

Spectroscopic binary processing within Gaia DPAC Paris 10-12/10/2011

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(with contributions from P. Geurts & L. Delchambre)**

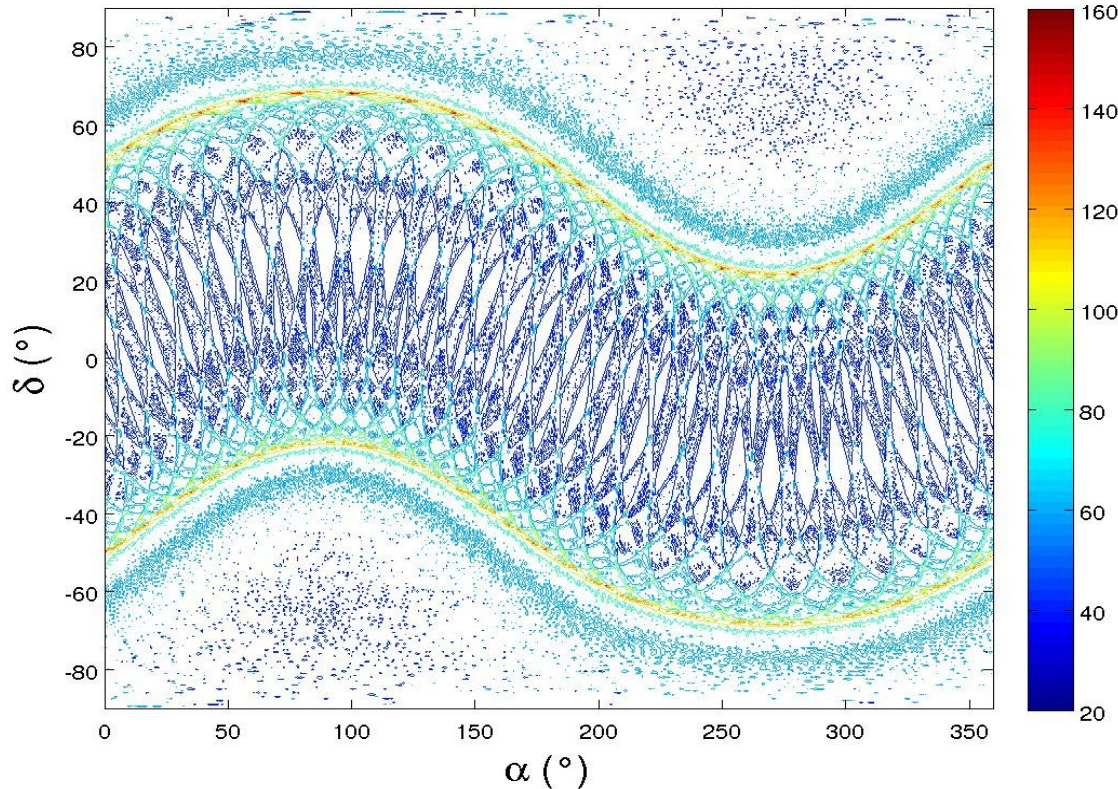
Plan

- DU434 work package as part of Gaia DPAC / CU4.
- Algorithms used in DU434.
- Performances of the implemented algorithms.
- Current development.
- Outlook.

Presentation of Gaia DPAC / DU434 work package

- **DU434 : part of CU4 in Gaia Data Processing and Analysis Consortium**
- **DU434 : spectroscopic binary work package.**
- **DU434 receives time series of radial velocities and observed RVS spectra from DPAC / CU6 of all suspected spectroscopic variable stars.**
- **DU434 derives orbital elements (period, center of mass velocity, semi amplitude, eccentricity, longitude of periastron and time of periastron passage) for SB1 and SB2 stars.**

Presentation of Gaia DPAC / DU434 work package



RVS transits

Median value is 50 transits – Mean value is 51.8 transits

Spectral type	$V = 6$	$V = 9$	$V = 12$	$V = 14$
G5 V	0.4	2	5	15
B5 V	3	10	30	-

Radial velocity precision (1σ) for single stars within CU6 / Single Transit analysis

Viala Y., Blomme R., Frémat Y., et al
WP650 STR document

GAIA-C6-SP-OPM-YV-007-1

Used algorithms in DU434 Gaia package

- Spectroscopic binary processing is a blind processing : no human intervention.
- Pre-selection of bona fide spectroscopic variable stars done “en amont” (see Dimitri's talk)
- For each input time series of radial velocities and observed spectra we :
 - Clean the inputs from erroneous data
 - Search for the orbital period using time series of radial velocities.
 - Search for an approached orbital solution using time series of radial velocities.
 - Refine the orbital solution using time series of radial velocities.
 - Test the significance of the found eccentricity by comparing it with a circular orbit.
 - Compare the spectroscopic solution with the trend (polynomial) solution.
 - Refine the spectroscopic binary solution using time series of observed spectra.

Used algorithms in DU434 Gaia package

Period search : the hardest task

Many methods tested : combination of 2 methods :

- Preselection of best local maxima in the periodogram using HMM method:
Heck, A., Manfroid, J., Mersch, G. 1985, A&AS, 59, 63
Fit of a simple sin function to the phase diagram (arbitrary t_0).
Applied to V_{r_1} for SB1 and $(|V_{r_2} - V_{r_1}|, V_{r_1})$ for SB2
- Selection of the best period and derivation of the approached solution using :
Zechmeister & Kürster, 2009, A&A, 577
Based on HMM : fit of a simple sin function to the true anomaly ($v = f(e, T_p)$).
 - $V_{r_1} = [V_{01} + K_1 e \cos(\omega_1)] + [K_1 \cos(\omega_1)] \cos(v) + [-K_1 \sin(\omega_1)] \sin(v)$
 - $V_{r_2} = [V_{02} + K_2 e \cos(\omega_2)] + [K_2 \cos(\omega_2)] \cos(v) + [-K_2 \sin(\omega_2)] \sin(v)$
 - Problem : $V_{02} \neq V_{01}$ and $\omega_2 \neq \pi + \omega_1 \Rightarrow$ consider the average mean ?

Used algorithms in DU434 Gaia package

- The approached orbital solution determination : some alternative methods :
 - Commonly used methods : Lehmann-Filhès, Wilsing Russell.
 - Genetic algorithm coupled with Zechmeister & Kürster periodogram.
 - Pattern recognition algorithm (discussed in current development section).

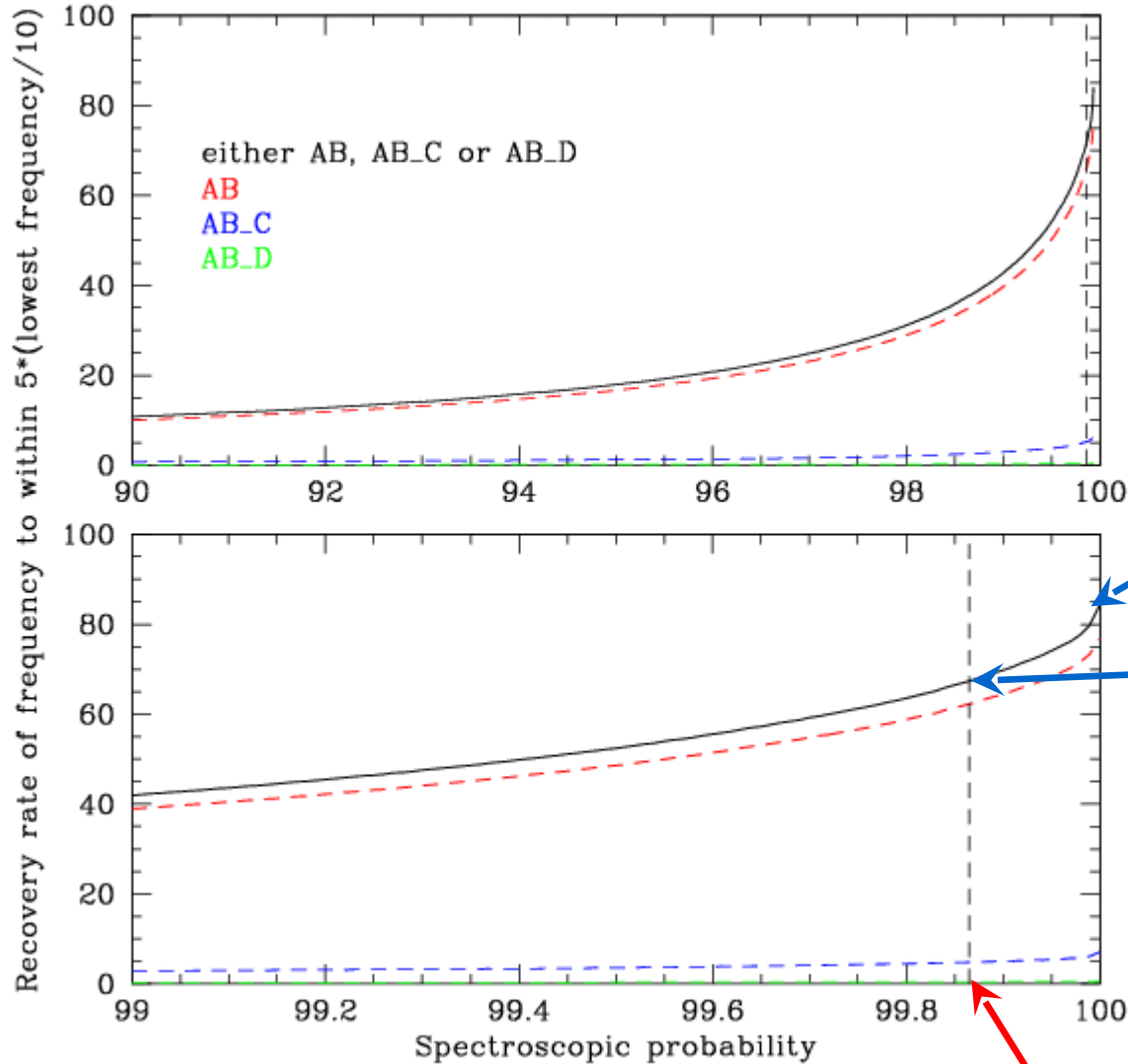
- The approached orbital solution refined using :
 - Sterne algorithm for very small eccentricities ($e < 0.03$)
 - Schlesinger method for larger eccentricities ($e > 0.03$)
 - Levenberg-Marquardt minimisation

Current performances

The simulations are based on :

- Gaia simulator (Gaia Object Generator) : 10 million stars containing 80 000 and 10 000 of SB1 and SB2 respectively having a variability probability > 0.99865 .
- Internal DU434 simulated curve using the Gaia satellite scanning law to generate the RVS transit dates.

Recovery of orbital period – SB1

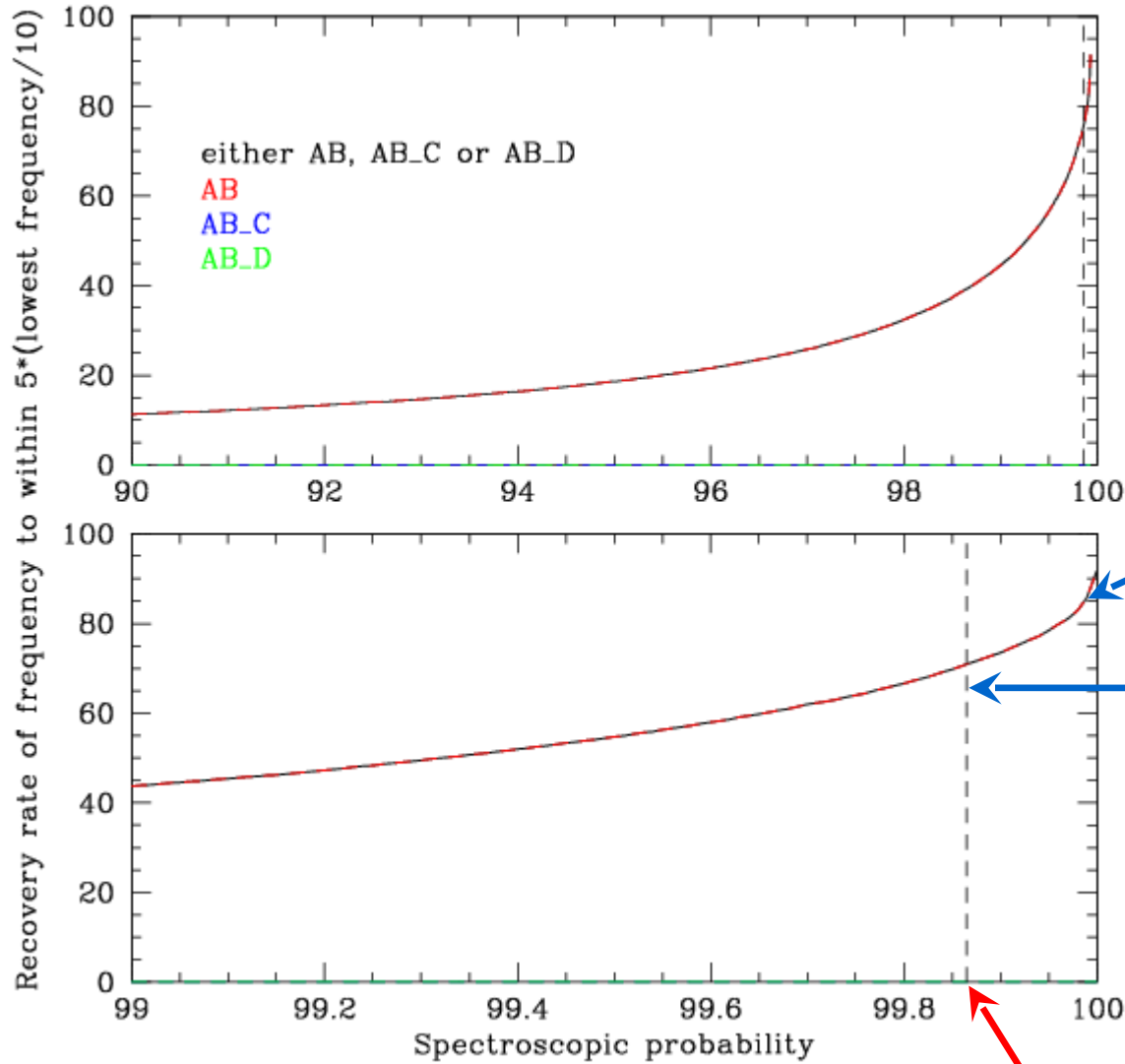


~84%

~68%

Proba = 99.865%

Recovery of orbital period – SB1



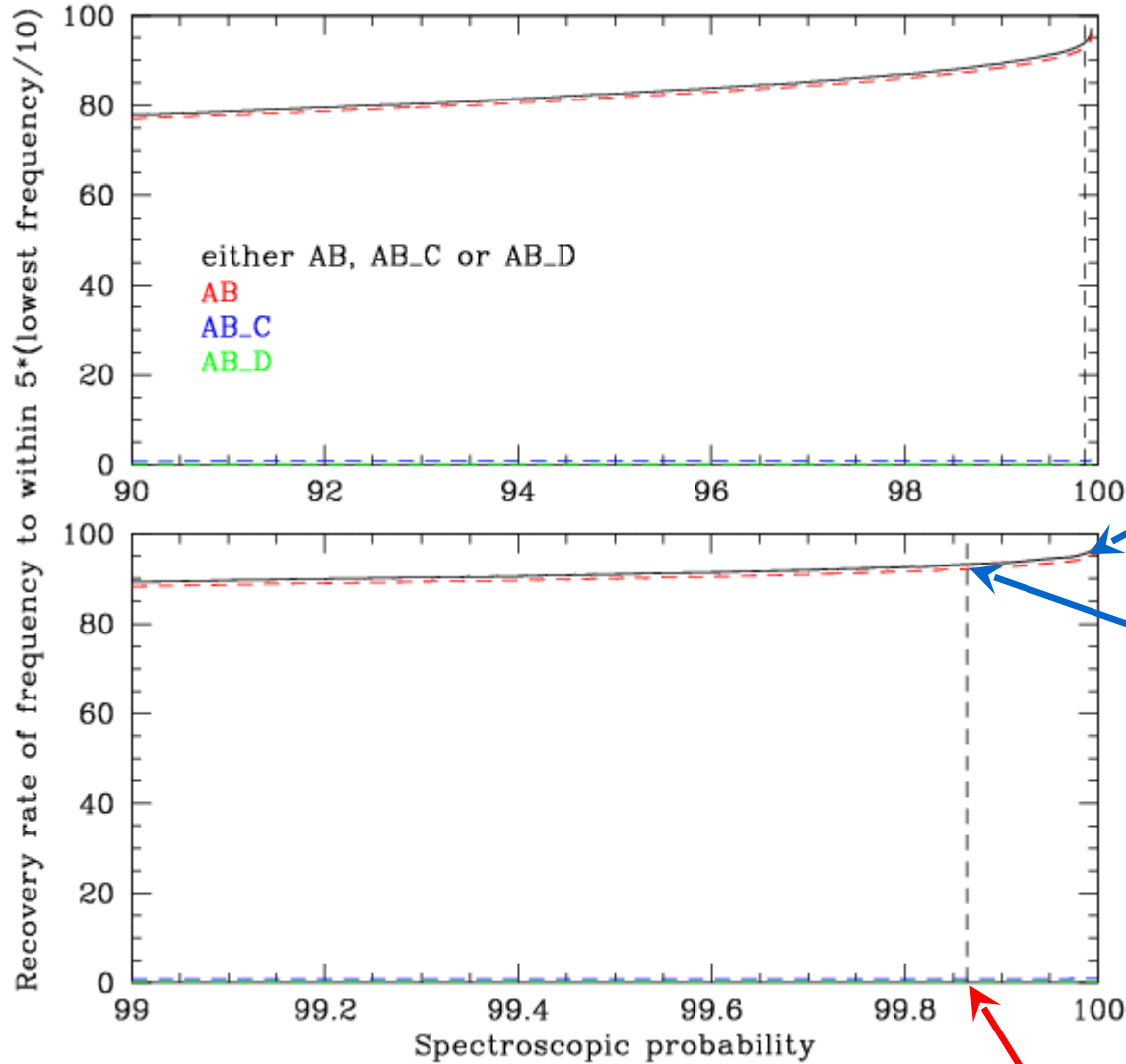
Systems with only two components and not intrinsically variable

~92%

~71%

Proba = 99.865%

Recovery of orbital period – SB2



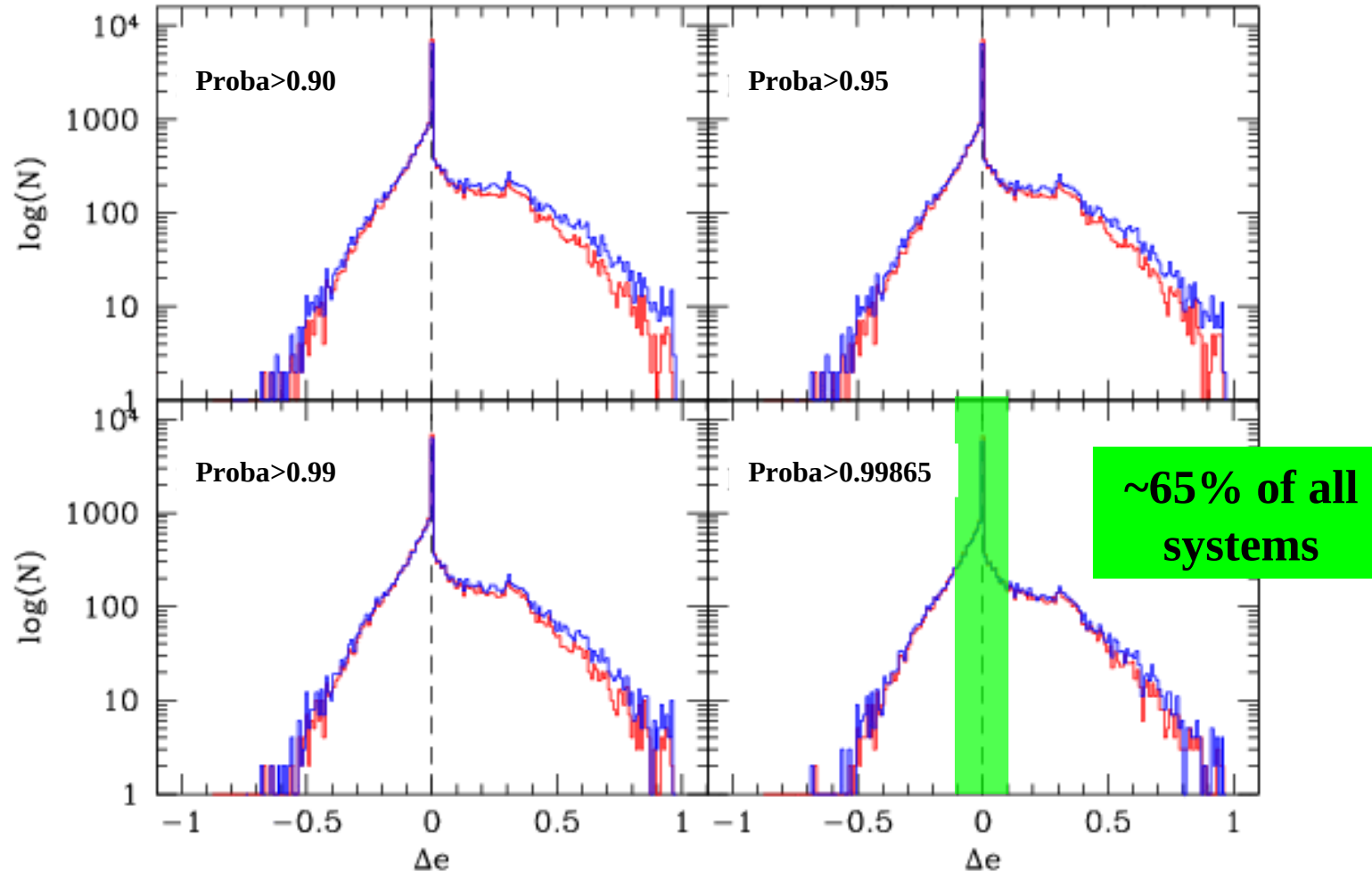
~97%

~93%

Proba = 99.865%

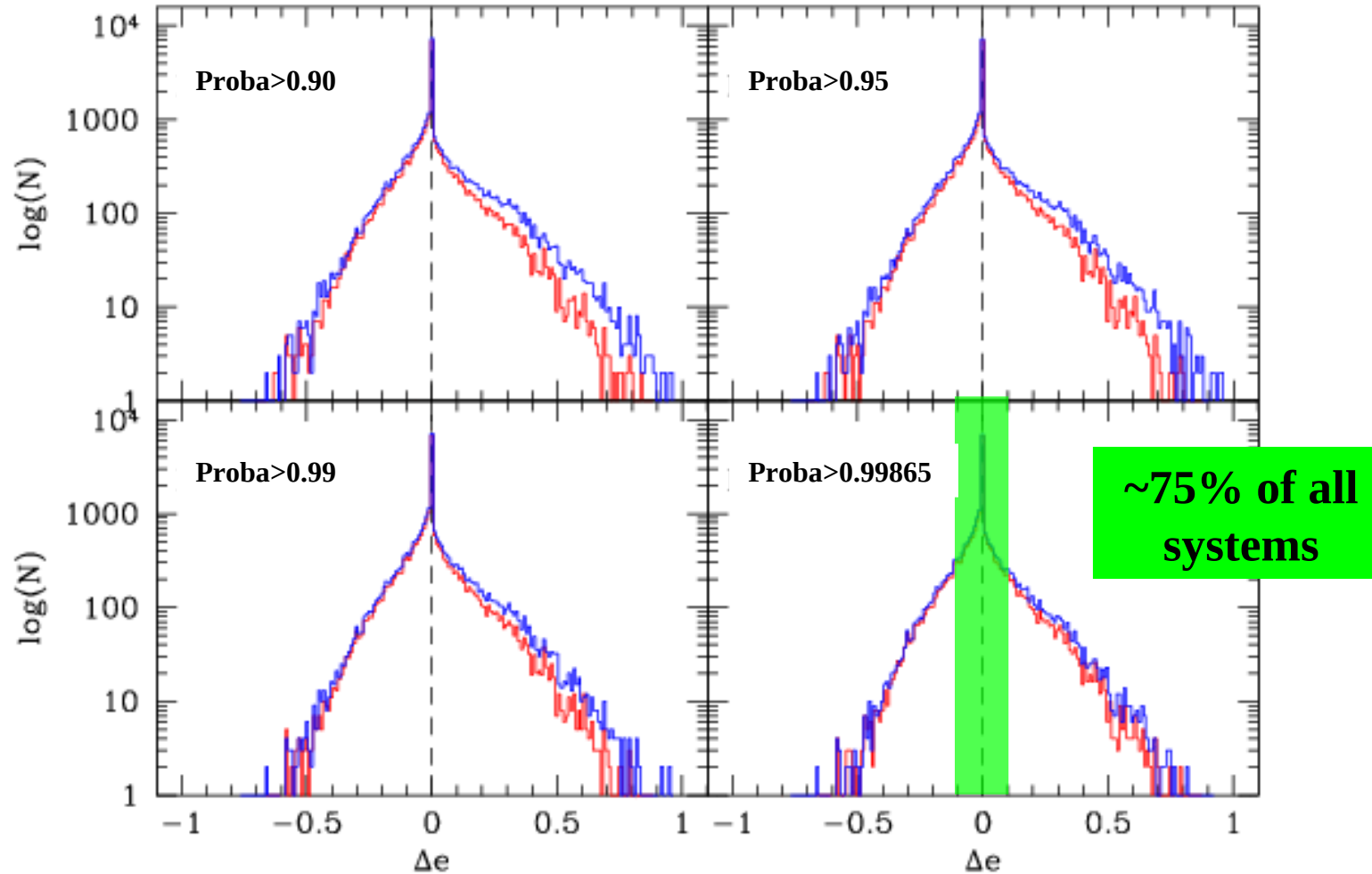
Recovery of eccentricity – SB1

Red: recovered period AB, no trend – blue: CU7 periods
 $\Delta e = \text{found } e - \text{real } e$

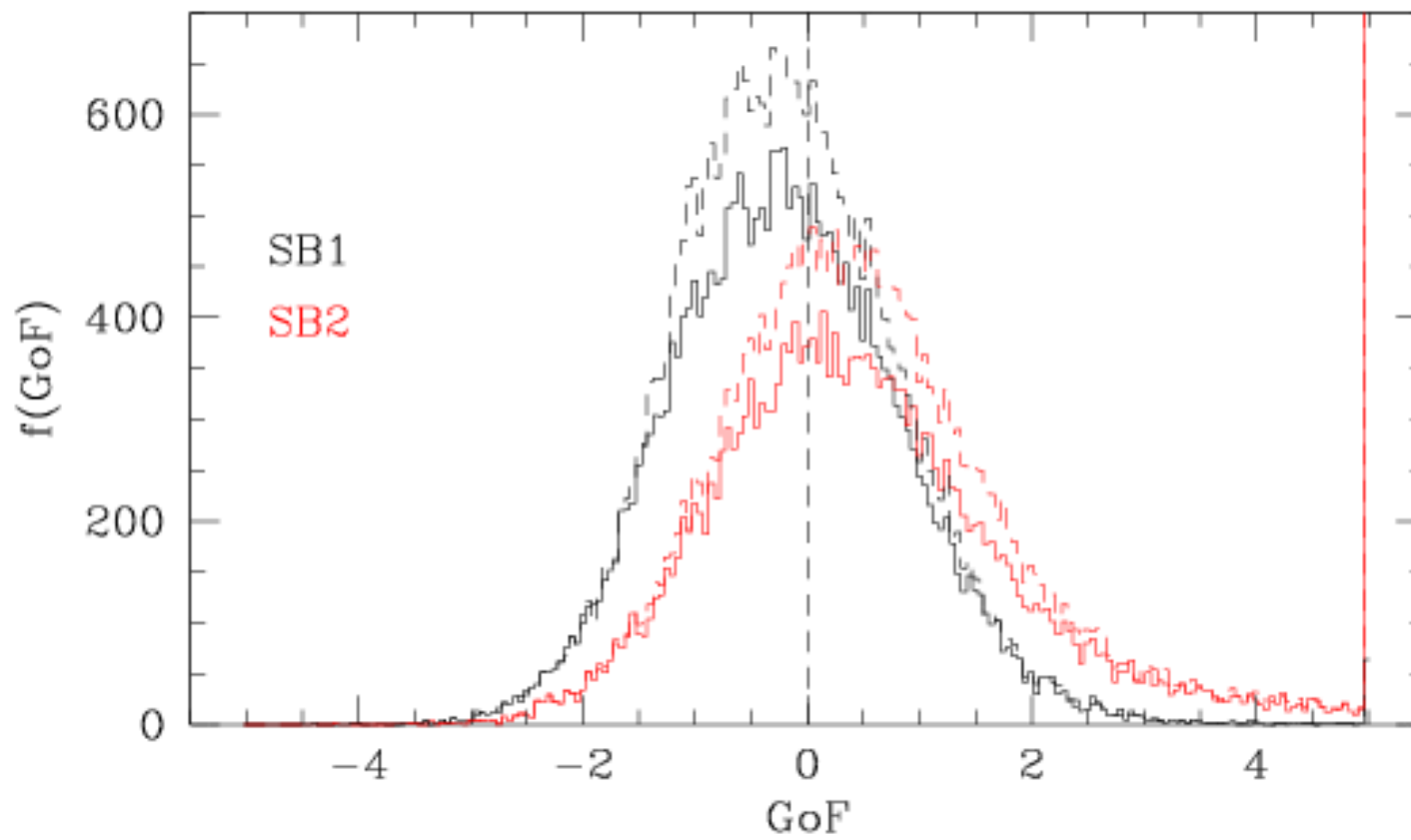


Recovery of eccentricity – SB2

Red: recovered period AB, no trend – blue: CU7 periods
 $\Delta e = \text{found } e - \text{real } e$



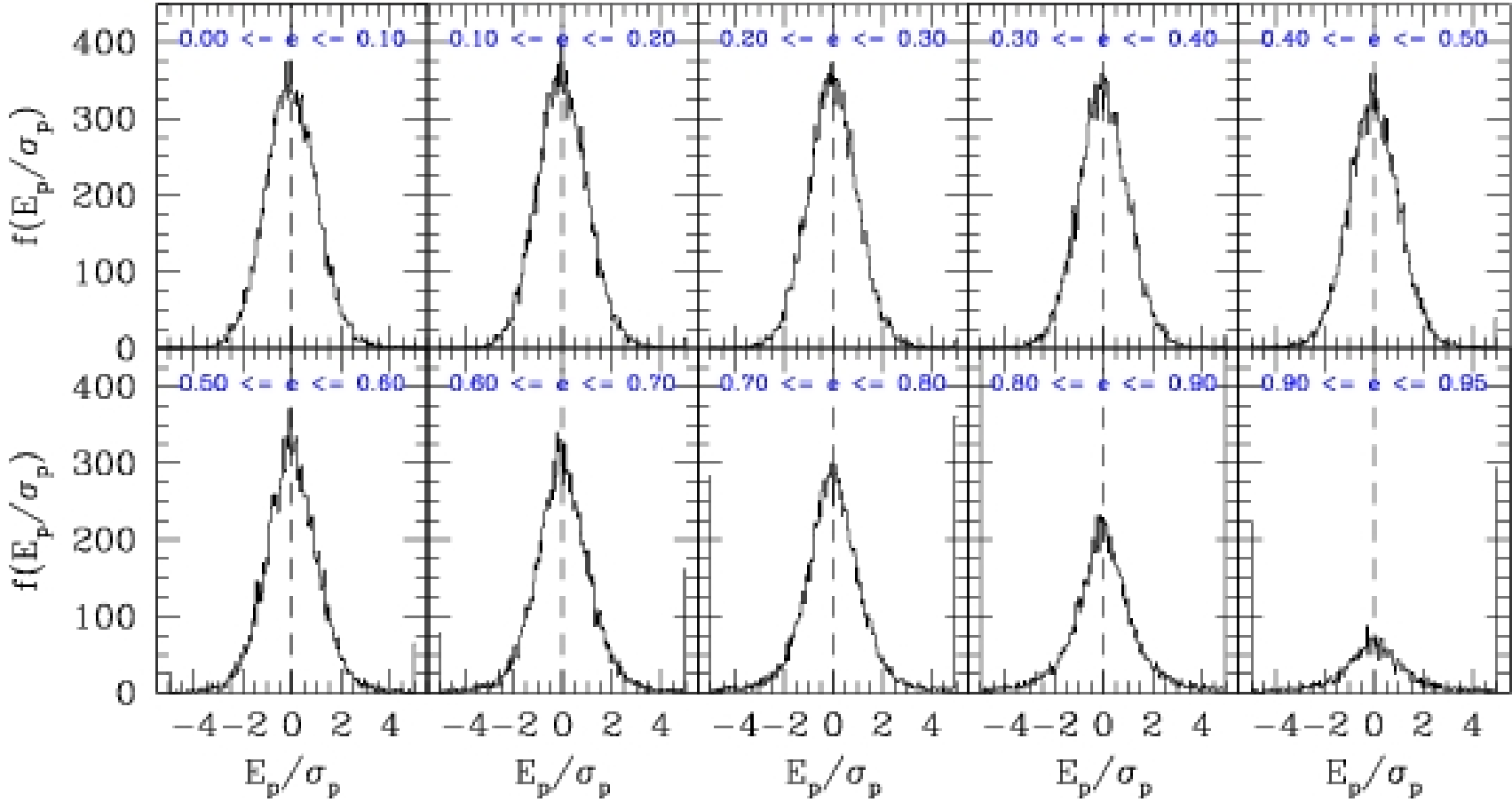
Recovered period – no trend, Dashed: with CU7 periods



Orbital frequencies – SB1

$$E_p/\sigma_p = (\text{frequency refined} - \text{frequency real})/\sigma_{\text{frequency}}$$

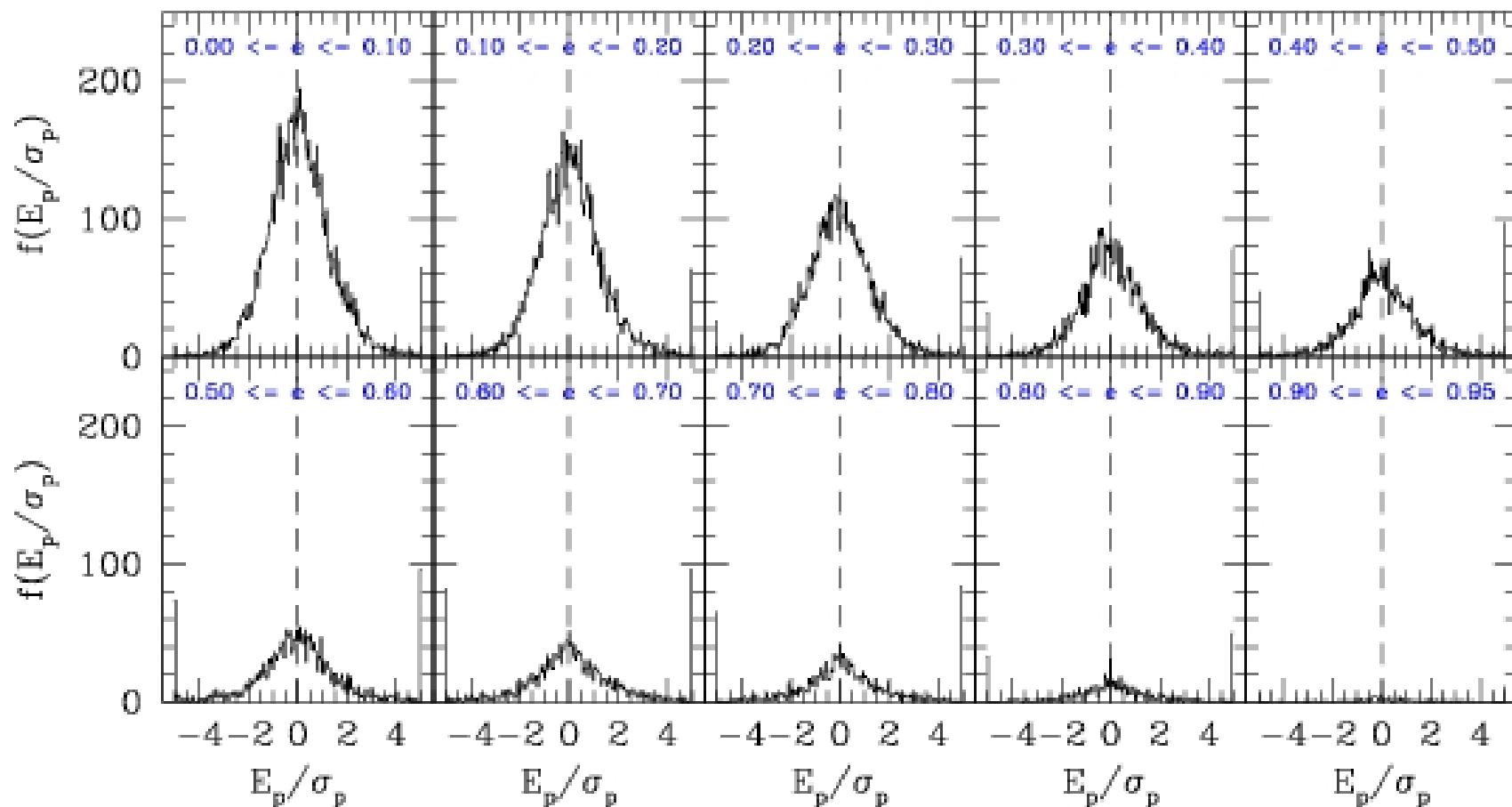
SB1, 120000 simulations, N=40, $\sigma=15$ km/s



Orbital frequencies – SB2

$$E_p/\sigma_p = (\text{frequency refined} - \text{frequency real})/\sigma_{\text{frequency}}$$

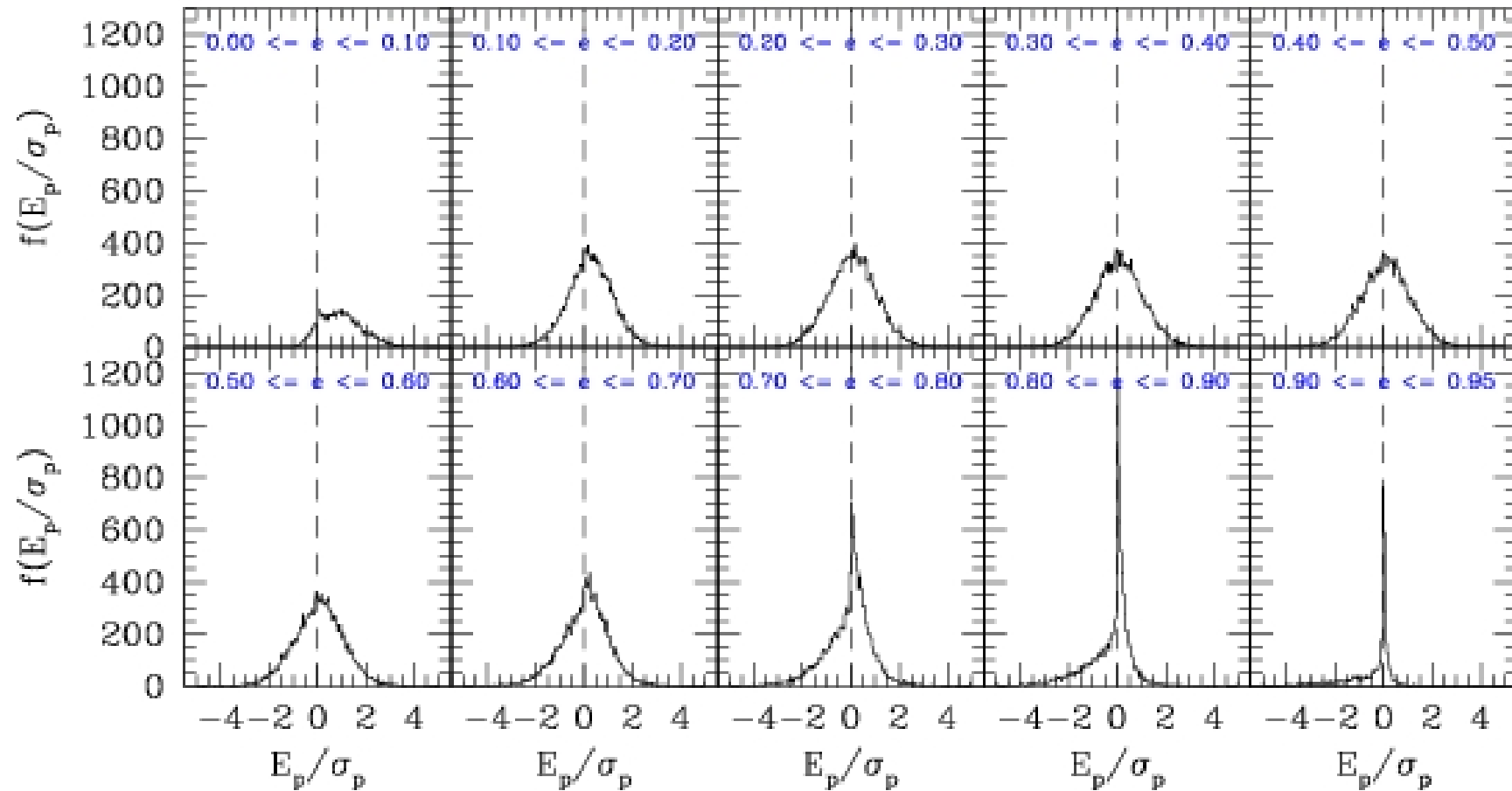
SB2, 120000 simulations, $N=20$, $\sigma=30$ km/s



Eccentricity – SB1

$$E_p/\sigma_p = (e_{\text{refined}} - e_{\text{real}})/\sigma_e$$

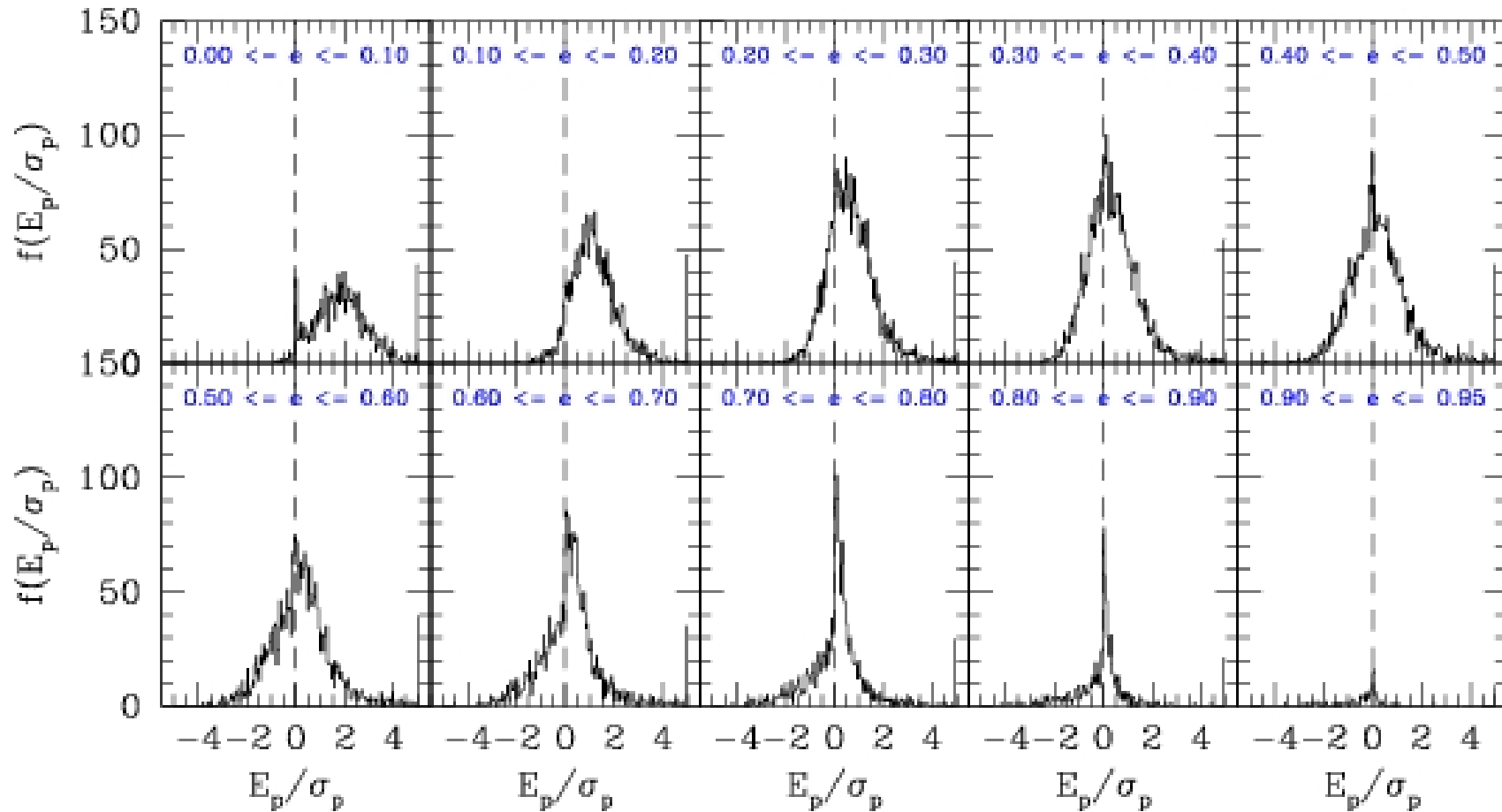
SB1, 120000 simulations, $N=40$, $\sigma=15$ km/s



Eccentricity – SB2

$$E_p/\sigma_p = (e \text{ refined} - e \text{ real})/\sigma_e$$

SB2, 120000 simulations, $N=20$, $\sigma=30$ km/s



Current developments

- Test of eccentricity significance
- Period significance level.
- SB2 ambiguity : sorting velocities
- Pattern recognition for radial velocity curves.

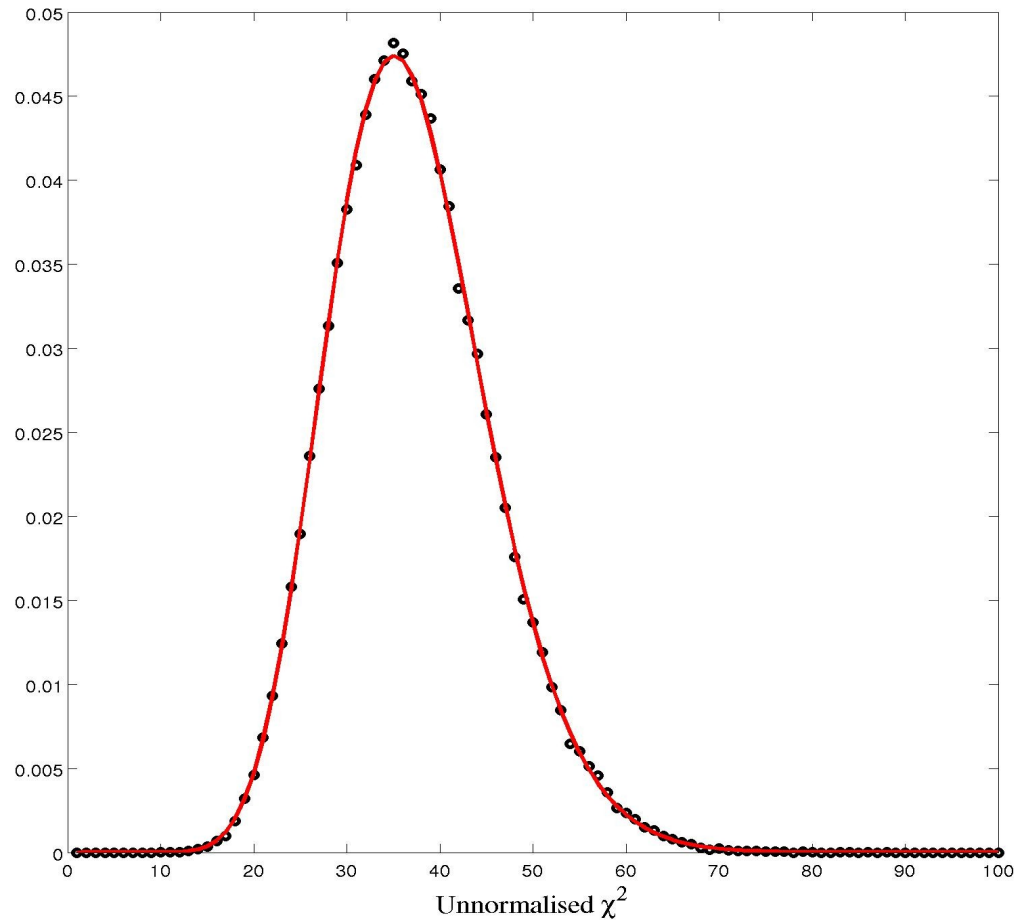
Test of eccentricity significance

Circular orbits with known periods

$N = 40 - K = 100 \text{ km/s} - \sigma = 15 \text{ km/s} - e = 0.00$

Starting number of free parameters = 3

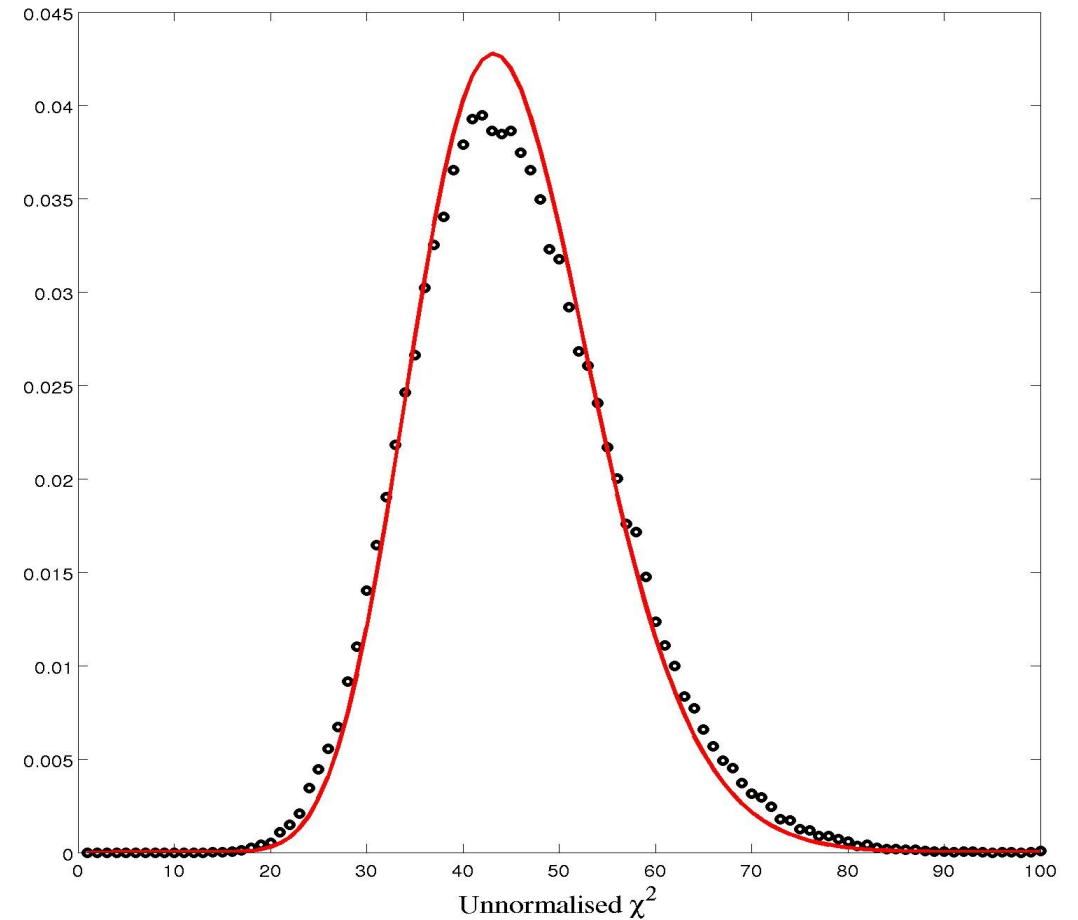
Fitted number of free parameters = $2.94 \pm 1.85e-02$



$N = 40 - K = 100 \text{ km/s} - \sigma = 15 \text{ km/s} - e = 0.10$

Starting number of free parameters = 3

Fitted number of free parameters = $-5.15 \pm 1.01e-01$



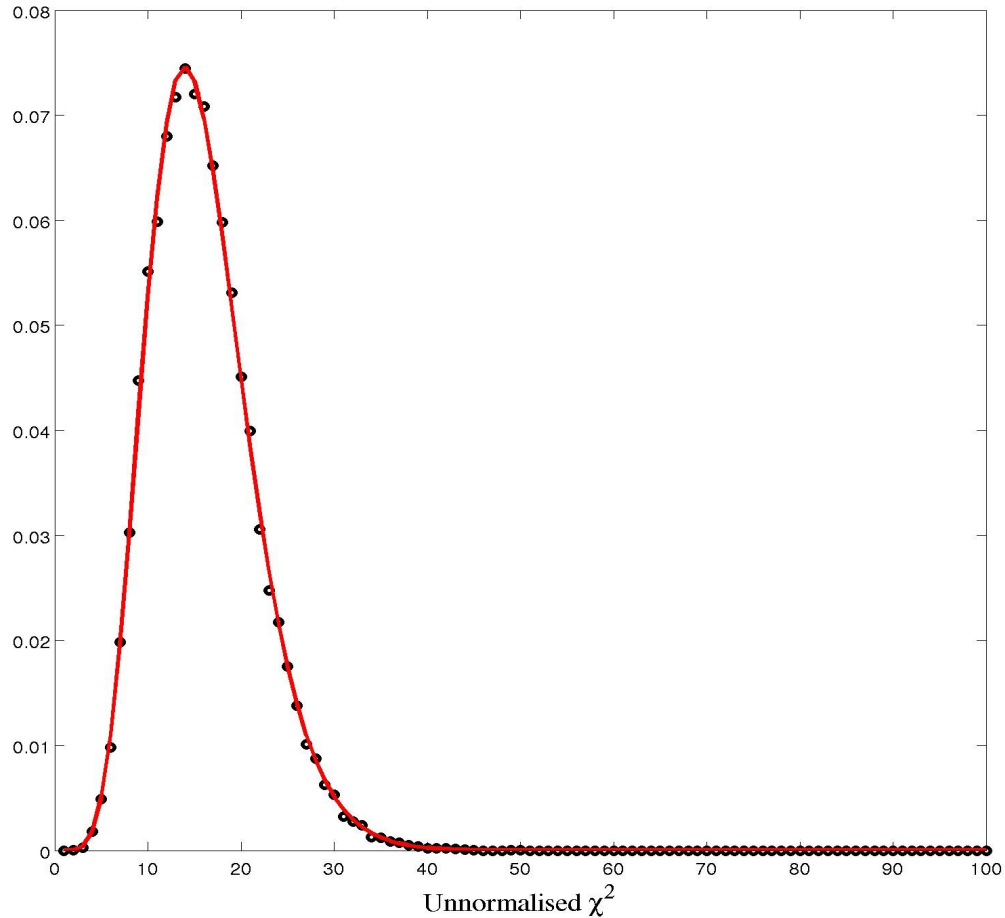
Test of eccentricity significance

Circular orbits with unknown periods

$N = 20 - K = 100 \text{ km/s} - \sigma = 15 \text{ km/s} - e = 0.00$

Starting number of free parameters = 4

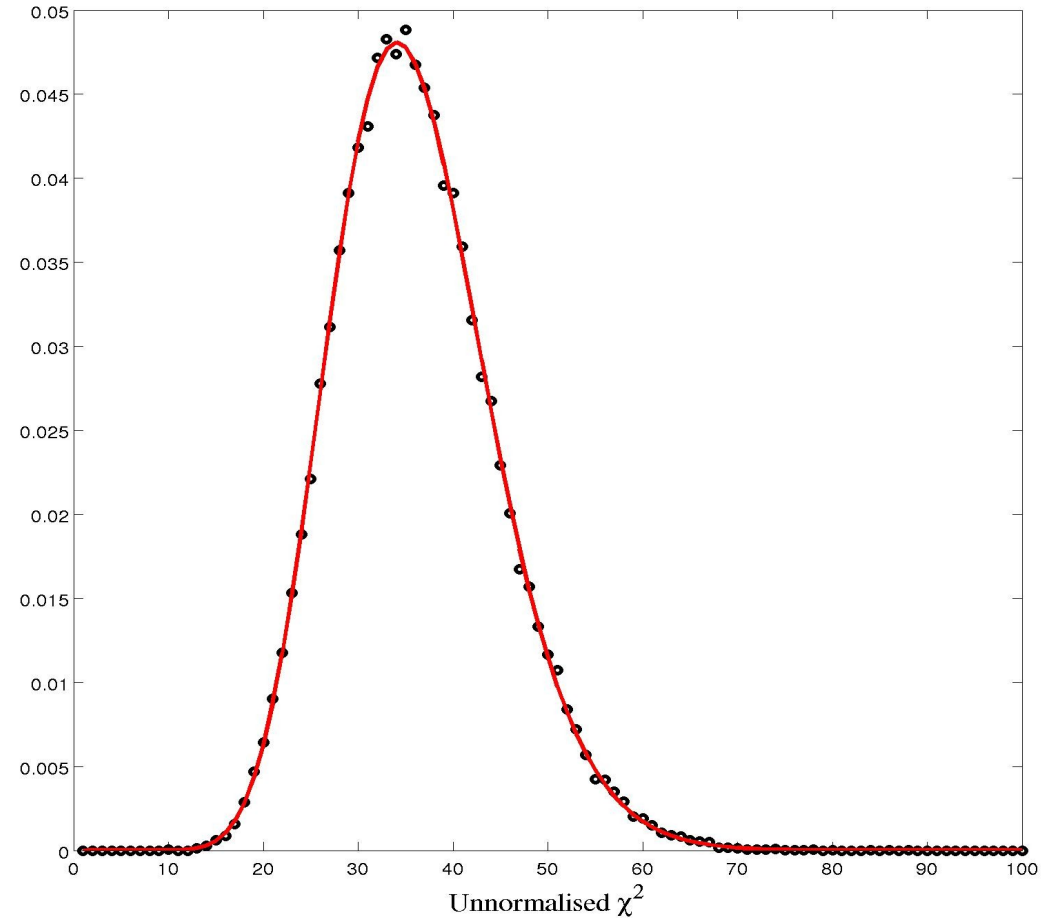
Fitted number of free parameters = $4.04 \pm 2.19\text{e-}02$



$N = 40 - K = 100 \text{ km/s} - \sigma = 15 \text{ km/s} - e = 0.00$

Starting number of free parameters = 4

Fitted number of free parameters = $3.94 \pm 2.51\text{e-}02$



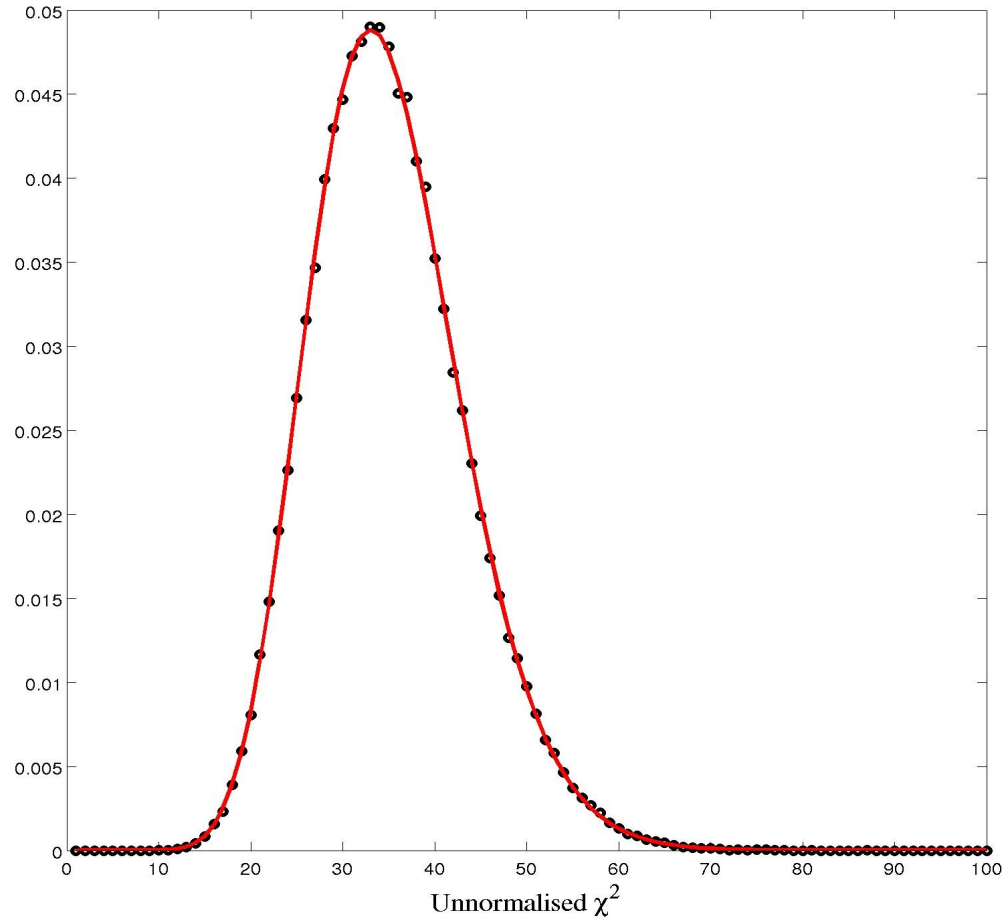
Test of eccentricity significance

Elliptical orbits with known periods

$N = 40 - K = 100 \text{ km/s} - \sigma = 15 \text{ km/s} - e = 0.00$

Starting number of free parameters = 5

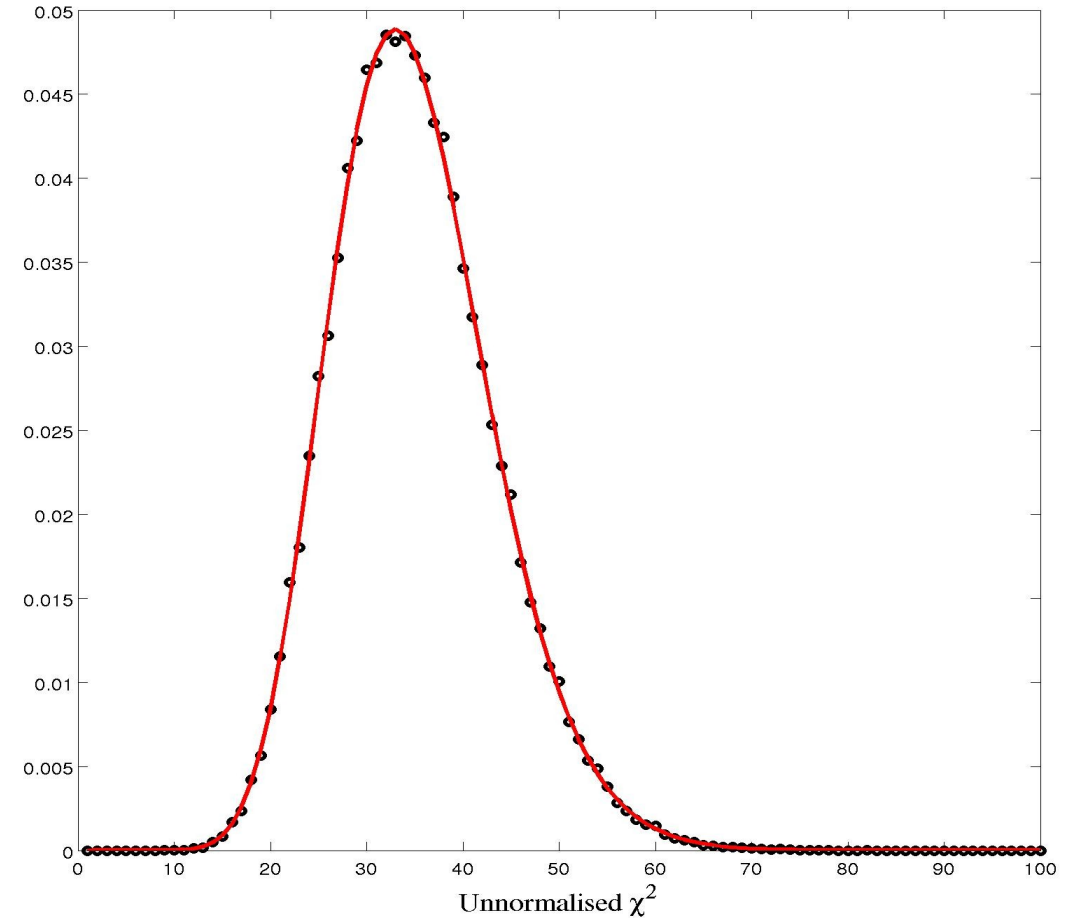
Fitted number of free parameters = $4.95 \pm 1.66e-02$



$N = 40 - K = 100 \text{ km/s} - \sigma = 15 \text{ km/s} - e = 0.50$

Starting number of free parameters = 5

Fitted number of free parameters = $5.02 \pm 2.25e-02$



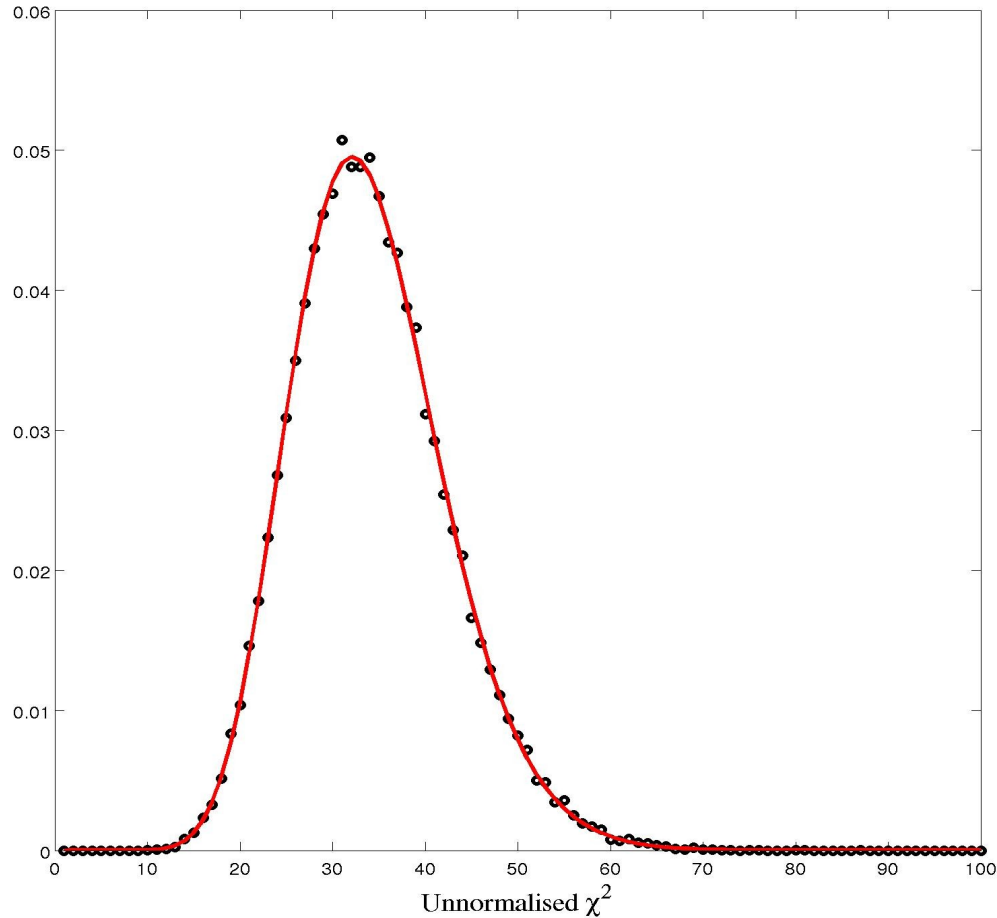
Test of eccentricity significance

Elliptical orbits with unknown periods

$N = 40 - K = 100 \text{ km/s} - \sigma = 15 \text{ km/s} - e = 0.00$

Starting number of free parameters = 6

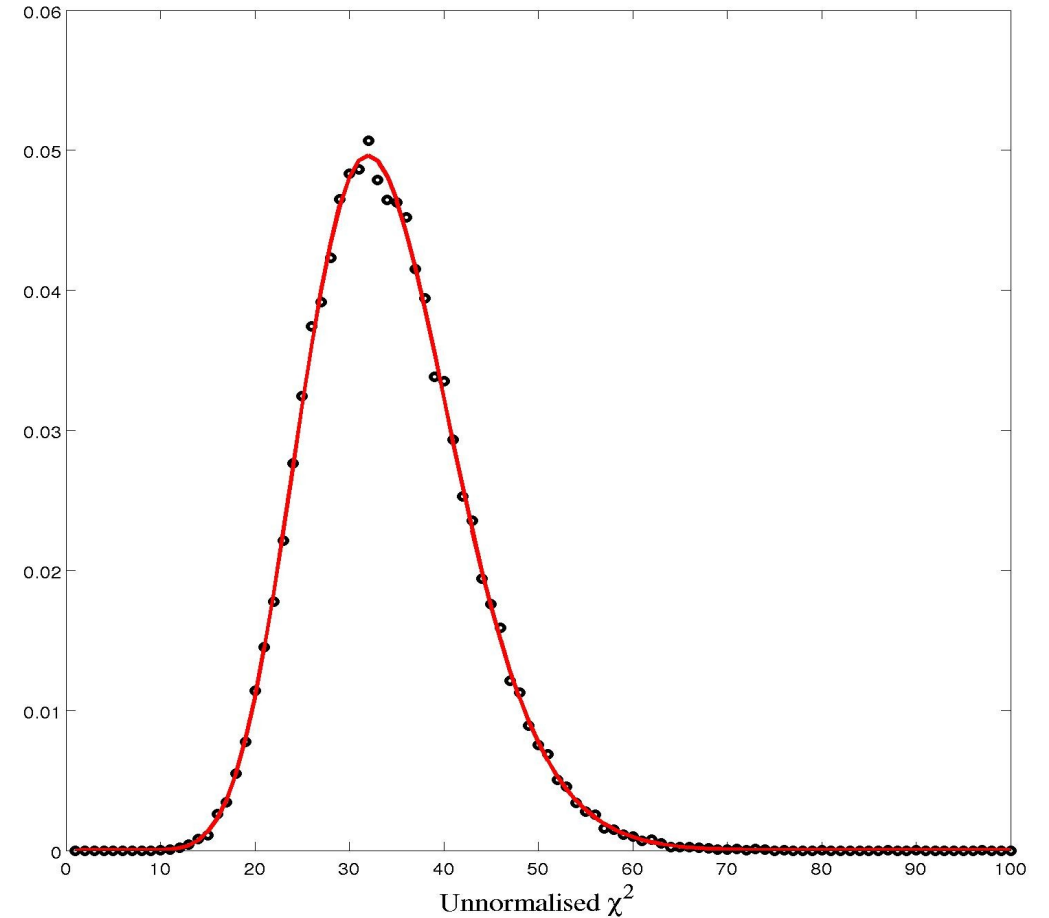
Fitted number of free parameters = $5.90 \pm 2.59e-02$



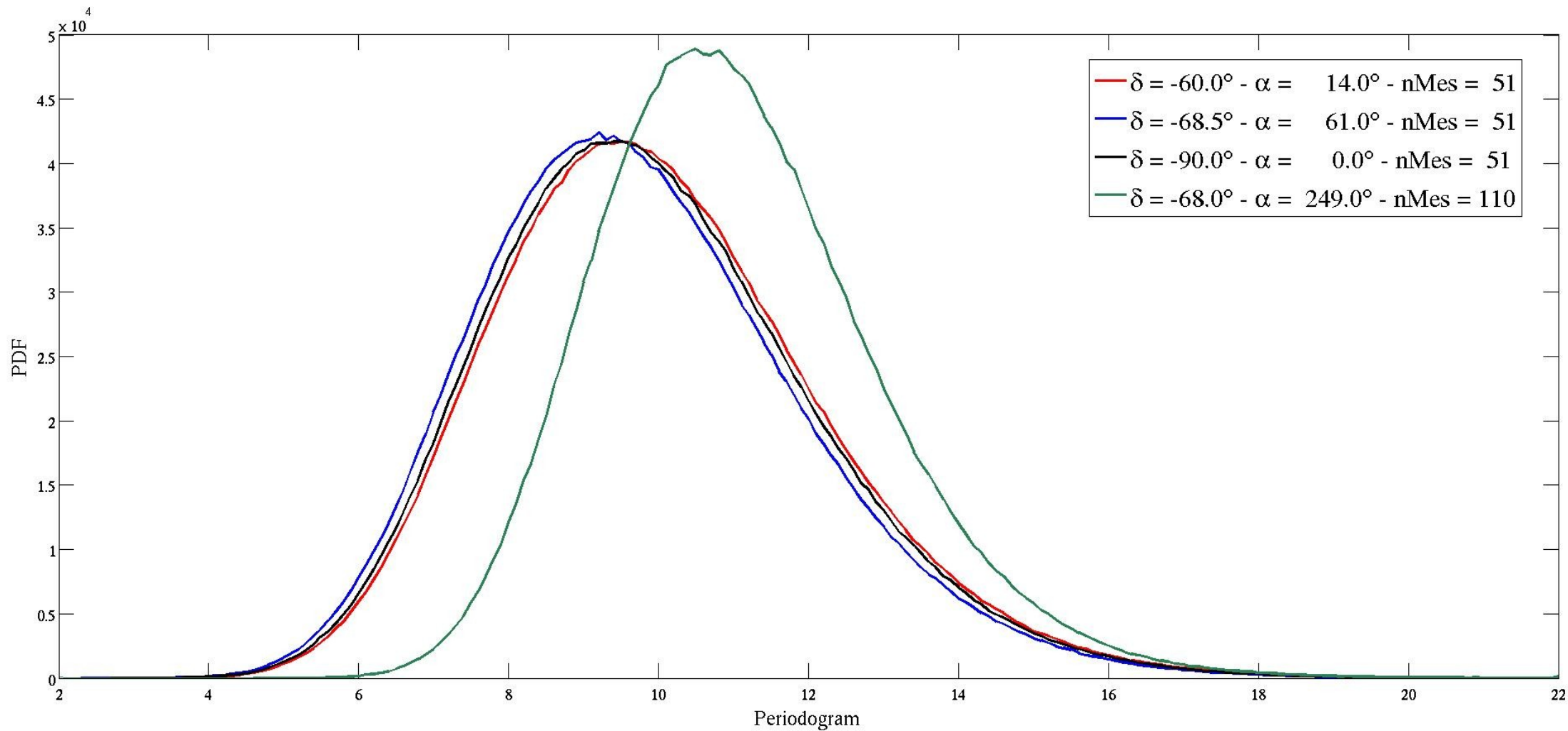
$N = 40 - K = 100 \text{ km/s} - \sigma = 15 \text{ km/s} - e = 0.20$

Starting number of free parameters = 6

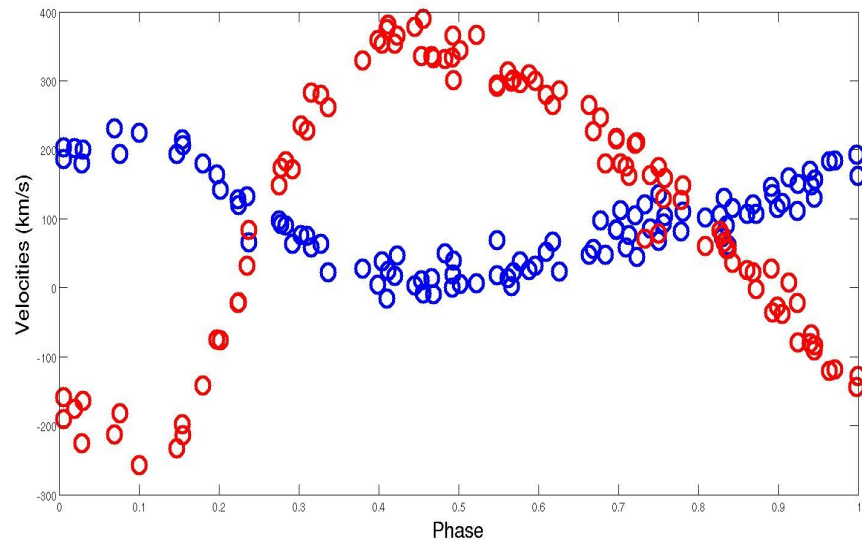
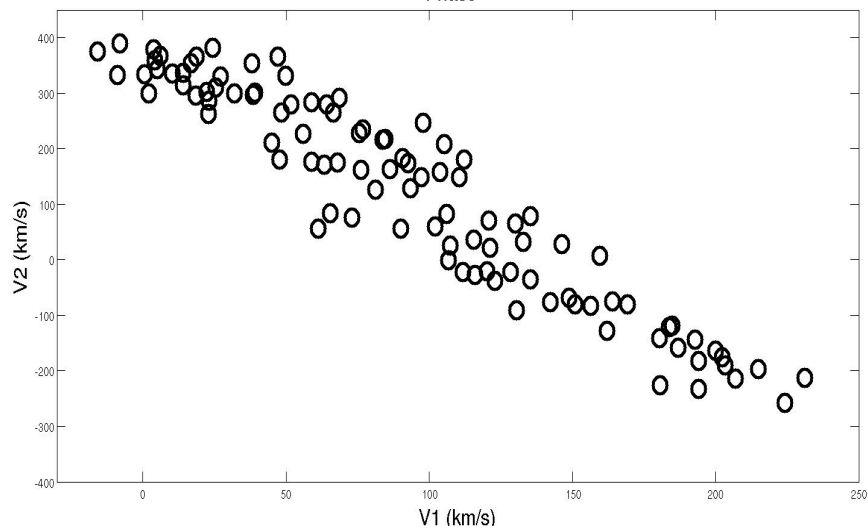
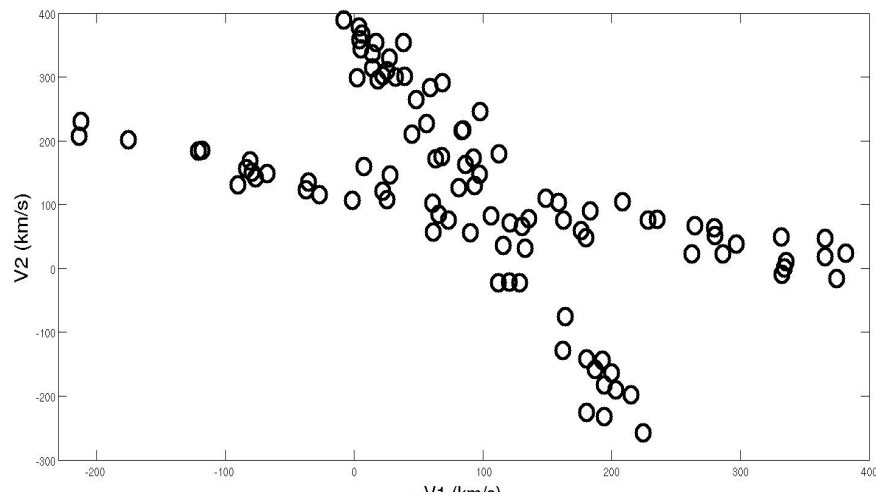
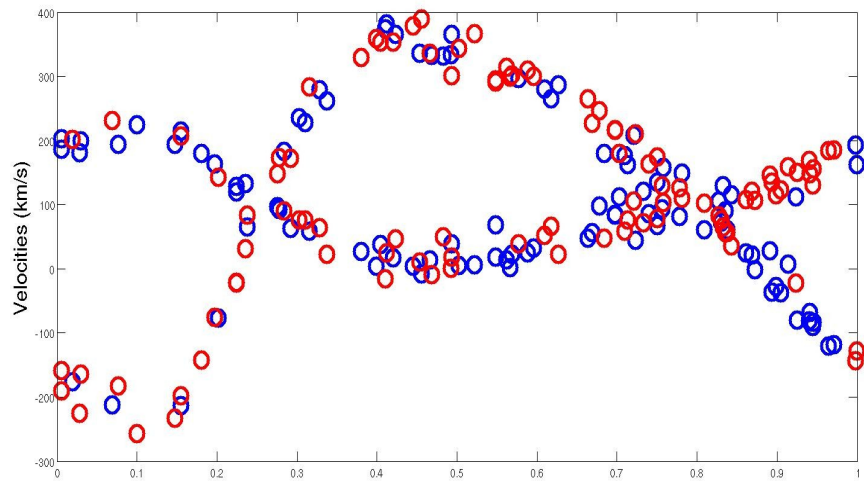
Fitted number of free parameters = $6.02 \pm 2.83e-02$



Period significance level

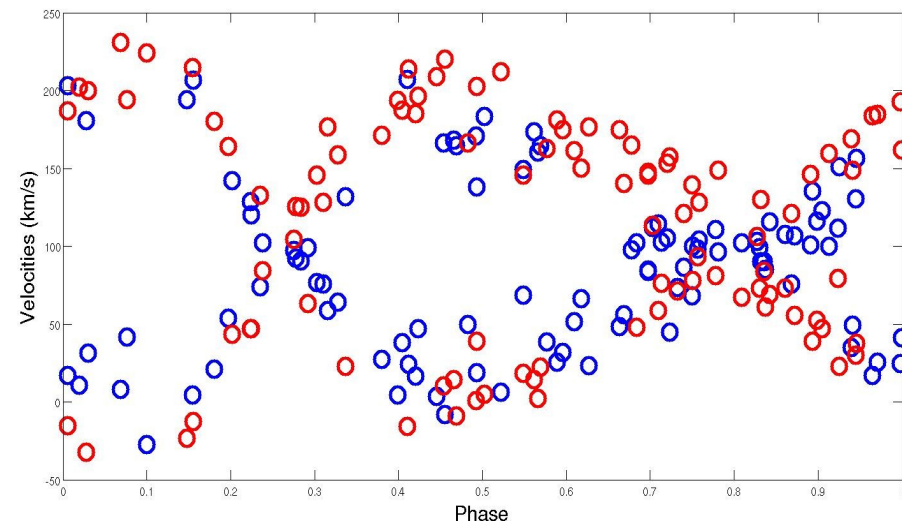
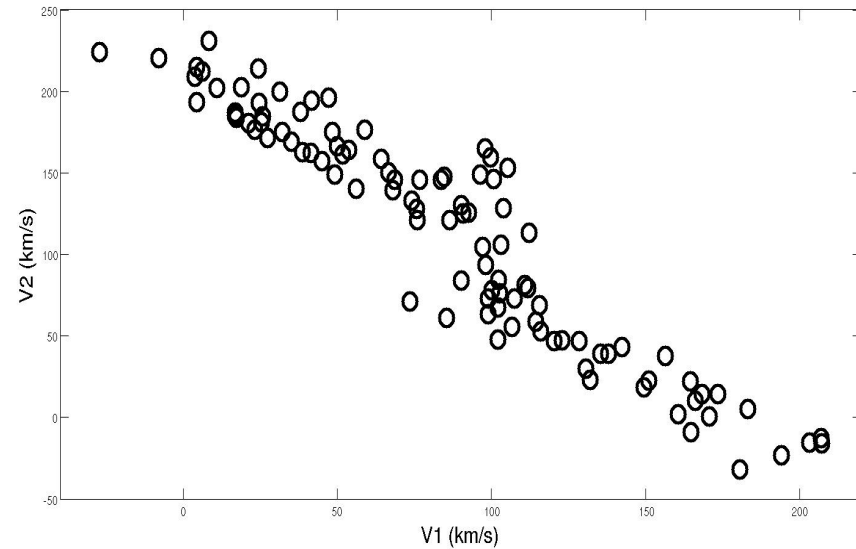
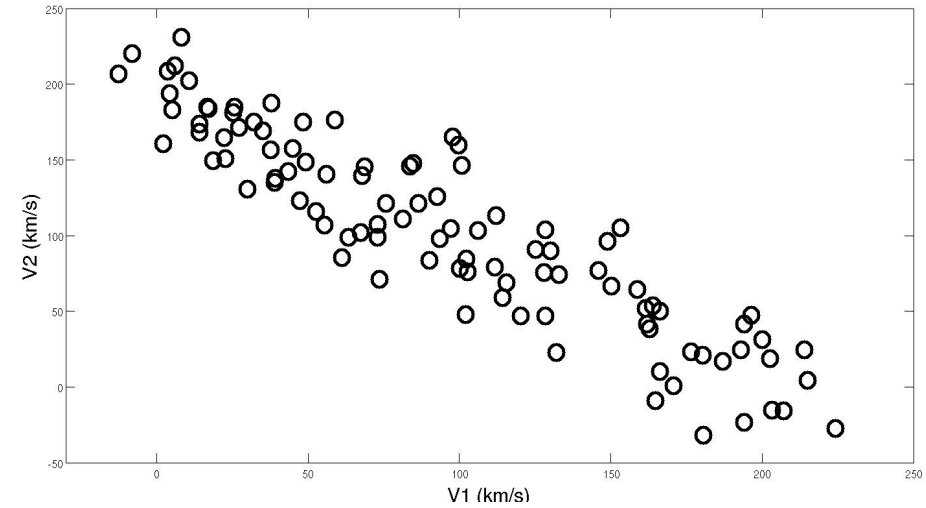
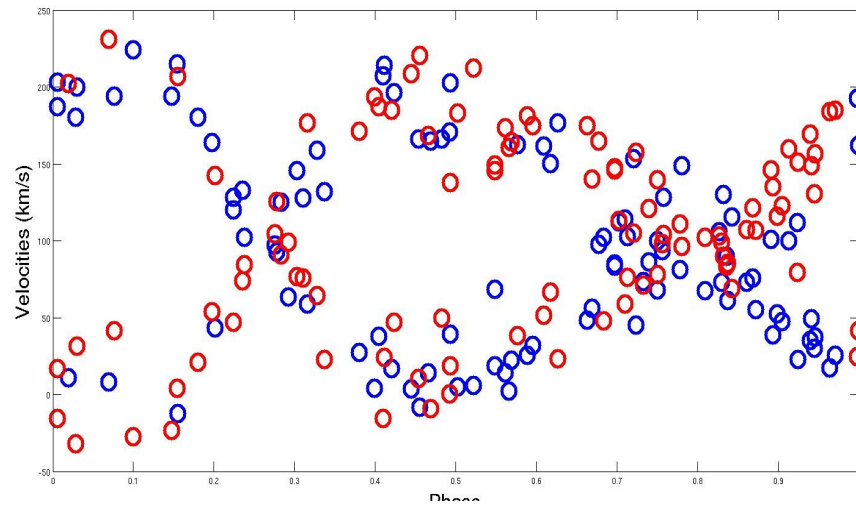


$K_1=100 \text{ km s}^{-1}$, $K_2 = 300 \text{ km s}^{-1}$, $e = 0.3$, $\sigma = 20 \text{ km s}^{-1}$

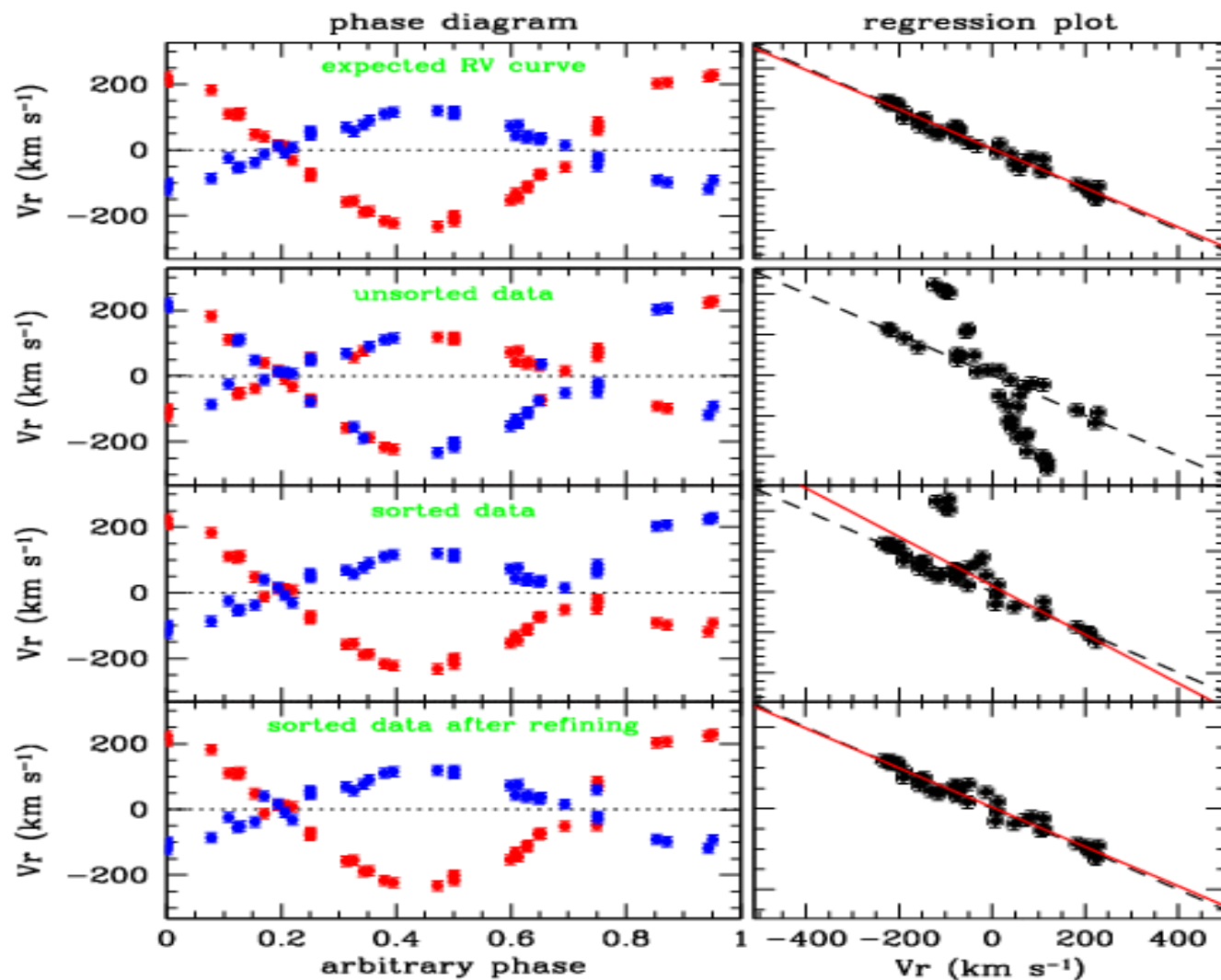


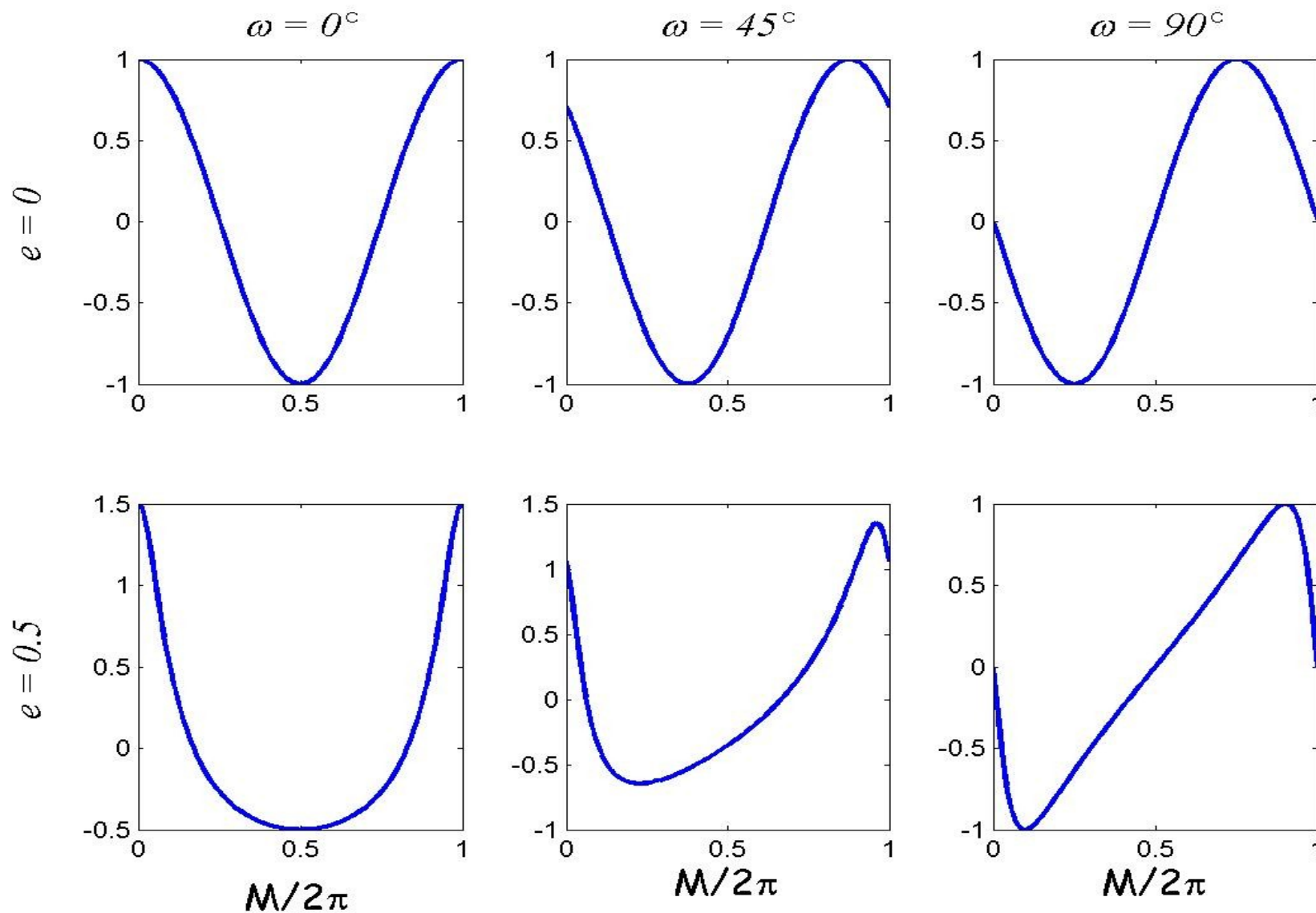
Sorting SB2 velocities

$K_1=100 \text{ km s}^{-1}$, $K_2 = 100 \text{ km s}^{-1}$, $e = 0.3$, $\sigma = 20 \text{ km s}^{-1}$



Sorting SB2 velocities





Extremely randomized trees - Training
Library : nobs = 40 - noise = 00
Training(300000 features) - Validation(100000 features)
nbterms = 100 - nmin = 2 - extratreesk = 5

RMS = 0.113

