Image: NASA SDO



# Ripples Beneath the Waves

Detecting transits of Earth-size planets in the presence of variability

Geert Jan Talens

Luca Malavolta, Leigh Smith, Eric Feigelson, Marco Montalto, Lionel Garcia, Suzanne Aigrain

Image: NASA SDO





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Detecting transits of Earth-size planets in the presence of variability



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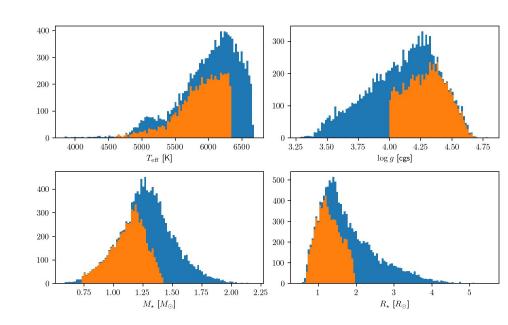
Luca Malavolta, Leigh Smith, Eric Feigelson, Marco Montalto, Lionel Garcia, Suzanne Aigrain

# Aim

Compare different lightcurve filter and transit search algorithms to provide recommendations for the EAS.

#### Simulations - Stars

- Selected from PIC 2.1 P1 + P2.
- Applied cuts:
  - $\circ$  log g > 4
  - $\circ$  4595 K < T<sub>eff</sub> < 6334 K
  - o V > 8
- Simulated 2000 stars.
- Using PSLS V1.8:
  - Poisson noise, systematics.
  - o Granulation, oscillations.
  - o Irregular quarter lengths.
  - o Quarter gaps, momentum gaps.
- Using pyspot:
  - Out-of-transit spot modulations.



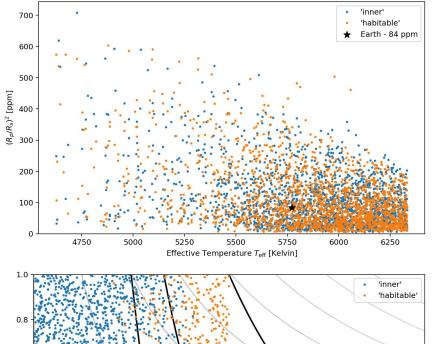
#### Simulations - Planets

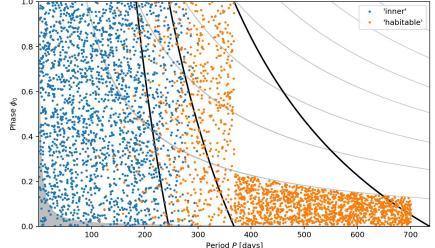
#### • 2 possible transit signals:

- 'inner': Period interior to the habitable zone.
- 'habitable': Period inside the habitable zone for MS stars. For evolved stars orbits may be interior to the HZ.

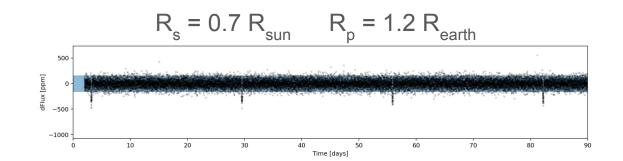
#### Transit parameters:

- $\circ~~0.5~{\rm R_e} < {\rm R_p} < 2.0~{\rm R_e}$  (uniform).
- T<sub>n</sub> constrained to prevent mono-transits.

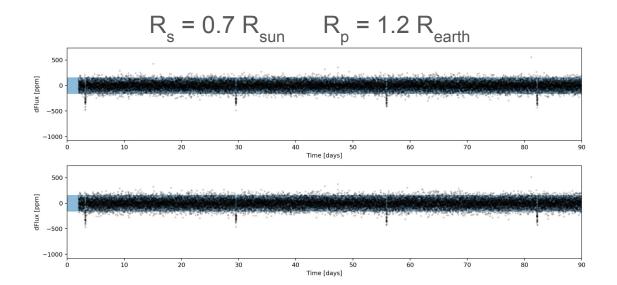




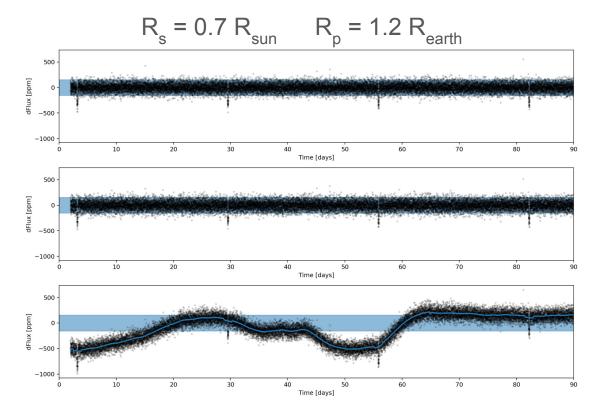
Transit + Noise



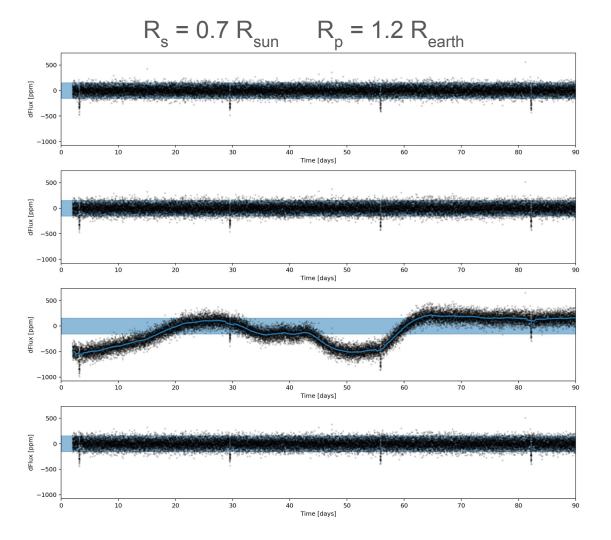
- Transit + Noise
- Granulation + Oscillations



- Transit + Noise
- Granulation + Oscillations
- Spots + Systematics



- Transit + Noise
- Granulation + Oscillations
- Spots + Systematics



### Lightcurve Filters

Biweight (wotan)

Huber spline (wotan\*)

Lowess (wotan\*)

YSD-Lowess (Battley et al. 2020)

- Custom implementation using wotan Lowess.

ARFIMA (Feigelson et al. 2018)

- Part of the AutoRegressive Planet Search (ARPS).

<sup>\*</sup>modified for stability

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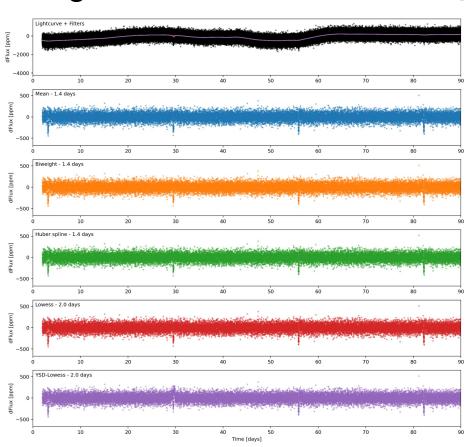
- Custom implementation using wotan Lowess.

#### ARFIMA (Feigelson et al. 2018)

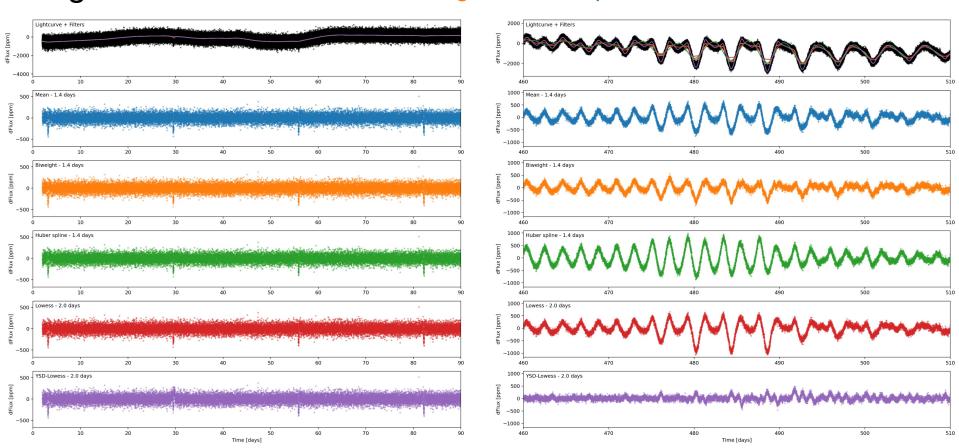
- Part of the AutoRegressive Planet Search (ARPS).
- Produces the filtered lightcurve derivative.

<sup>\*</sup>modified for stability

### Lightcurve Filters: Mean, Biweight, Huber spline, Lowess, YSD-Lowess



# Lightcurve Filters: Mean, Biweight, Huber spline, Lowess, YSD-Lowess



### Search Algorithms

Transit Least Squares (*Hippke et al. 2019*)

- Including some bug fixes.

CETRA (Smith et al. 2025)

- GPU implementation of TLS.
- EAS default.

Warped Least Squares

- Custom implementation of TLS.
- Uses filter-modified transit shapes.

TCF (Caceres et al. 2019)

- Part of the AutoRegressive Planet Search (ARPS).
- Searches the filtered lightcurve derivative.

nuance (Garcia et al. 2024)

- Uses simultaneous GP for the filter.

### Search Algorithms

Transit Least Squares (*Hippke et al. 2019*)

- Including some bug fixes.

#### CETRA (Smith et al. 2025)

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#### **Warped Least Squares**

- Custom implementation of TLS.
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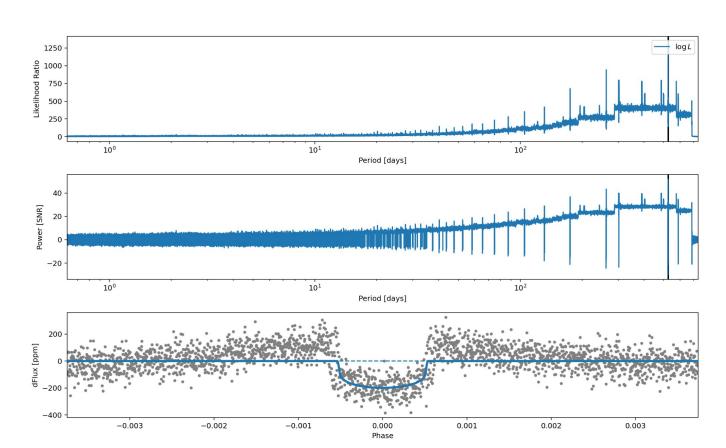
#### TCF (Caceres et al. 2019)

- Part of the AutoRegressive Planet Search (ARPS).
- Searches the filtered lightcurve derivative.

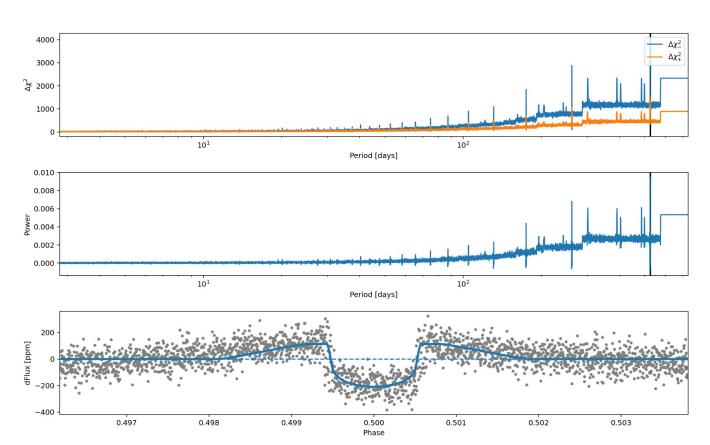
#### nuance (Garcia et al. 2024)

- Uses simultaneous GP for the filter.

### **CETRA**



# Warped Least Squares



### **ARPS**

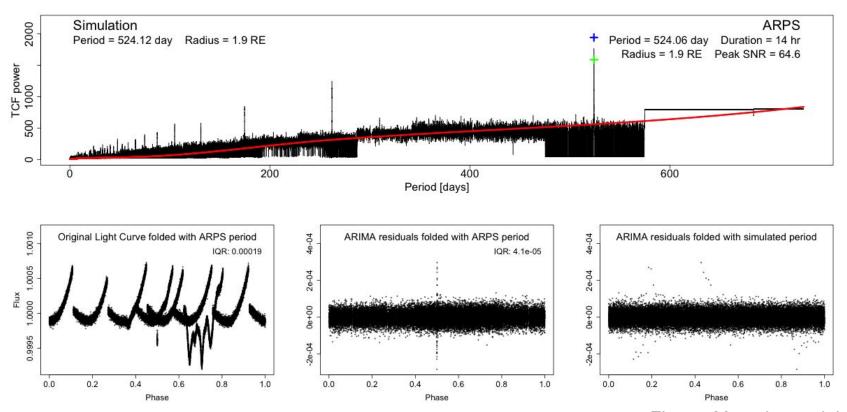


Figure: Montalto et al. in prep.

## What I call a recovery

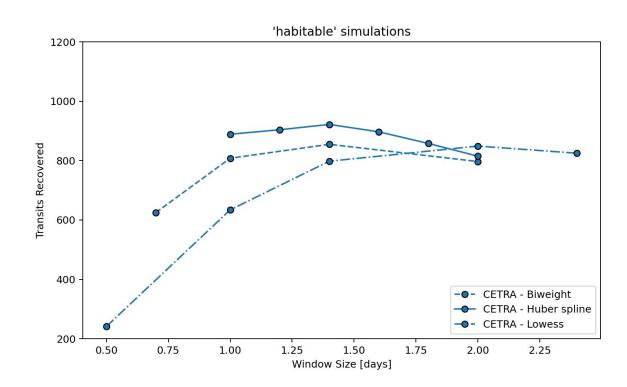
#### Periodic matches:

- $\circ$  (P P<sub>rec</sub>) x N<sub>tr</sub> < 0.5 x T<sub>14</sub>
- $\circ$  (P 0.5 x P<sub>rec</sub>) x N<sub>tr</sub> < 0.5 x T<sub>14</sub>
- $\circ$  (P 2.0 x P<sub>rec</sub>) x N<sub>tr</sub> < 0.5 x T<sub>14</sub>
- $\circ$  (P 3.0 x P<sub>rec</sub>) x N<sub>tr</sub> < 0.5 x T<sub>14</sub>

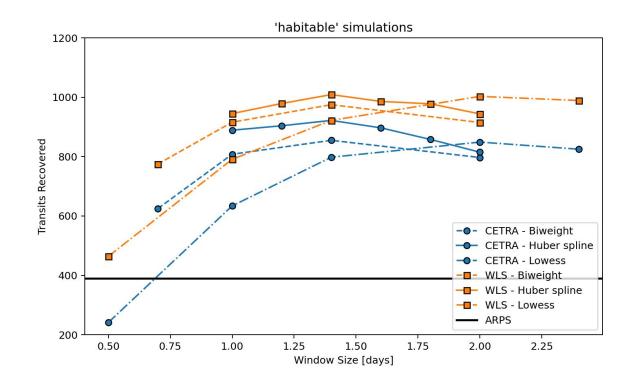
#### Non-periodic matches:

- $\circ$  N<sub>tr</sub> = 1, (T<sub>0</sub> T<sub>rec</sub>) < 0.5 x T<sub>14</sub>
- $\circ$  N<sub>tr</sub> = 2, (T<sub>0</sub> T<sub>rec</sub>) < 0.5 x T<sub>14</sub>
- $\circ$  N<sub>tr</sub> = 2, (T<sub>0</sub> + P T<sub>rec</sub>) < 0.5 x T<sub>14</sub>

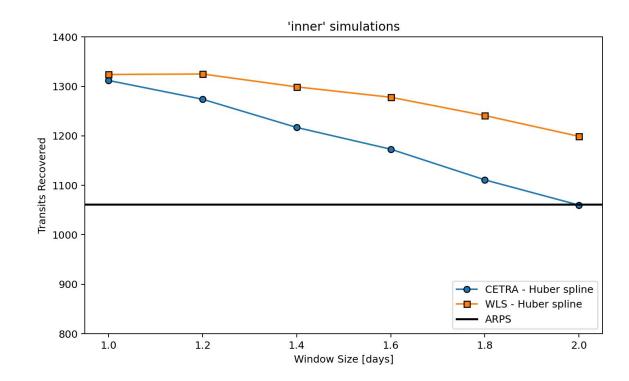
Huber spline



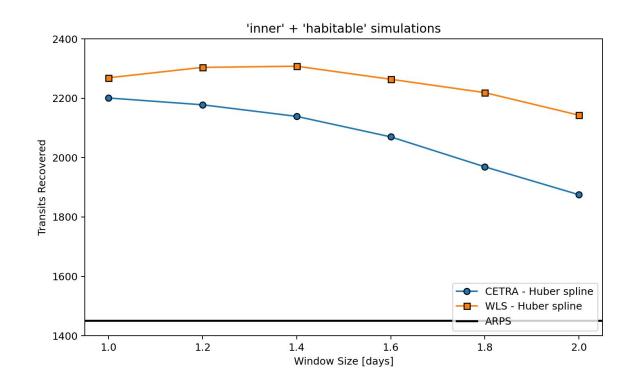
- Huber spline
- Warped models



- Huber spline
- Warped models
- Test shorter windows



- Huber spline
- Warped models
- Test shorter windows
- Window size unclear



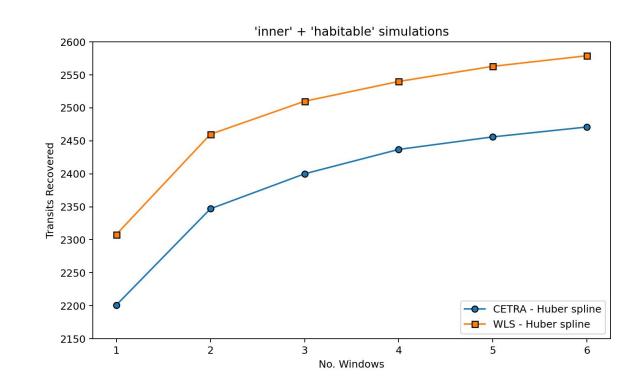
#### Best single window:

#### **CETRA**

- 1.0 day
- 2201 of 4000 signals

#### **WLS**

- 1.4 day
- 2308 of 4000 signals



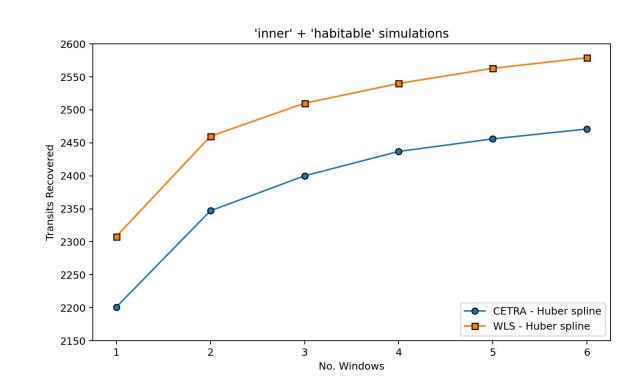
#### Best three windows:

#### CETRA

- 1.0, 1.4, 1.8 days
- 2400 of 4000 signals

#### **WLS**

- 1.0, 1.4, 1.8 day
- 2510 of 4000 signals



### Next steps

- Run/analyse additional filters.
- Comparison with nuance.
- Test the effect of binning.
- Investigate the effect of SDE/SNR cuts.
- Tests with high impact parameter searches.

#### Conclusions

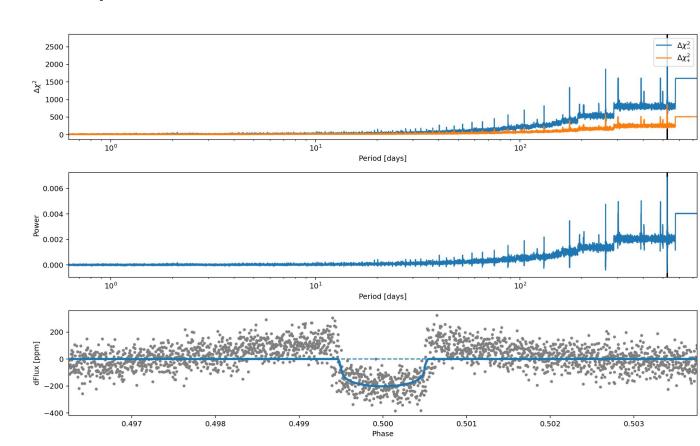
- The best filter to use (so far) is a **Huber spline**.
  - The optimal window may be dependent on the algorithm.
  - Combining filters sees meaningful gains in recovered signals.
- Warping the transit signal to match the filter sees significant gains.
  - Ongoing work to implement and test this in CETRA.
- Transit depth drives missed signals, followed by impact parameter.
  - Only 50-60% of 'habitable' sample is recovered.
  - Around 70% of 'inner' signals are recovered.

# Bonus Slides

# (Un)Warped Least Squares

882 of 'habitable' transits recovered.

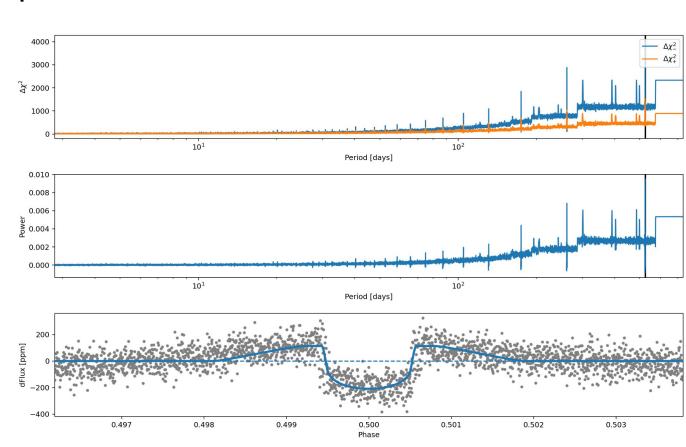
**CETRA: 922** 

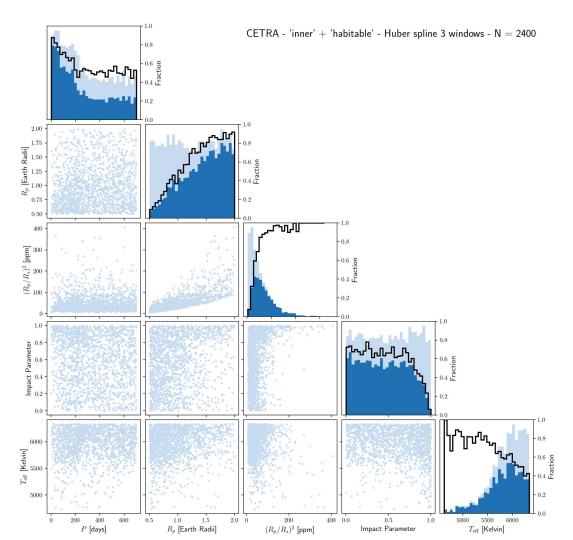


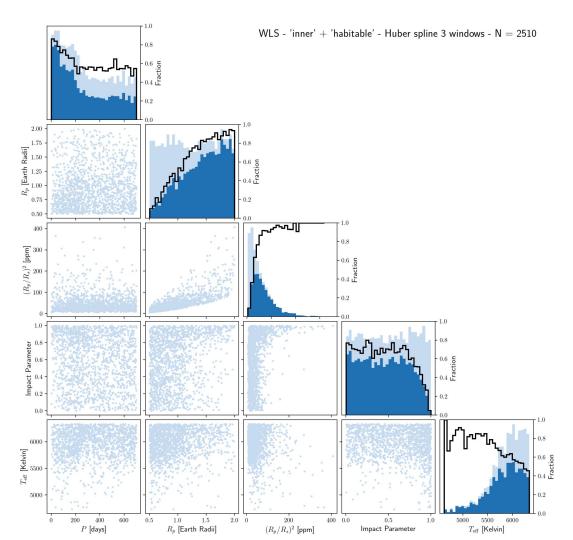
## Warped Least Squares

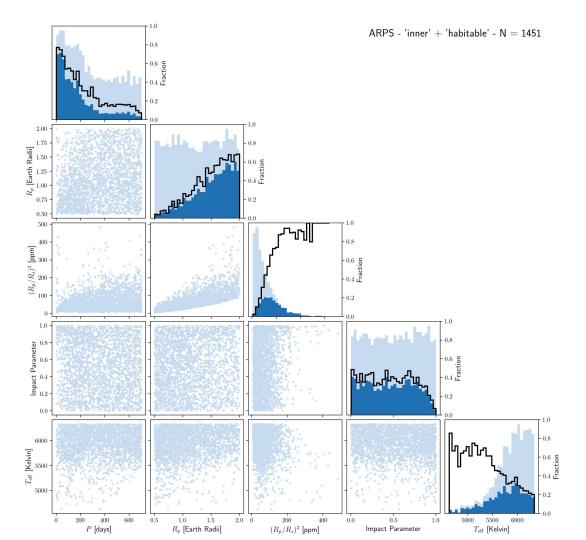
1009 of 'habitable' transits recovered.

**CETRA: 922** 









### **WLS Power**

GLS, BLS/TLS (+ empirical scaling)

$$\Delta \chi(P) = \chi_0 - \chi(P)$$

$$\mathbf{P} = \Delta \chi(\mathsf{P})/\chi_0$$

WLS

$$\Delta \chi(P) = \chi_{+}(P) - \chi_{-}(P)$$

$$\mathbf{P} = \Delta \chi(\mathsf{P})/\chi_{+}(\mathsf{P})$$

# Search speed

