

# How Do We Get Astrometric Measurements? (+ a little about spectra).

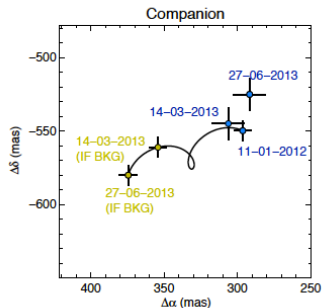
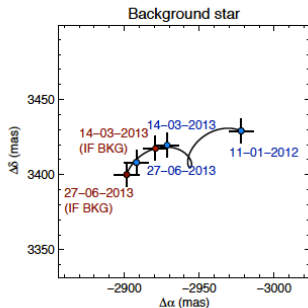
Laurent Pueyo, Space Telescope Science Institute

Sagan summer workshop 2014

July 23, 2014

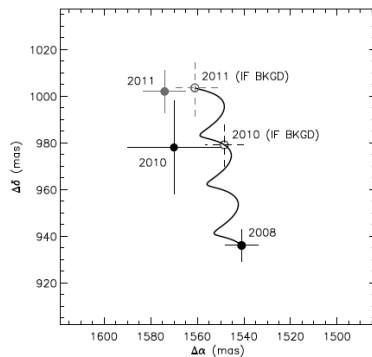
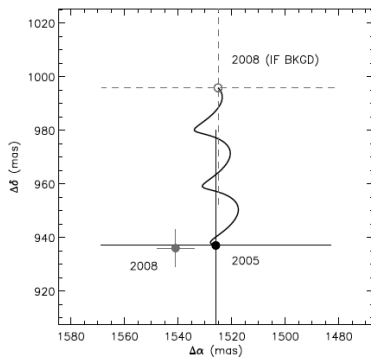
# Astrometry to confirm candidates

Combine proper motion and parallactic motion to establish physical association. Rameau et al. (2013), Mawet et al. (2012)



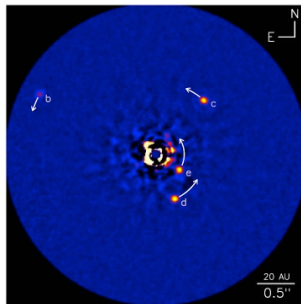
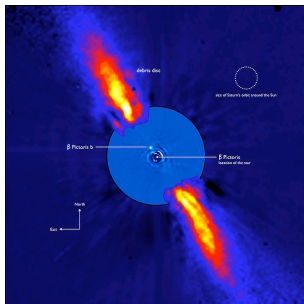
# Astrometry to confirm candidates

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# Limitation of direct imaging: uncertainty in the mass luminosity relationship

Lagrange et al. (2010), Marois et al. (2009)

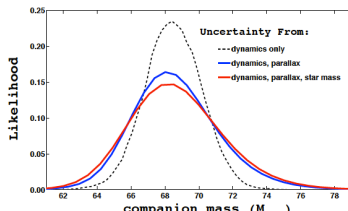
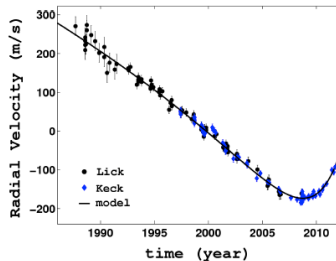
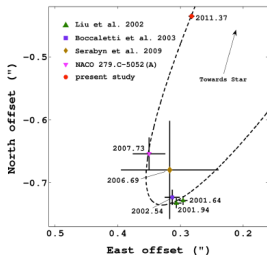
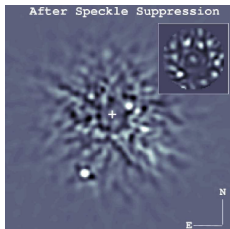


## Direct imaging does not measure the dynamical mass

- Mass can be inferred based on the estimated age of the star and evolutionary tracks at young ages.
- Orbital motion is necessary to measure the true dynamical mass.
- **Large separation = Long temporal baselines are required in order to constrain orbital motion...or small error bars!**

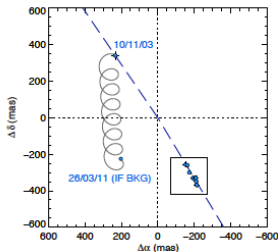
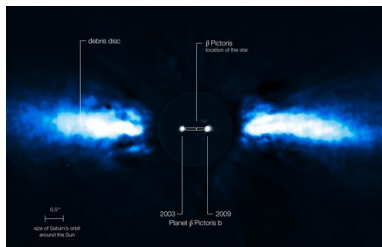
# Planet-Star gravitational interaction

Find a object around a star that has been monitored for over 20 years with Radial velocity.

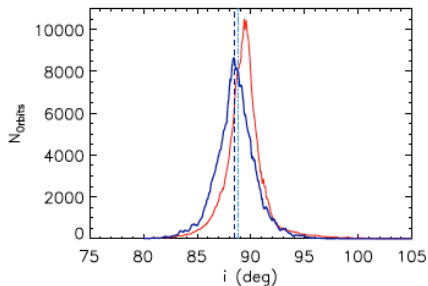


# Planet-Disk gravitational interaction

Find a planet around a star with a disk that has been monitored for over 20 years with direct imaging.



Chauvin et al. (2012), Macintosh et al. (2014)

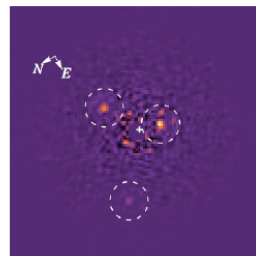
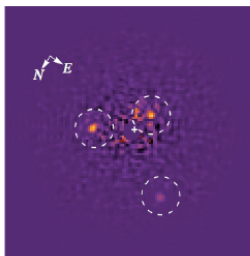
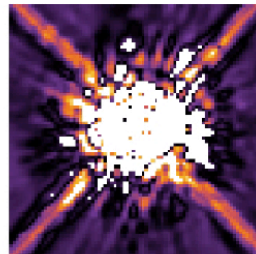
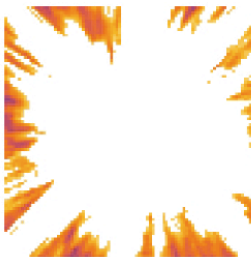
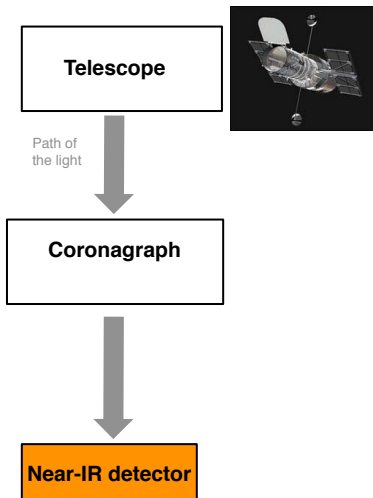


- Strong constraint on the orbital inclination of Beta Pictoris b.
- Dynamical mass bound from RV.

# Planet-Planet gravitational interaction

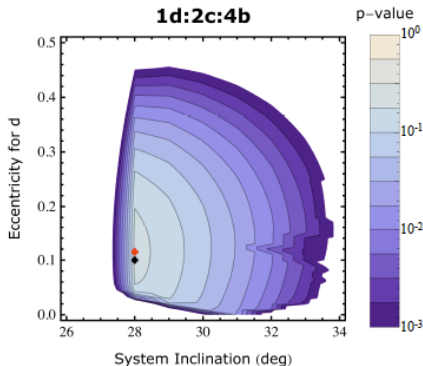
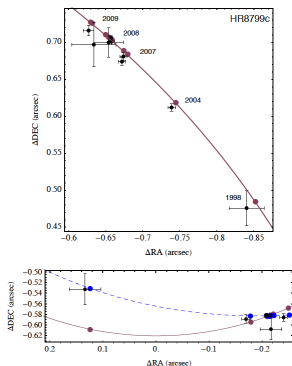
Observe orbital motion in a multiple planetary system.

1998 observations of HR8799



# Orbital motion and dynamical mass

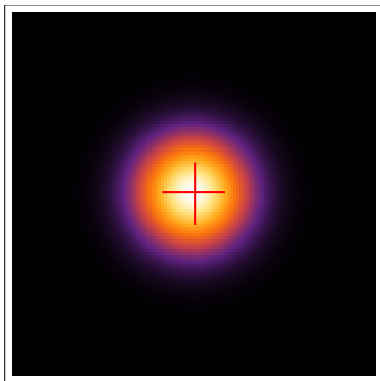
Soummer et al. (2011)



## Upper bound for dynamical mass

Esposito et al. (2012): dynamical analysis which including HR8799e. In order for the system to be stable at for at least as long as the estimated age of the primary: mass upper limit  $\sim 5 M_{Jup}$ .

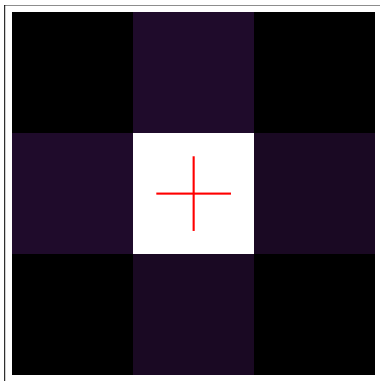
# Challenges of astrometry in the presence of speckles



1 pixel  $\sim$  70 mas.

- Reduction corrupts the signal at the pixel level and biases the astrometry.
- This is critical for orbital motion.
- Once can refine the geometric parametrization of LOCI to find the least biased reduction.
- The error is then the distribution of bias over  $\sim 10^5$  reductions of PSFs with synthetic planets.

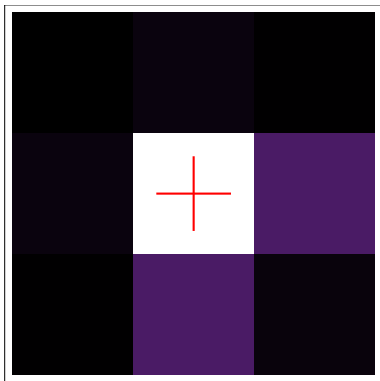
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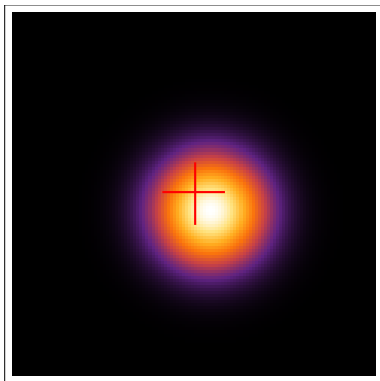
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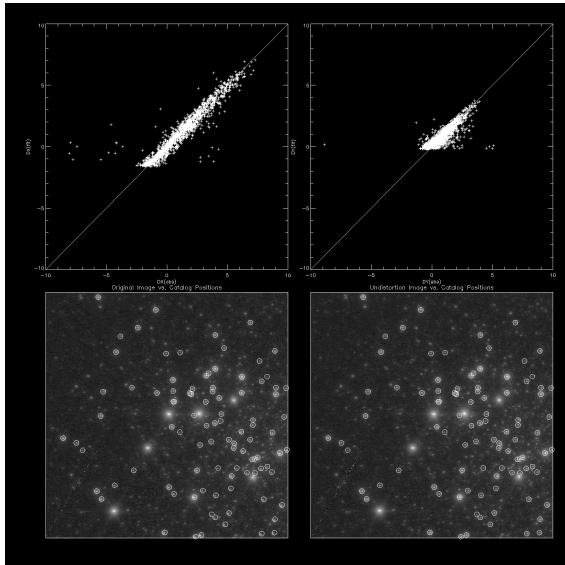


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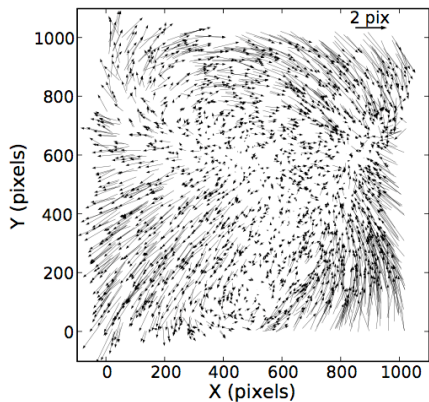
# Distortion

Yelda et al. (2010), Konopacky et al. (2014)



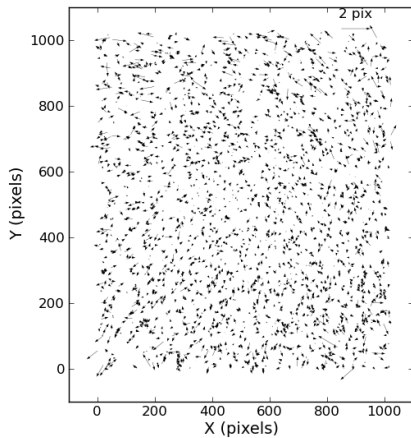
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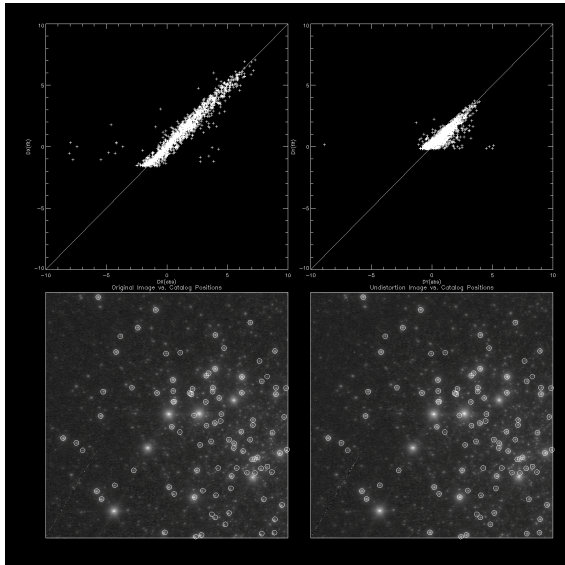
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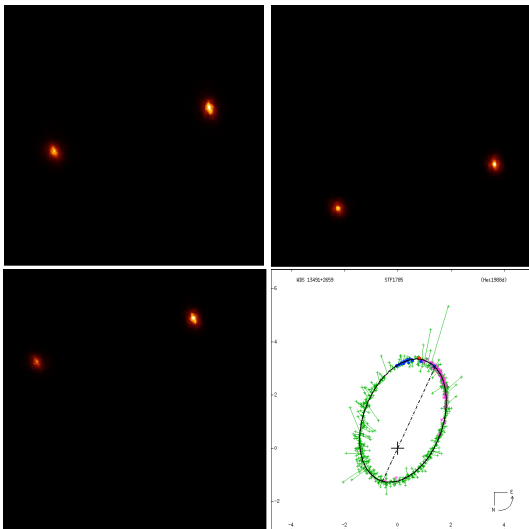
Yelda et al. (2010), Konopacky et al. (2014)



# Plate Scale and PA offset

Observe binaries with either:

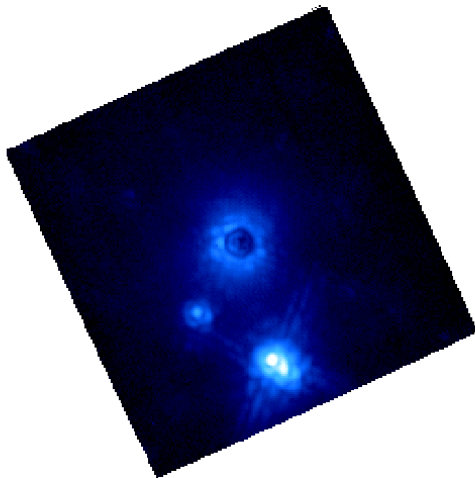
- Well constrained orbital elements.
- Simultaneous epochs obtained with a well calibrated instrument.



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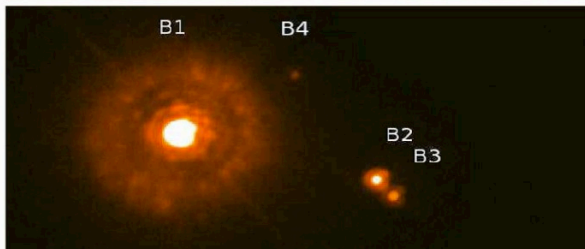
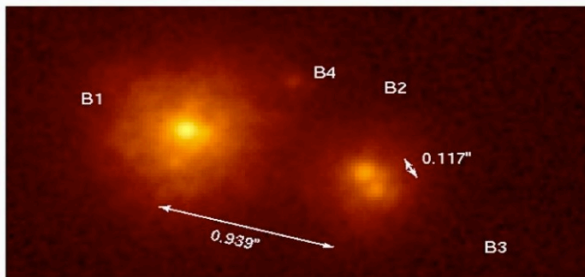
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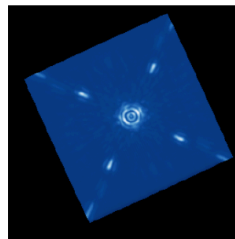
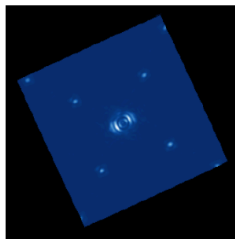
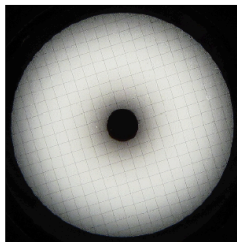
Observe binaries with either:

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# Raw data

## Step 1a: Image registration, with nice satellite spots.



### Algorithm

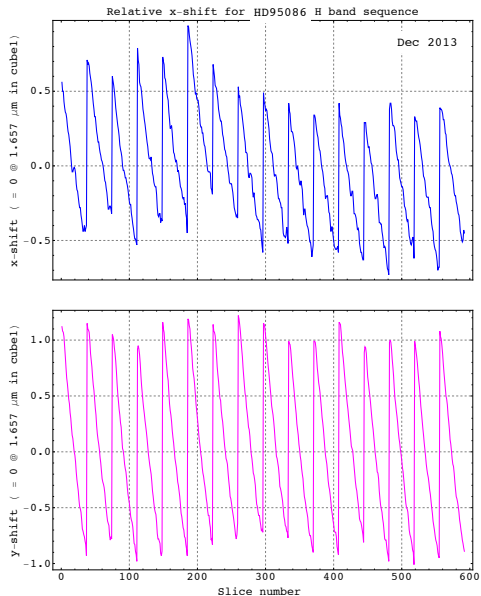
- Find the location of each spot in each slice.
- Fit each spot to a model in order to retrieve its location and its brightness.
- From the location of the four spots derive the scaling law and the stellar location in each slice.
- Shift and rescale each image.

## Step 1b: Image registration, with crummy satellite spots.

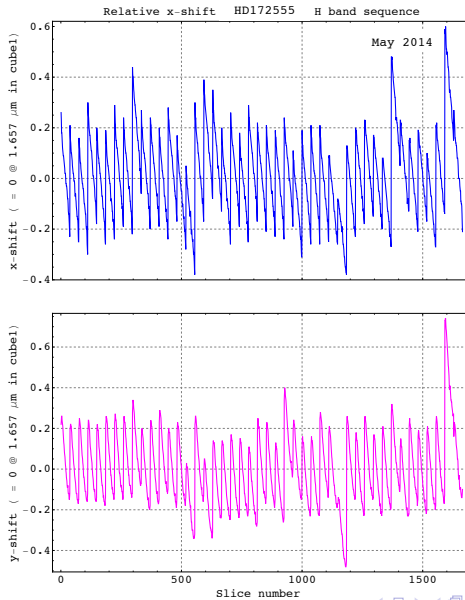
### Algorithm

- Pick a reference slice.
- Fourier transform each slice and vary the scale of the  $u$ - $v$  plane (zero padding if FFT,  $u$ - $v$  sampling if MFT).
- For each slice find the  $u$ - $v$  plane scaling that maximizes the cross correlation between the *modulus* of the Fourier transformed images. This decouples the problem of calculating relative scaling and centering.
- Stretch/squash all slices at the wavelength of interest.
- Use a MFT based sub-pixel image registration algorithm (Guizar and Fienup 2009).

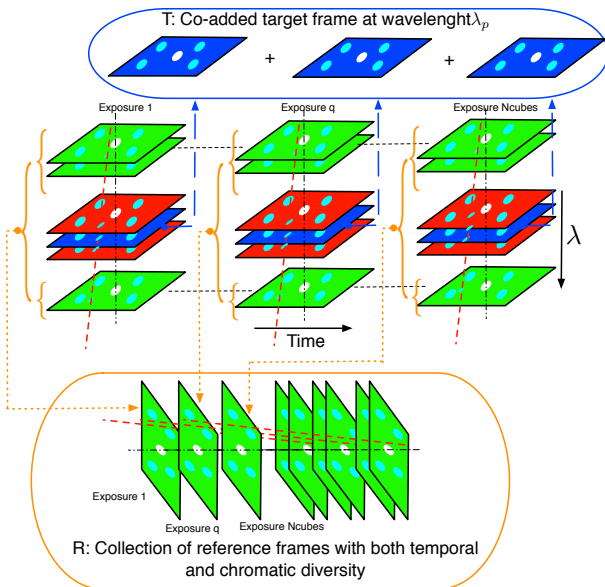
# Step 1: Image registration, typical results



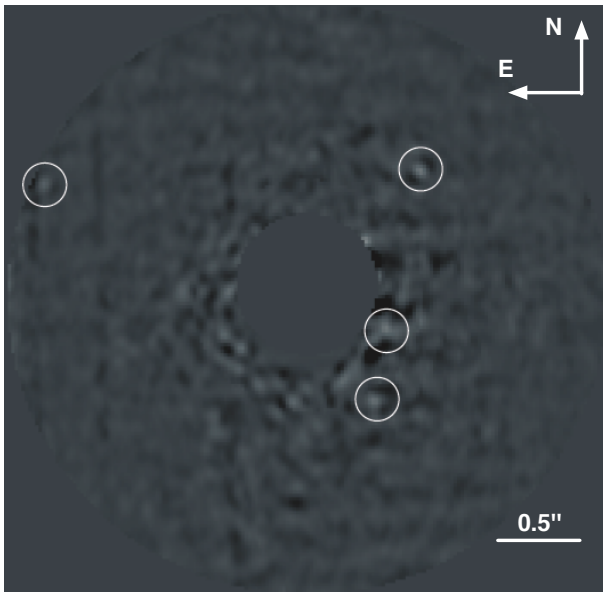
# Step 1: Image registration, typical results



## Step 2: partition the image in zones and apply your favorite algorithm.



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## Step 3: estimate the location of the planets in detector coordinate and their flux.

### Multiple solutions for the problem of signal recovery

- Solution 1: inject fakes sources.
- Solution 2: inject a “negative fake” in the raw data.
- Solution 3: perturbation methods.
- Solution 4: use priors on spectrum to select references.
- Solution 5: hope that the companion flux is in the high order PCA modes.
- Solution 6: ask a different PCA question.

**For the detection problem there is a magic recipe: pick your favorite algorithm and tweak the parameters until your false positive and/or your false negative probabilities are low enough**

**For the characterization problem there no magic recipe yet: for each problem there is a preferred solution. During the hand on session try to make your own opinion about where the trade offs are.**

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- **Solution 5: hope that the companion flux is in the high order PCA modes.... or something else.**
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**For the characterization problem there no magic recipe yet: for each problem there is a preferred solution. During the hand on session try to make your own opinion about where the trade offs are.**

## Step 3 [PCA only]: planet pixel coordinates and flux

Calibrated image calculated using a projection on the Principal Components.

$$F(n) = \left( I_{\psi_0}(n) - \sum_{k=1}^{K_{klip}} \langle I_{\psi_0}, Z_k^{KL} \rangle_{\mathcal{J}} Z_k^{KL}(n) \right) + \varepsilon \left( A(n) - \sum_{k=1}^{K_{klip}} \langle A, Z_k^{KL} \rangle_{\mathcal{J}} Z_k^{KL}(n) \right)$$

Pueyo et al. (2014)

## Step 3 [PCA only]: planet pixel coordinates and flux

We find the location  $\vec{n}_0$  and brightness  $\beta$  of the planet using forward modeling.  
We minimize:

$$\min_{(\vec{n}_0, \beta)} \left\{ \sum_{n=1}^{N_{\mathcal{J}}} \left( F(\vec{n}) - \beta [A(\vec{n} - \vec{n}_0)] + \sum_{k=1}^{K_{klip}} \langle A(\vec{n} - \vec{n}_0), Z_k^{KL}(\vec{n}) \rangle_{\mathcal{J}} Z_k^{KL}(\vec{n}) \right)^2 \right\}.$$

Pueyo et al. (2014)

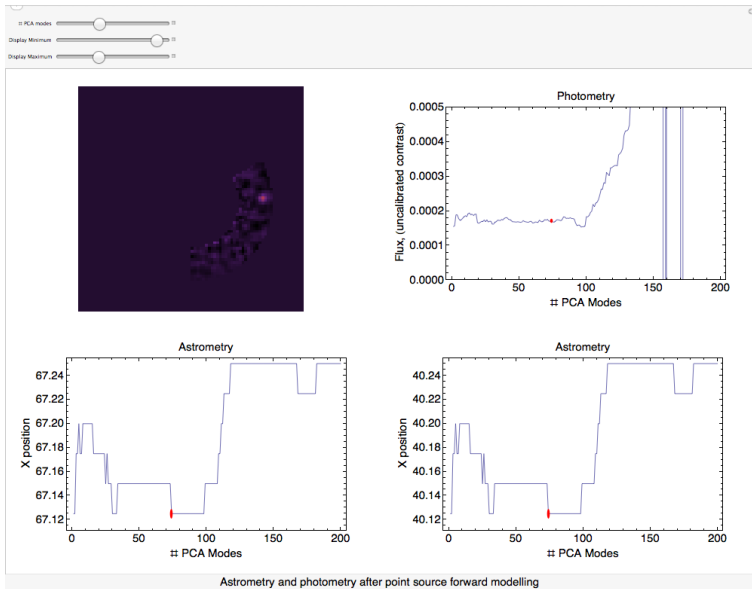
## Step 3 [PCA only]: planet pixel coordinates and flux

Provided that the statistics of the noise *after* PSF subtraction is gaussian and zero mean then the unbiased astrometry and photometry are given by:

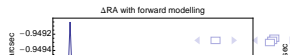
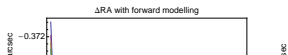
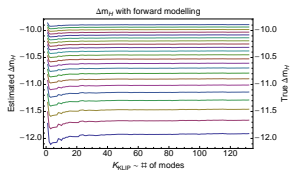
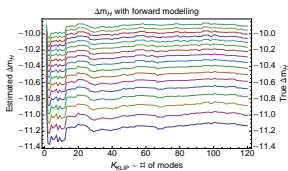
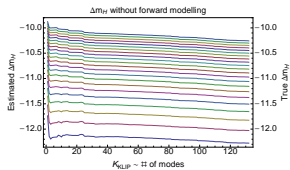
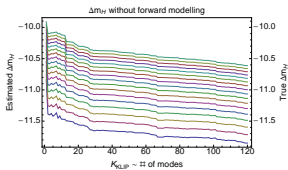
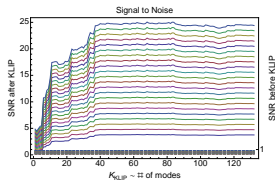
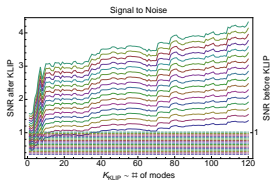
$$\begin{aligned}
 \overrightarrow{n_{Astro}} &= \arg \max_{(\overrightarrow{n_0})} \{ C(\overrightarrow{n_0}) \} = \arg \max_{(\overrightarrow{n_0})} \left\{ \langle F(\overrightarrow{n}), A(\overrightarrow{n} - \overrightarrow{n_0}) \rangle_{\mathcal{J}} \right. \\
 &\quad \left. - \sum_{k=1}^{K_{klip}} \langle A(\overrightarrow{n} - \overrightarrow{n_0}), Z_k^{KL}(\overrightarrow{n}) \rangle_{\mathcal{J}} \langle F(\overrightarrow{n}), Z_k^{KL}(\overrightarrow{n}) \rangle_{\mathcal{J}} \right\} \\
 \beta_{Photo} &= \frac{C(\overrightarrow{n_{Astro}})}{\|A(\overrightarrow{n} - \overrightarrow{n_{Astro}})\|_{\mathcal{J}}^2 - \sum_{k=1}^{K_{klip}} \langle A(\overrightarrow{n} - \overrightarrow{n_0}), Z_k^{KL}(\overrightarrow{n}) \rangle_{\mathcal{J}}^2}
 \end{aligned}$$

Pueyo et al. (2014)

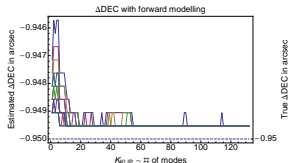
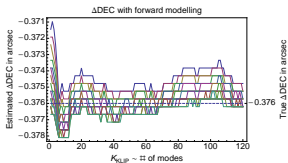
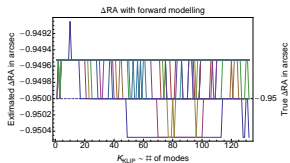
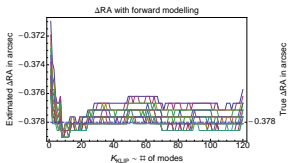
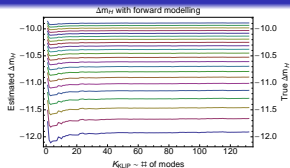
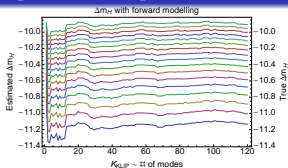
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**This is only true when there is no signal from the companion in the reference library. NOT ALWAYS TRUE with IFU data!**



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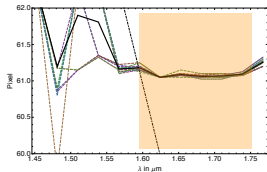
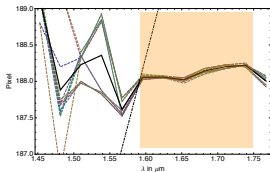
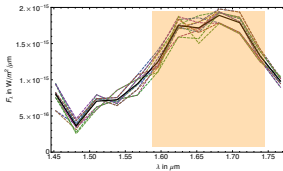
Reduction for an ensemble of zone geometries and exclusion parameters.

We use the planet location as a function of wavelength and the planet flux as a function of PCA modes to test the validity of the gaussianity and companion free hypothesis for each configuration.

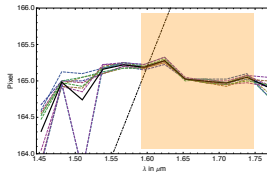
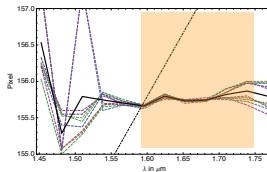
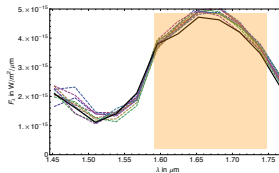
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Reduction for an ensemble of zone geometries and exclusion parameters.

HR9799b



HR9799c



## Step 3 [PCA only]: planet pixel coordinates and flux.

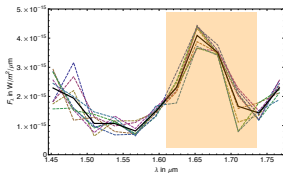
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We use the planet location as a function of wavelength and the planet flux as a function of PCA modes to test the validity of the gaussianity and companion free hypothesis for each configuration.

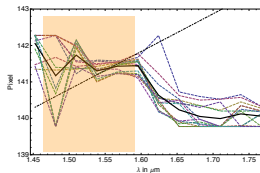
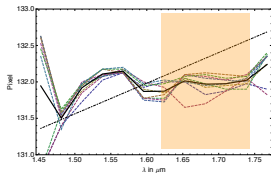
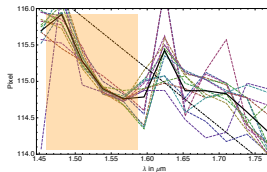
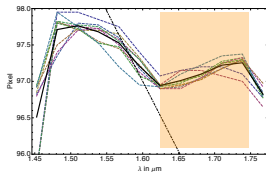
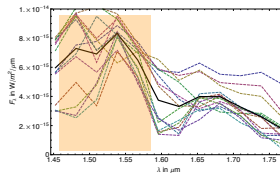
# Step 3 [PCA only]: planet pixel coordinates and flux.

Reduction for an ensemble of zone geometries and exclusion parameters.

HR9799d



HR9799e



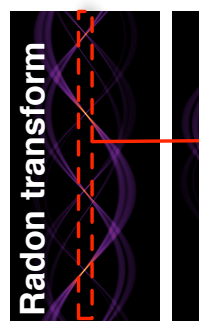
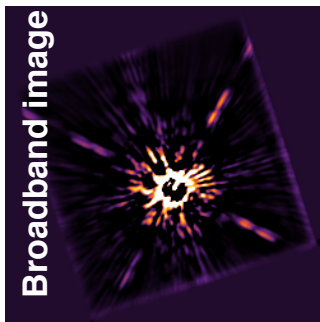
## Step 4: stellar location.

### Optional step

- When the satellite spots feature no asymmetries and are high SNR then the location of the star is known from the image registration step.
- When the satellite spots are “crummy”, or gone, then the image registration step only yield relative alignment.
- When looking at broadband images, the satellite spots are elongated, then the image registration step only yield relative alignment.

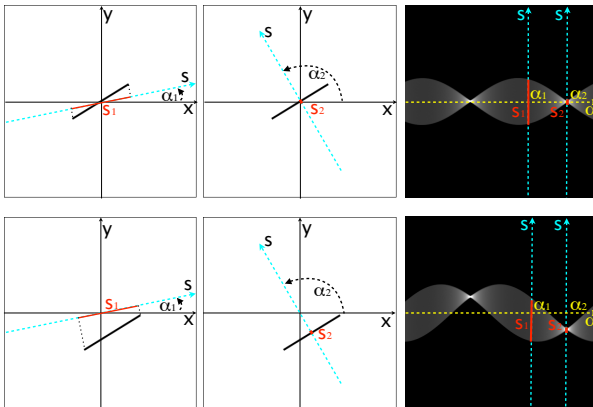
## Step 4: stellar location.

We use a Radon transform of broadband images.



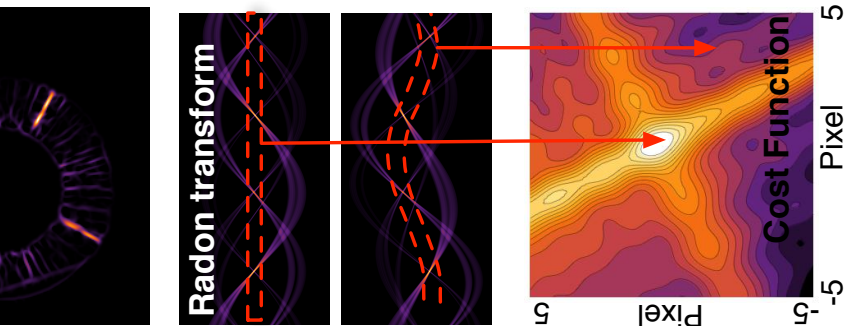
## Step 4: stellar location.

We use a Radon transform of broadband images.



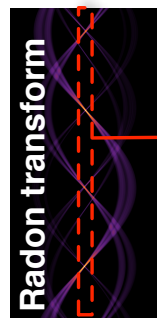
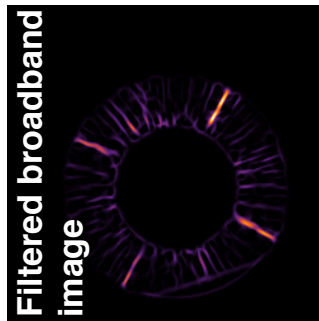
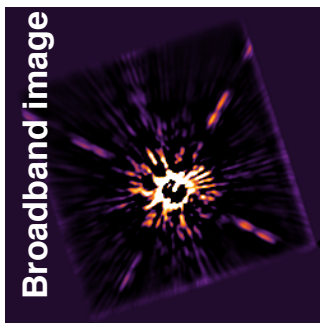
## Step 4: stellar location.

We use a Radon transform of broadband images.



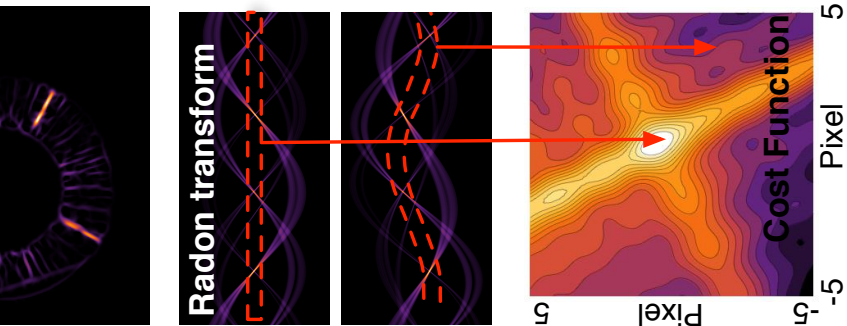
## Step 4: stellar location.

We use a Radon transform of broadband images.



## Step 4: stellar location.

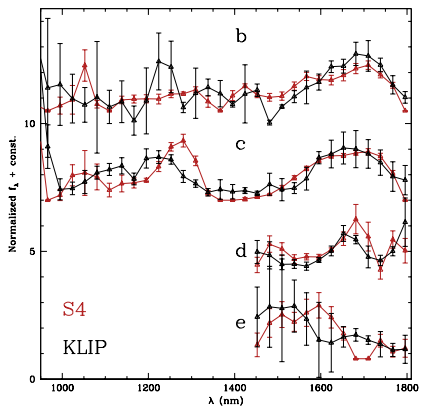
We use a Radon transform of broadband images.



## Spectrum with an IFU

While spectro-photometry is what makes directly imaged exo-planets most interesting, astrometry is essential to their full characterization.

**Spectro-photometry and Astrometry ought to be estimated jointly when using IFU data. (when possible)**



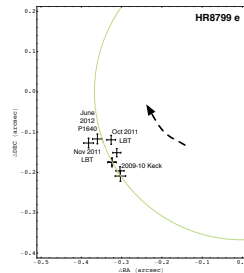
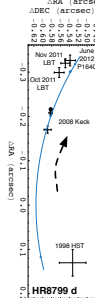
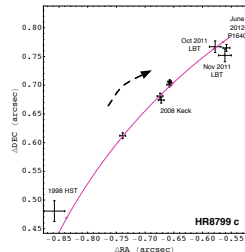
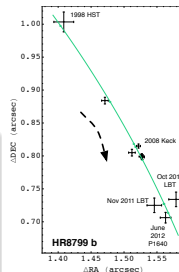
# Putting the astrometry together

## Recap

- Distortion was measured and included in at the data cube level.
- We have estimated the relative location of the planet wrt star.
- We know the plate scale and the PA offset.

We have all we need to get astrometric estimates and uncertainties.

**Next step: fit orbits**



Full lines are best fits for face-on circular orbits

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