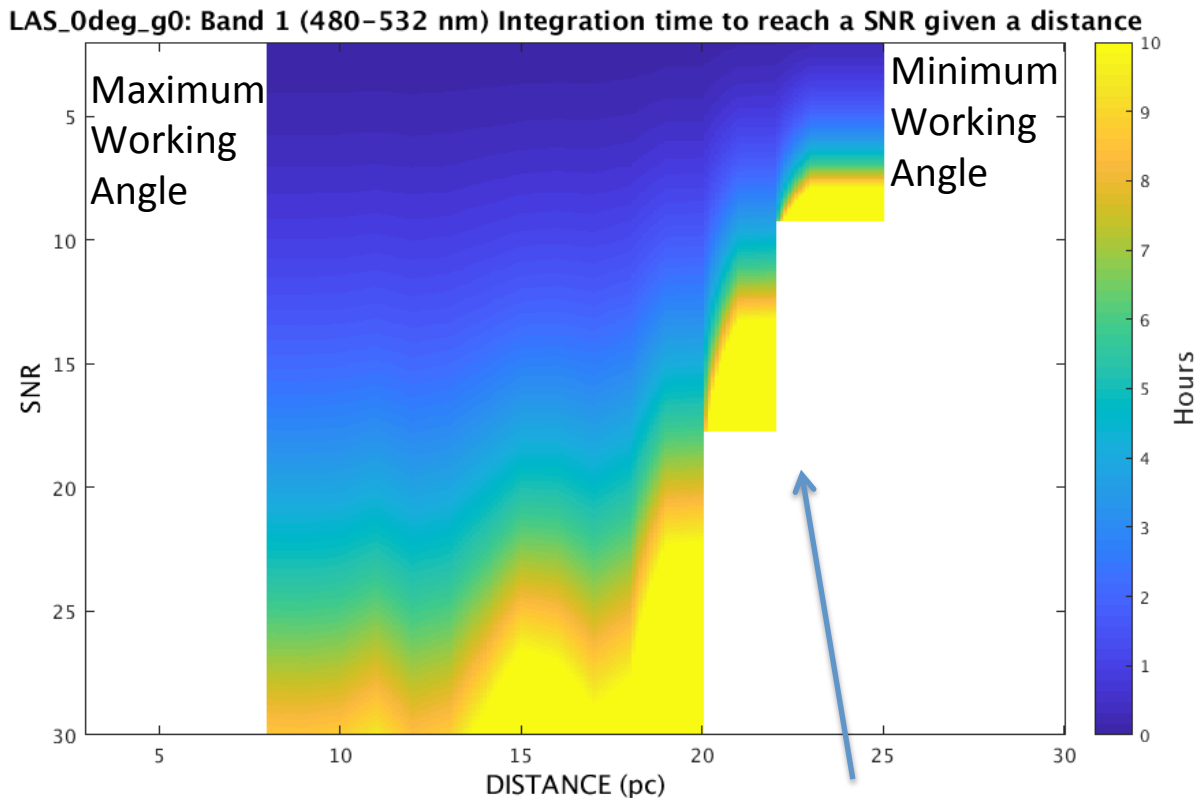
- I have enhanced it by adding the possibility of considering planets with an Albedo that may depend on wavelength and/or orbital phase (until now, the albedo was a constant value across the spectrum).
- The WFIRST Coronagraph Yield Calculator can handle any combination of cases for an arbitrary number of planets provided by the user and quickly return the results for the integration times, planet flux, contrast and geometric albedo.
- In the following, I will show the results for the planet considered in this presentation.



# Exoplanet Data Challenge: Cycle 2

## Simulated data

Results from the enhanced WFIRST Yield Calculator: Integration time as a function of the distance to the exoplanet and the SNR to be achieved.



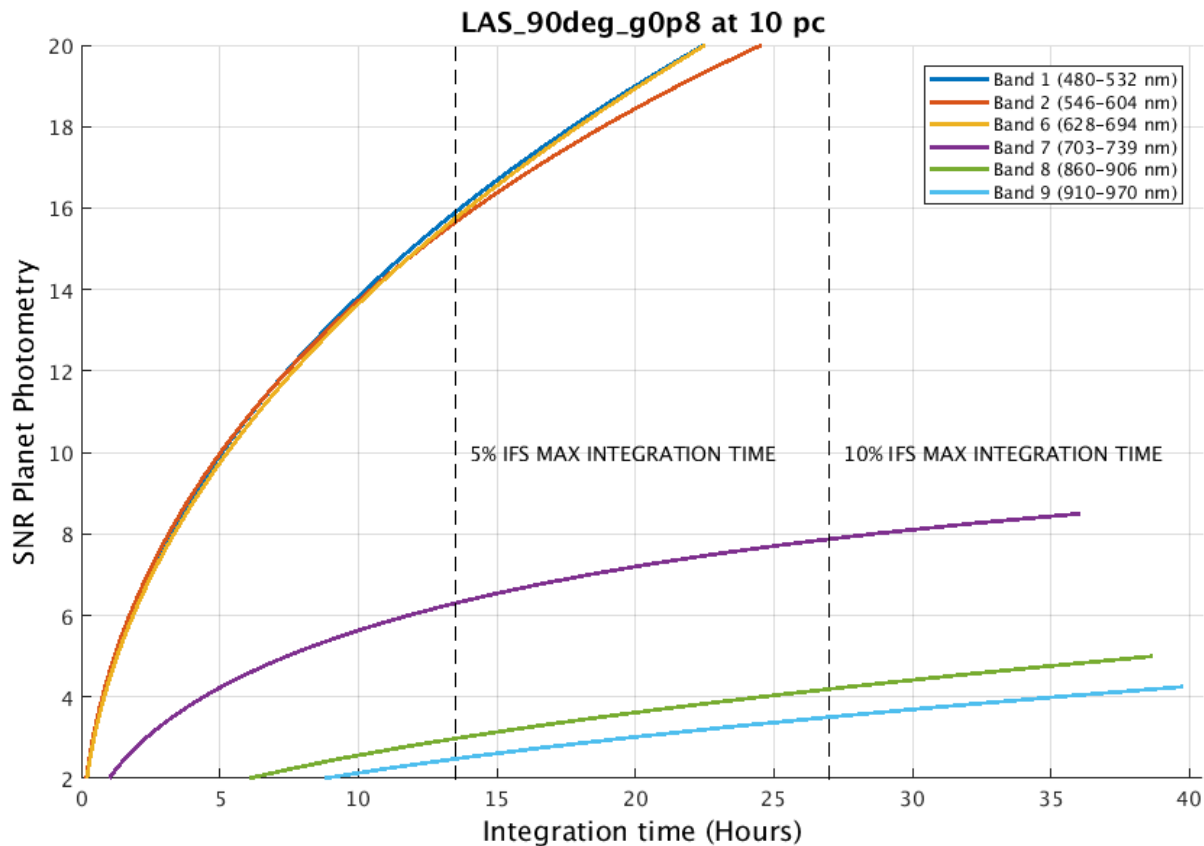
Over integration time limit  
(10 hours for display only)



# Exoplanet Data Challenge: Cycle 2

## Simulated data

Focus on a system at 10 pc (same assumption as in the IFS simulation)



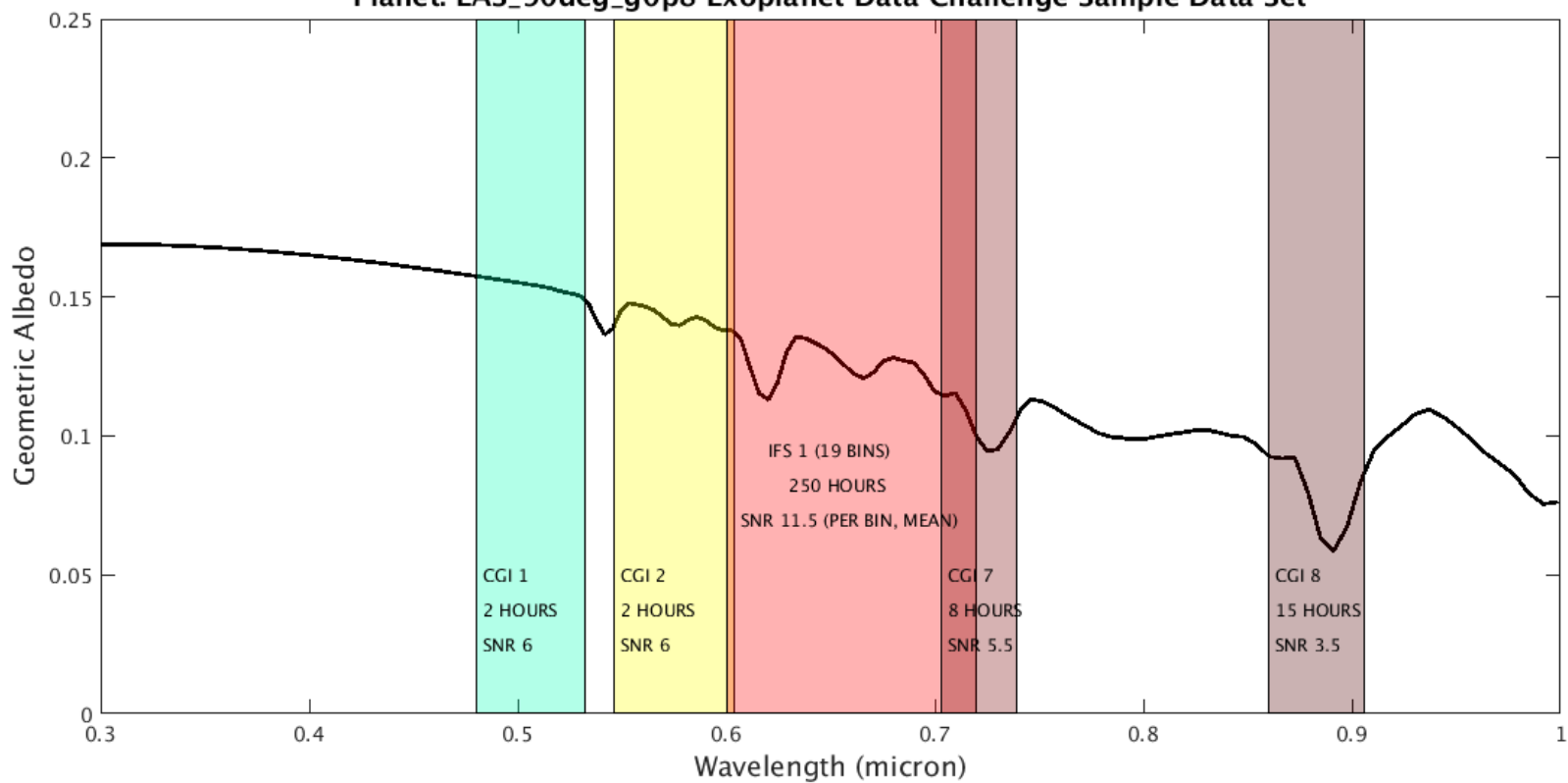


# Exoplanet Data Challenge: Cycle 2

## Simulated data

Star G0V, Absolute Magnitude=4.83, Distance=10 pc, Planet Radius=Jupiter Radius, Planet Mass=Jupiter mass

Planet: LAS\_90deg\_g0p8 Exoplanet Data Challenge Sample Data Set



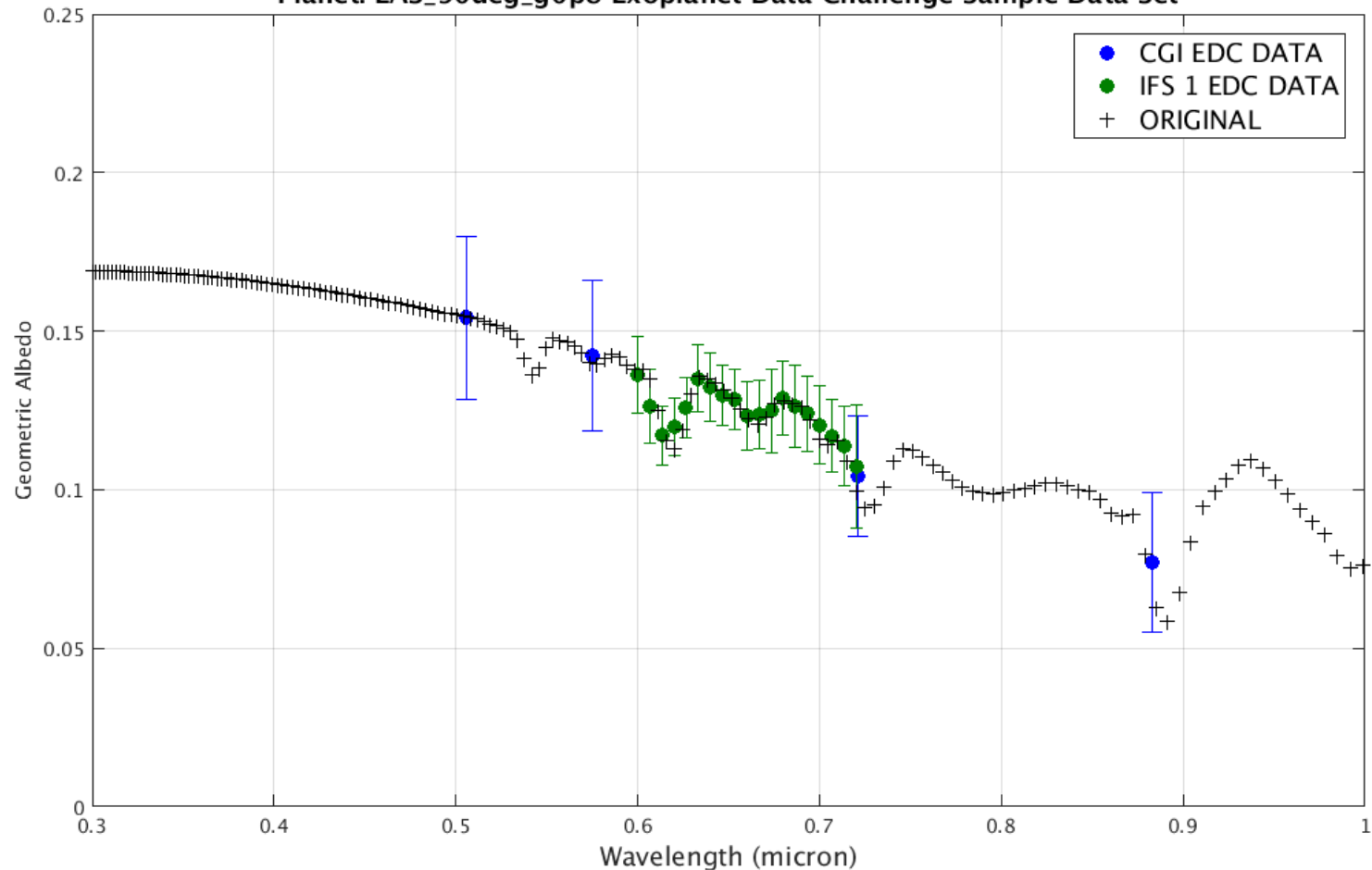


# Exoplanet Data Challenge: Cycle 2

## Sample of simulated data to be delivered for blind analysis of atmospheric retrieval

Star G0V, Absolute Magnitude=4.83, Distance=10 pc, Planet Radius=Jupiter Radius, Planet Mass=Jupiter mass

Planet: LAS\_90deg\_g0p8 Exoplanet Data Challenge Sample Data Set



# Thank you!



Pat Irwin  
JoAnn Eberhardt  
Ryan Garland



Larry Sromovsky  
Pat Fry



David Ciardi  
Davy Kirkpatrick



**Jet Propulsion Laboratory**  
California Institute of Technology

Renyu Hu  
Sergi Hildebrandt  
Stuart Shaklan



**NORTHERN  
ARIZONA  
UNIVERSITY**

Tyler Robinson



**SETI INSTITUTE**

Margaret Turnbull (PI)



**UNIVERSITY of  
WASHINGTON**

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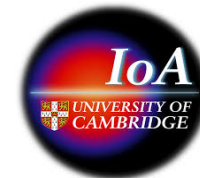
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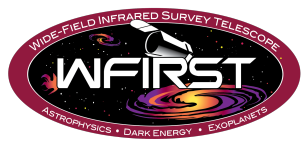
Maggie ([turnbull.maggie@gmail.com](mailto:turnbull.maggie@gmail.com)), Sergi ([srh.jpl.caltech@gmail.com](mailto:srh.jpl.caltech@gmail.com))





# Exoplanet Data Challenge

**BACKUP SLIDES**



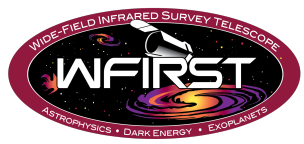
# Exoplanet Data Challenge

WFIRST-Coronagraph Exoplanets Data Challenge : Sheet1												
	A	B	C	D	E	F	G	H	I	J	K	L
1	System Parameters Provided to Retrieval Teams											
2	Target	HIP#	Age (Gyr)	Distance (pc)	Planet Mass (Mj or Me)	Physical separation (AU) (=semi-major axis?)	Angular separation from star (")	Planet eccentricity	Planet Phase Angle	Stellar Radius (Rsun)	Teff (K)	Bolometric Stellar Luminosity (Lsun)
3	HD 150706 b	80902	3	28.22	2.5Mj	6.7	0.24	0.38	90	1.01	5903	1.11
4	Ups And e	7513	3.12	13.47	1.6Mj	5.25	0.39	0.005	90	1.64	6213	3.64
5	HD 192310 c	99825	9.3	8.91	0.08Mj	1.18	0.13	0.32	90	0.42	5080	0.42
6	tau Ceti - disco	8102	5.8	3.65	2Me	0.72	0.20	0	90	0.83	5283	0.52
7	tau Ceti - disco	8102	5.8	3.65	1.5Me	0.72	0.20	0	90	0.83	5283	0.52

Cycle 1 created simulated data for:

- 5 exoplanets: 2 hot giants, 1 super-Neptune and 2 Earth-like
- Different signal-to-noise ratios: SNR=5, 10 and 20
- Different resolving powers: R=20, 50 and 70

PS: SNR=10 and R=50 may now be the maximum values for WFIRST. Still results from the cases with R70 and/or SNR20 remain highly informative.



# Exoplanet Data Challenge

From the proposal:

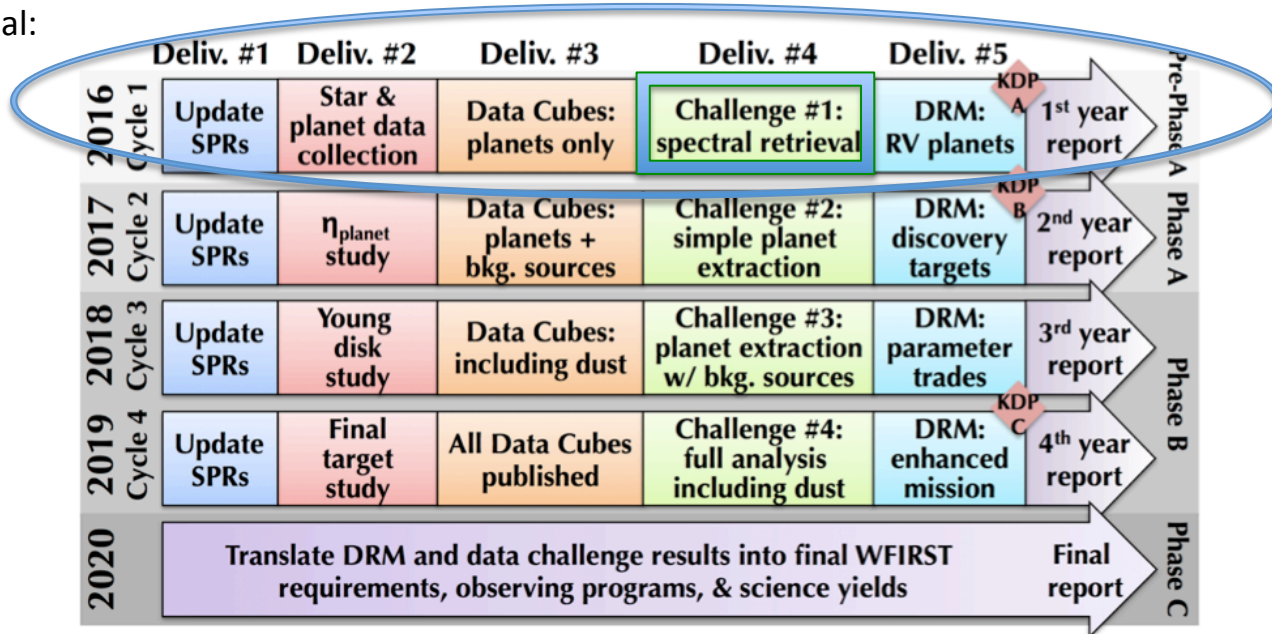
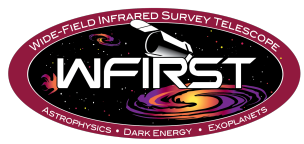


Figure 1.1: Plan for success of the WFIRST CGI. One full SIT Cycle occurs in each of Years 1–4. Scientific performance requirements (SPRs) tasks are shown in blue boxes (Deliverable #1; Section 2), target characterization in red (Deliverable #2; Section 3), data simulation in orange (Deliverable #3; Section 4), data analysis in green (Deliverable #4; Section 5), and design reference mission (DRM) tasks in aqua (Deliverable #5; Section 6).



# Exoplanet Data Challenge

## Next Cycle 2

### Targets Task List

#### Cycle 1

Collect orbital parameters and RV data for known giant planet targets. *[Kane]*

Use ExoCat to establish list of candidate stars for blind survey. *[Turnbull]*

Assemble list of interesting protoplanetary and debris disk targets. *[Jang-Condell]*

#### Cycle 2

Calculate occurrence rates for a range of planet types. *[Kane]*

Assess background contamination for all targets. *[Sparks]*

Coordinate blind survey and debris disk candidates with LBTI exozodi survey targets. *[Roberge / Hinz]*

#### Cycle 3

Construct models of protoplanetary disks including structures induced by forming planets. *[Jang-Condell]*

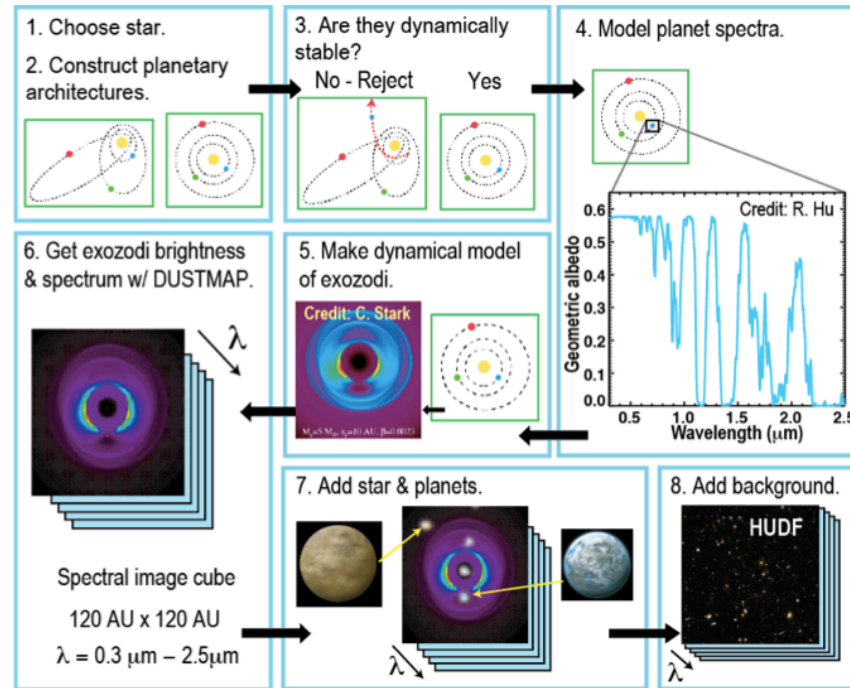


Figure 4.1: Creating a Haystacks spatial/spectral model of a whole planetary system. Each process step is described in the text. Credit: A. Roberge & the Haystacks team.

### Data Simulation Task List

#### Cycle 1

Release Haystacks Solar System models. *[Roberge]*

Make simple 1-D synthetic spectra of warm giant planets for CDC #1. *[Hu]*

Construct dust-free Haystacks models of known RV systems w/out background sources. Process w/ simplified instrument model for CDC #2. *[Roberge / Pueyo]*

#### Cycle 2

Construct dust-free Haystacks models of known RV systems w/ background sources. Process w/ project instrument model for CDC #3. *[Roberge / Shaklan]*

Calculate possible dust structures for known RV systems. *[Stark]*

Construct complete Haystacks models for known RV systems. *[Roberge]*

Construct dust-free Haystacks models of imagined planetary systems. *[Roberge / Kane]*

#### Cycle 3

Calculate dust structures for imagined systems. *[Stark]*

Construct complete Haystacks models for imagined systems. *[Roberge]*

Use full Haystacks and instrument models to simulate realistic datasets for CDC #4. *[Shaklan / McElwain]*



# Exoplanet Data Challenge

**Community Data Challenge #2:** Test post-processing and source extraction techniques with spectral image cubes containing only a star and planets, processed with a simple instrument model. This exercise is intended as practice to begin developing the techniques.

## Targets Task List

### Cycle 1

Collect orbital parameters and RV data for known giant planet targets. *[Kane]*

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### Cycle 3

Construct models of protoplanetary disks including structures induced by forming planets. *[Jang-Condell]*

Sergi & Maggie have put together a list of questions, suggestions and ideas for the next cycle 2:

[SHARED GOOGLE DOC](#)

- Specific set of simulated data to be delivered to the EDC participants.
- List of specific challenges that need to be resolved.
- What can realistically be done this year for a community challenge?

## Data Simulation Task List

### Cycle 1

Release Haystacks Solar System models. *[Roberge]*

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