



Cosmic Ray Flux Correlation between McMurdo and Jang Bogo Stations

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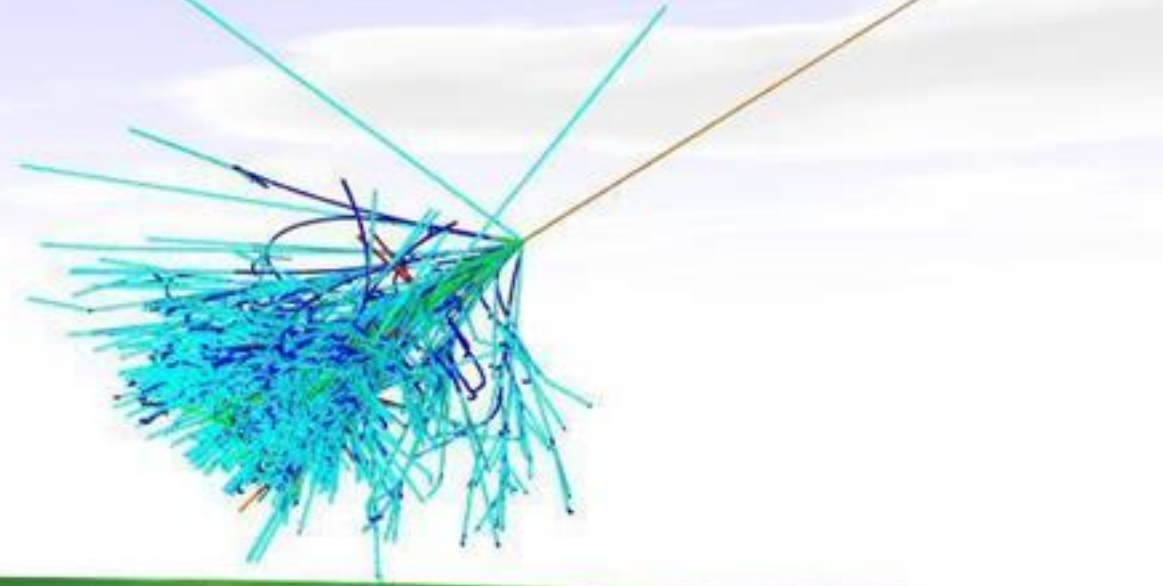
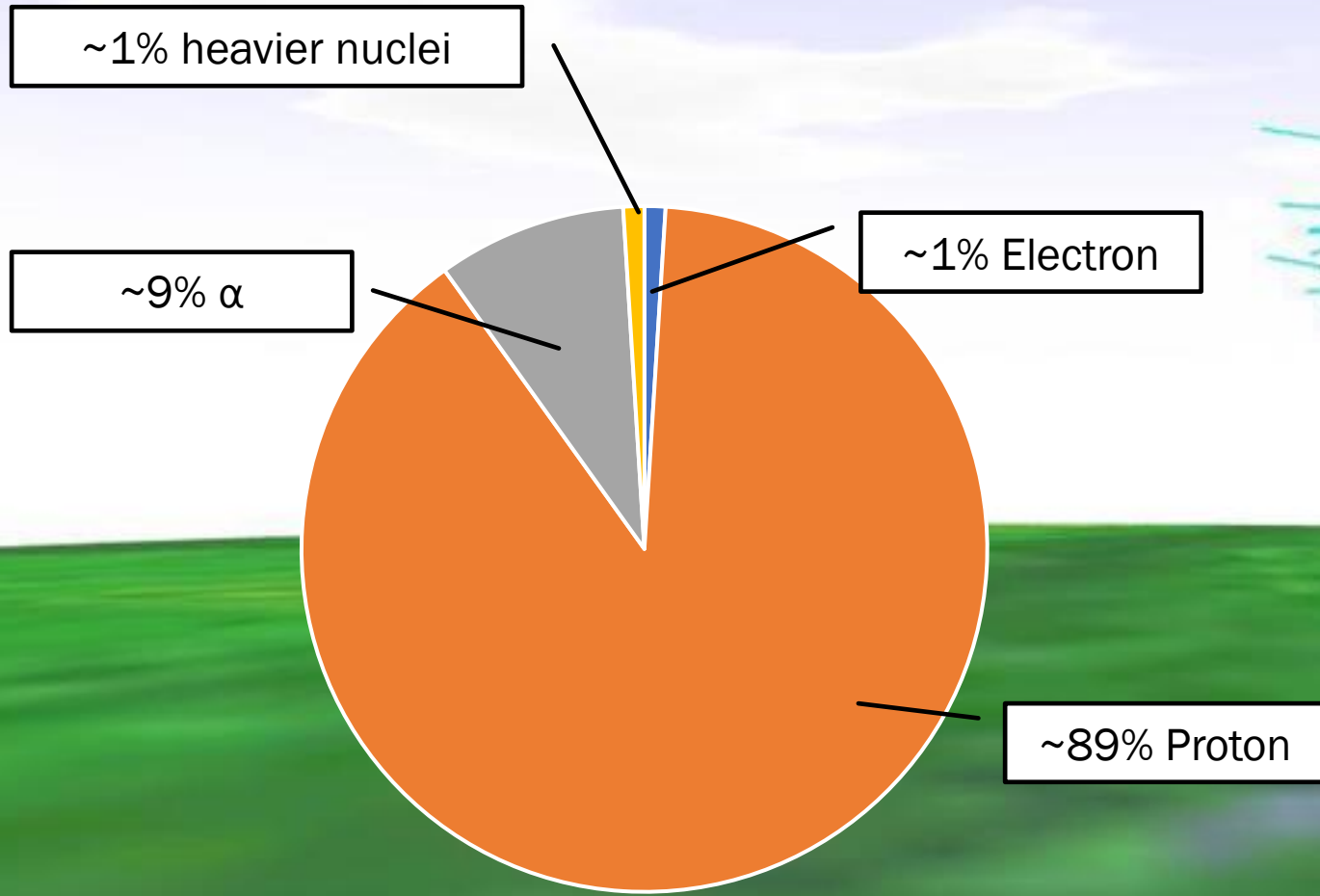
^bUniversity of Delaware, USA

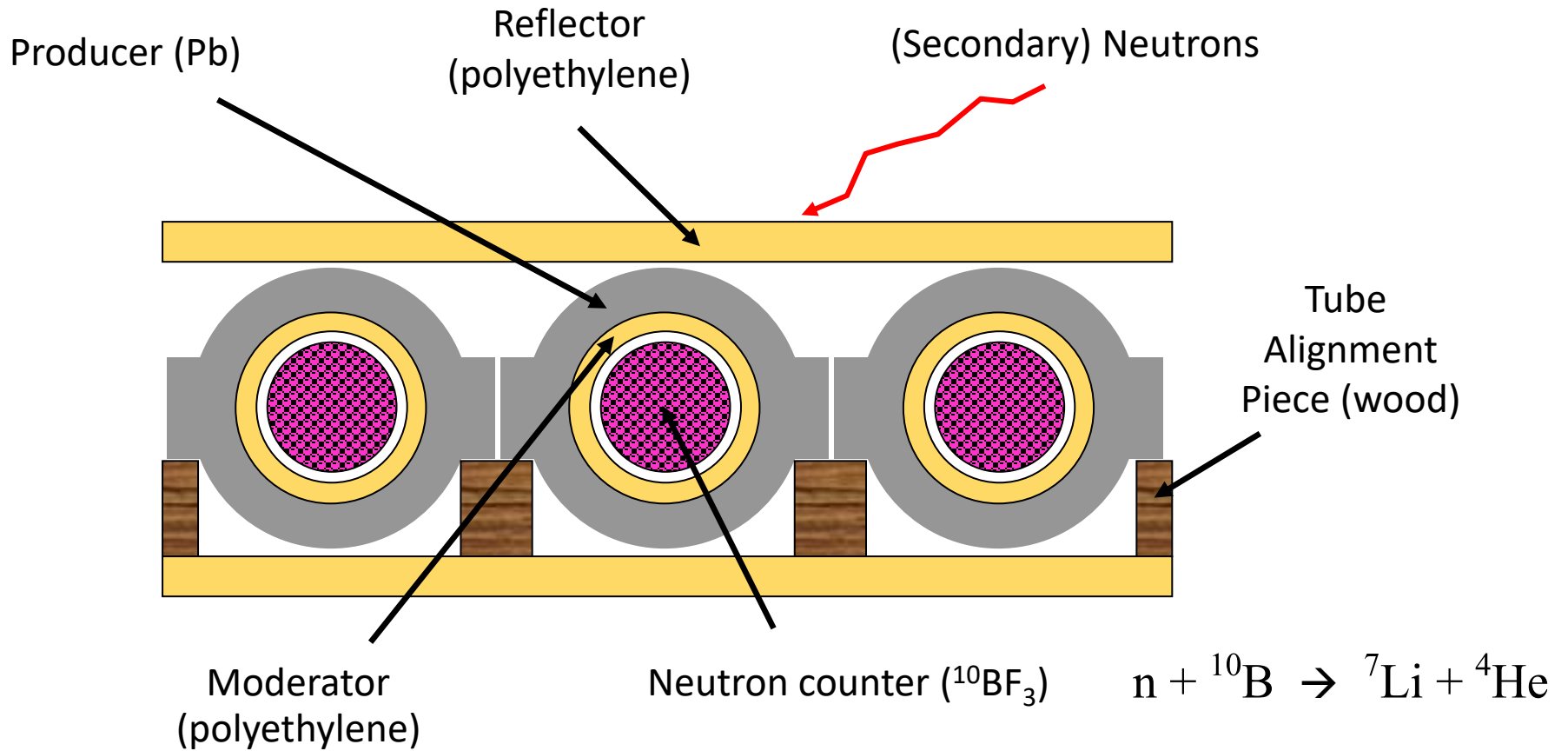
^cMahidol University, THAILAND

^dChonnam National University, SOUTH KOREA

^eNational Astronomical Research Institute of Thailand (NARIT), THAILAND

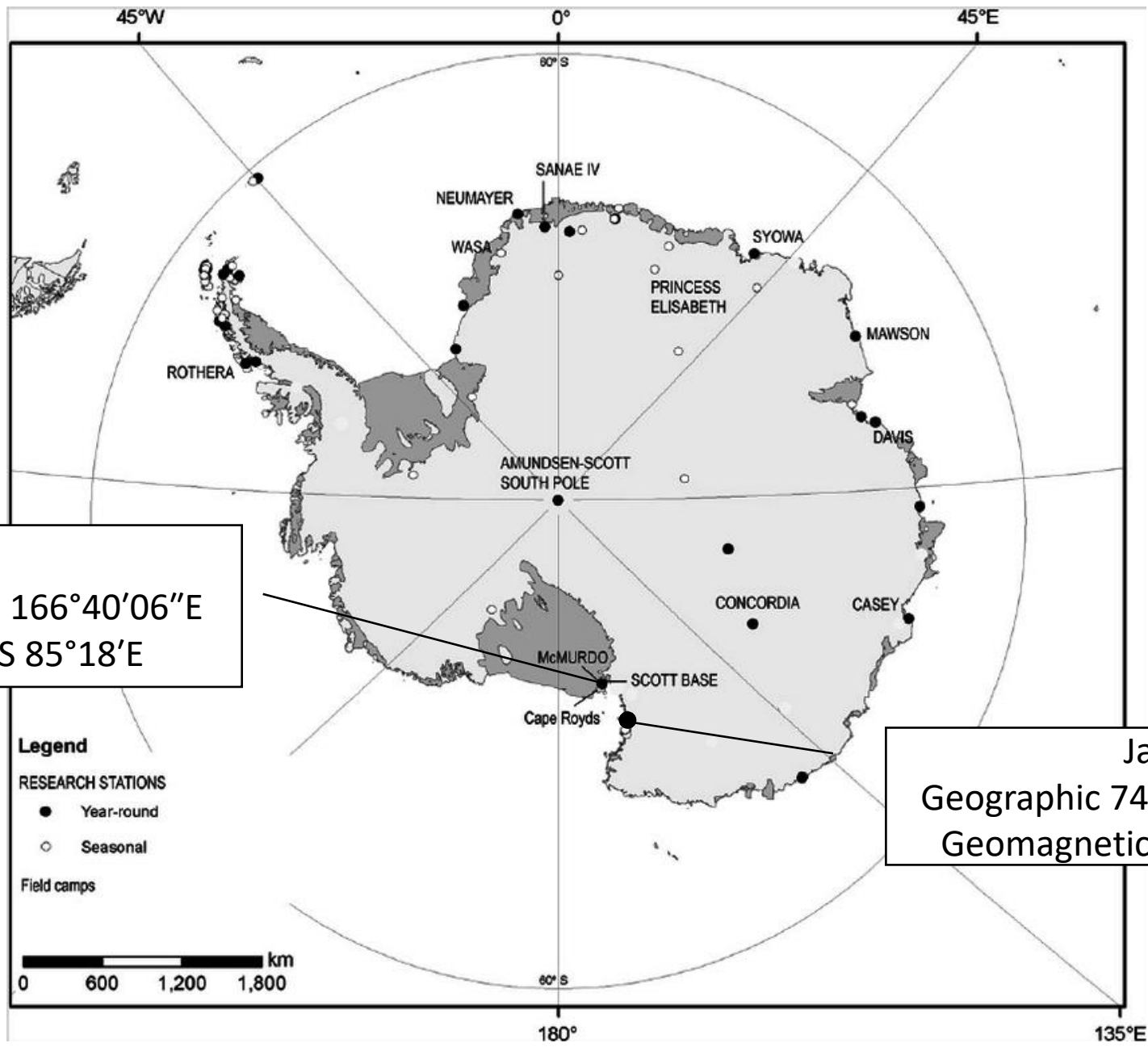
Solar Energetic Particles (SEPs) and Galactic Cosmic Rays (GCRs)





courtesy: Nuntiyakul et al.

Figure 3 Standard Neutron Monitor



McMurdo
 Geographic $77^{\circ}50'47''S$ $166^{\circ}40'06''E$
 Geomagnetic $77^{\circ}3'S$ $85^{\circ}18'E$

Jang Bogo
 Geographic $74^{\circ}37'26''S$ $164^{\circ}13'44''E$
 Geomagnetic $78^{\circ}58.8'S$ $72^{\circ}22.8'E$

McMurdo and Jang Bogo stations



Figure 1 Bird-eye view of McMurdo Station (courtesy: nmdb database)

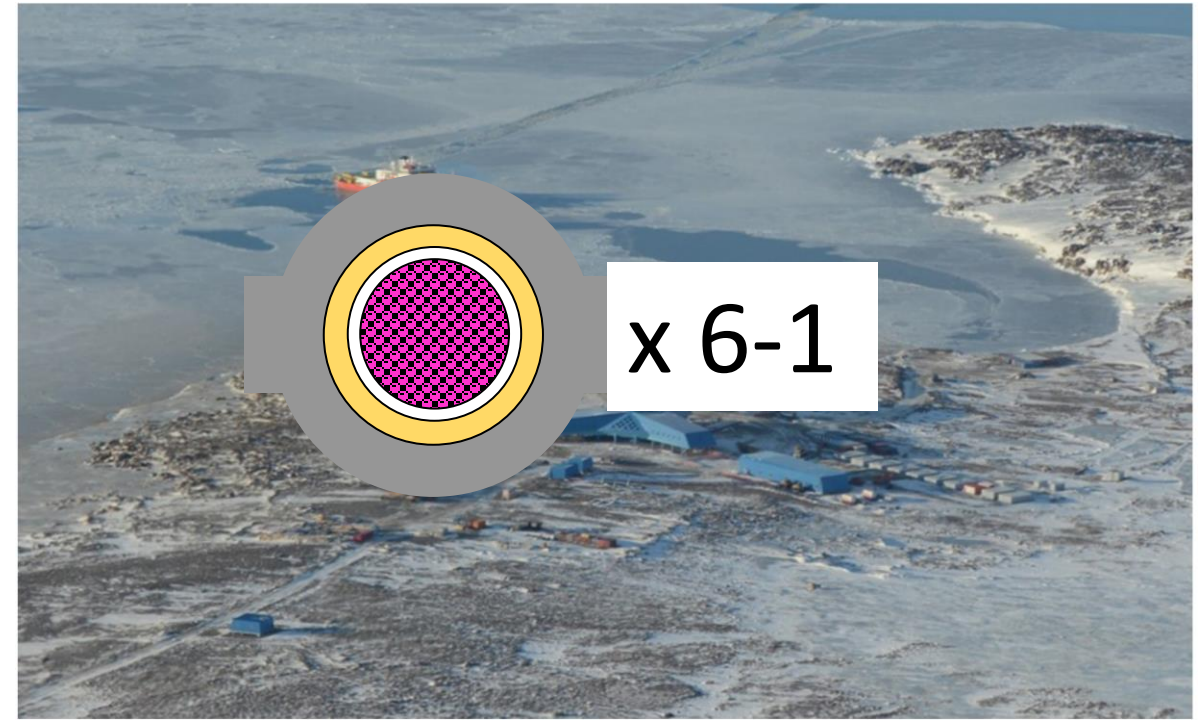


Figure 2 Bird-eye view of Jang Bogo Station (courtesy: KOPRI)

McMurdo and Jang Bogo stations



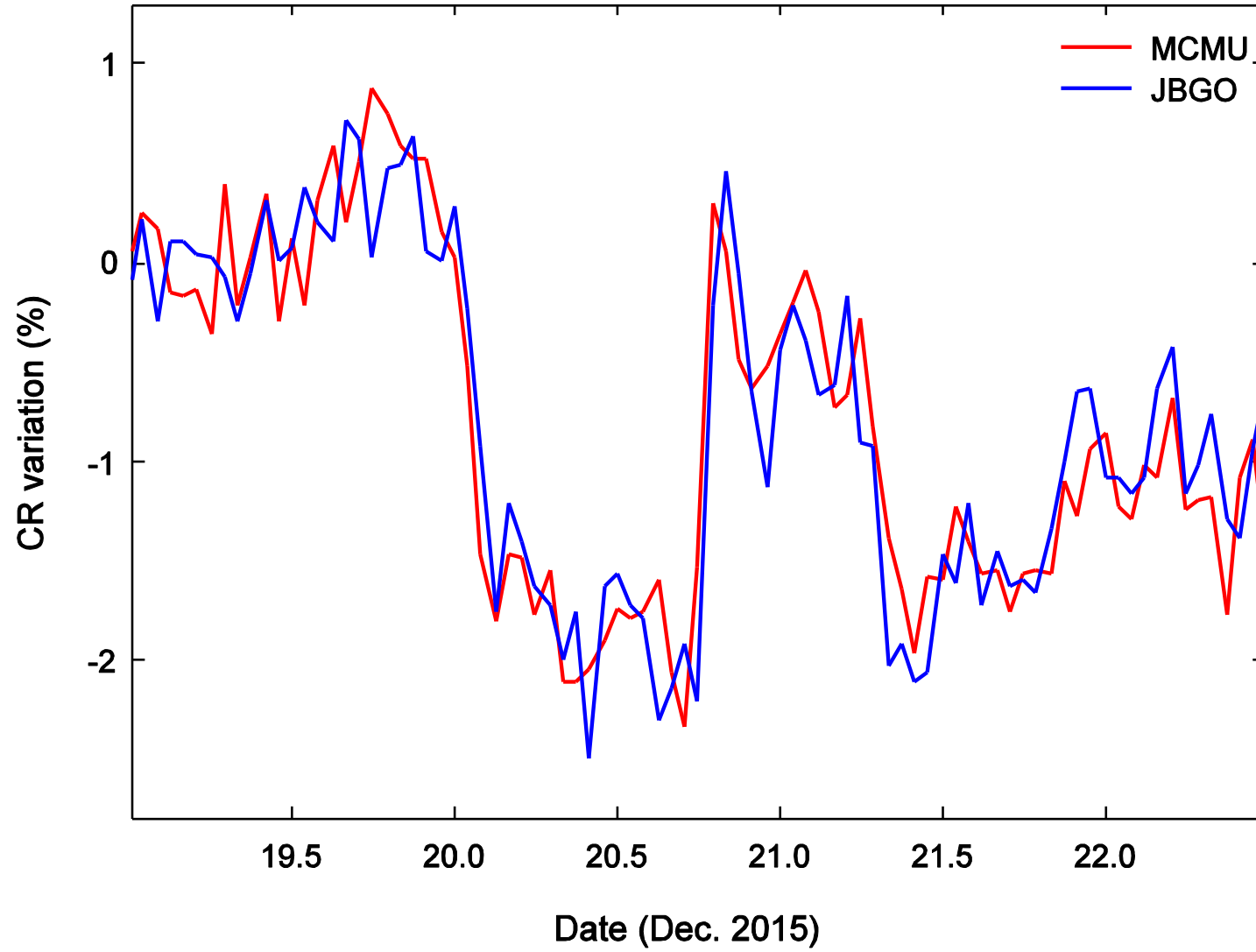
[Figure 4](#) 12-1 counter tubes located at McMurdo during December 2015 to October 2016



[Figure 5](#) 6-1 counter tubes located at Jang Bogo during December 2015 to October 2016

Data during December 2015 to January 2017 has been analyzed in this work!

Relative count at Forbush decrease



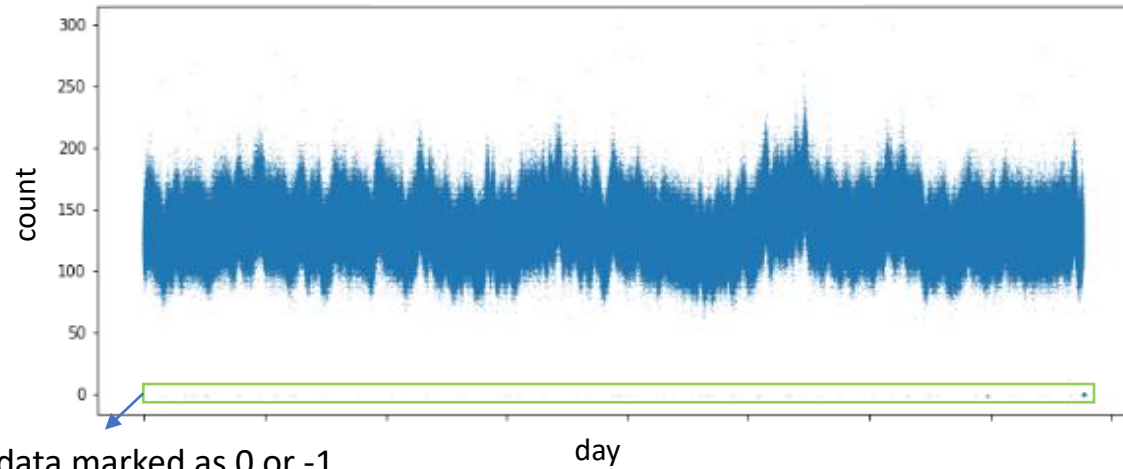
Data correction and cleanup

P_0 is defined for each stations

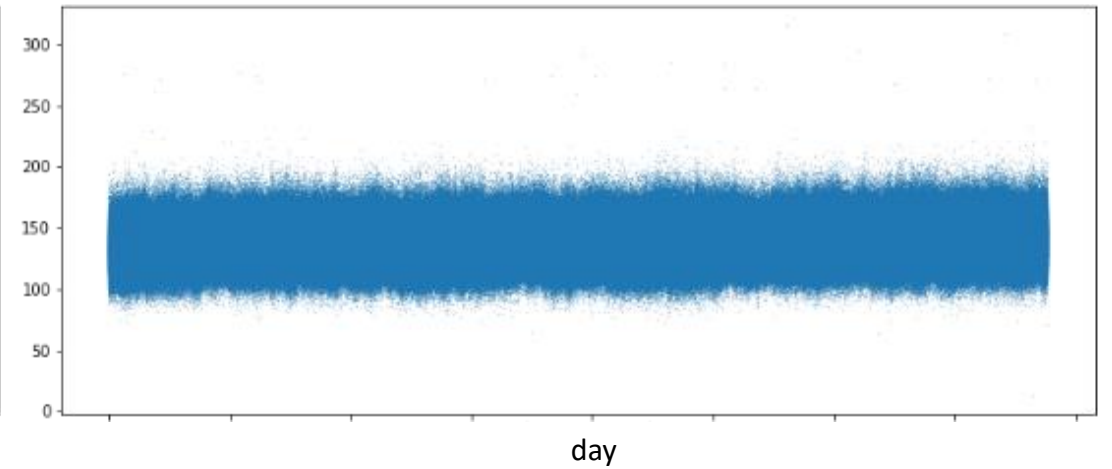
Uncorrected count (c_i^*)

$$c_i = c_i^* e^{-\beta(P-P_0)}$$

Corrected count c_i

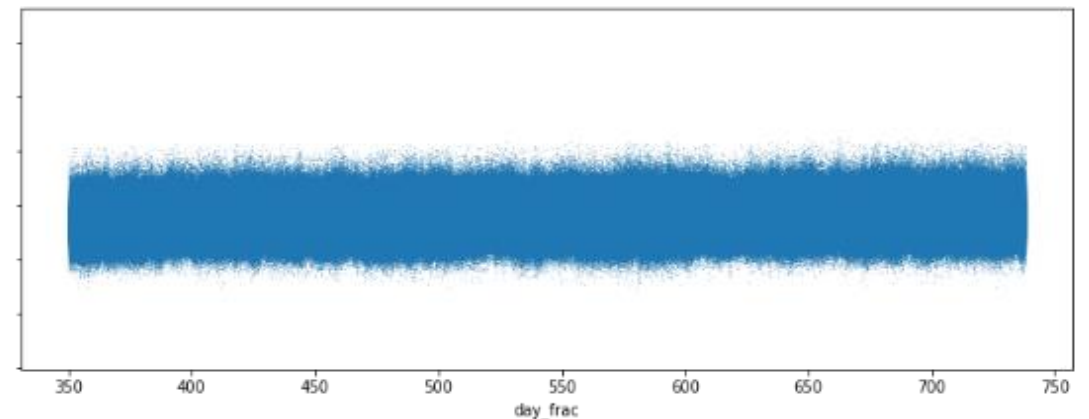
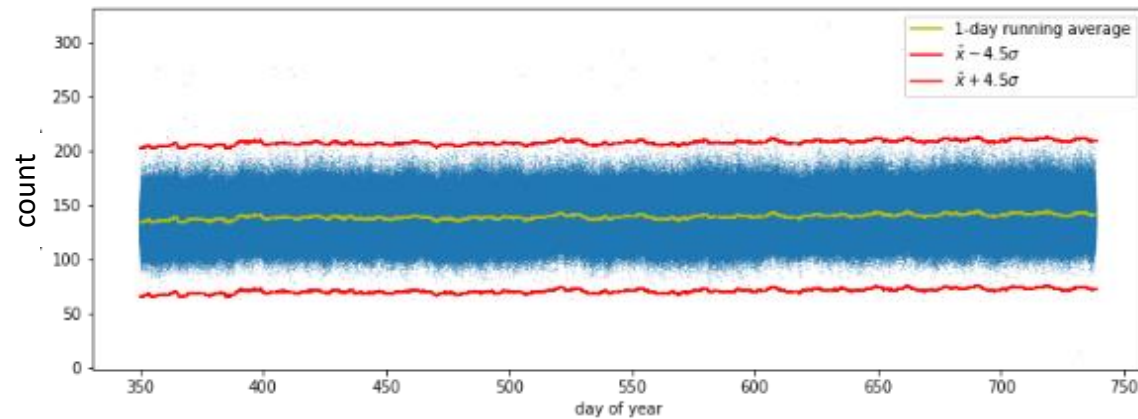


Missing data marked as 0 or -1

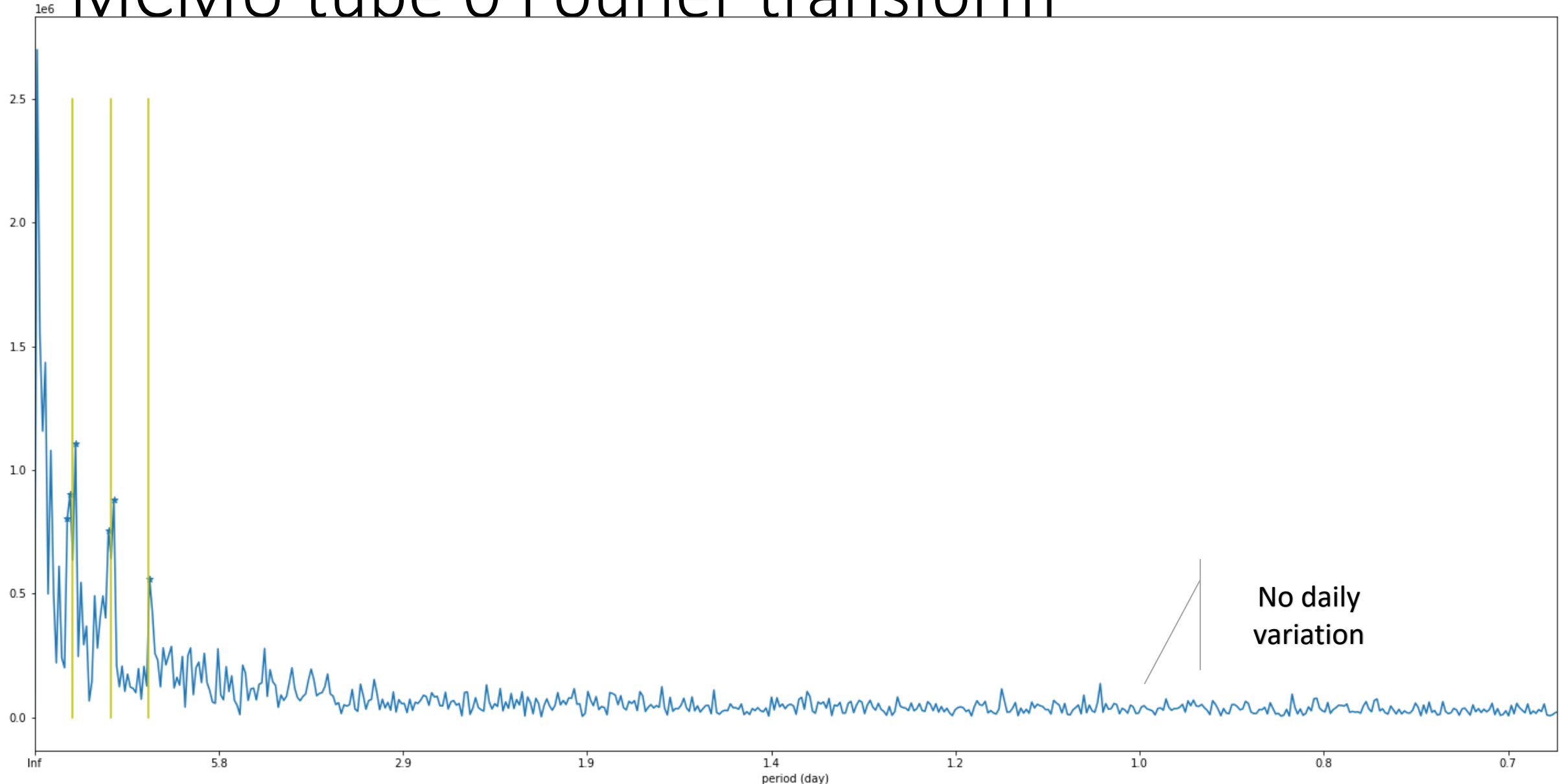


Corrected count c_i

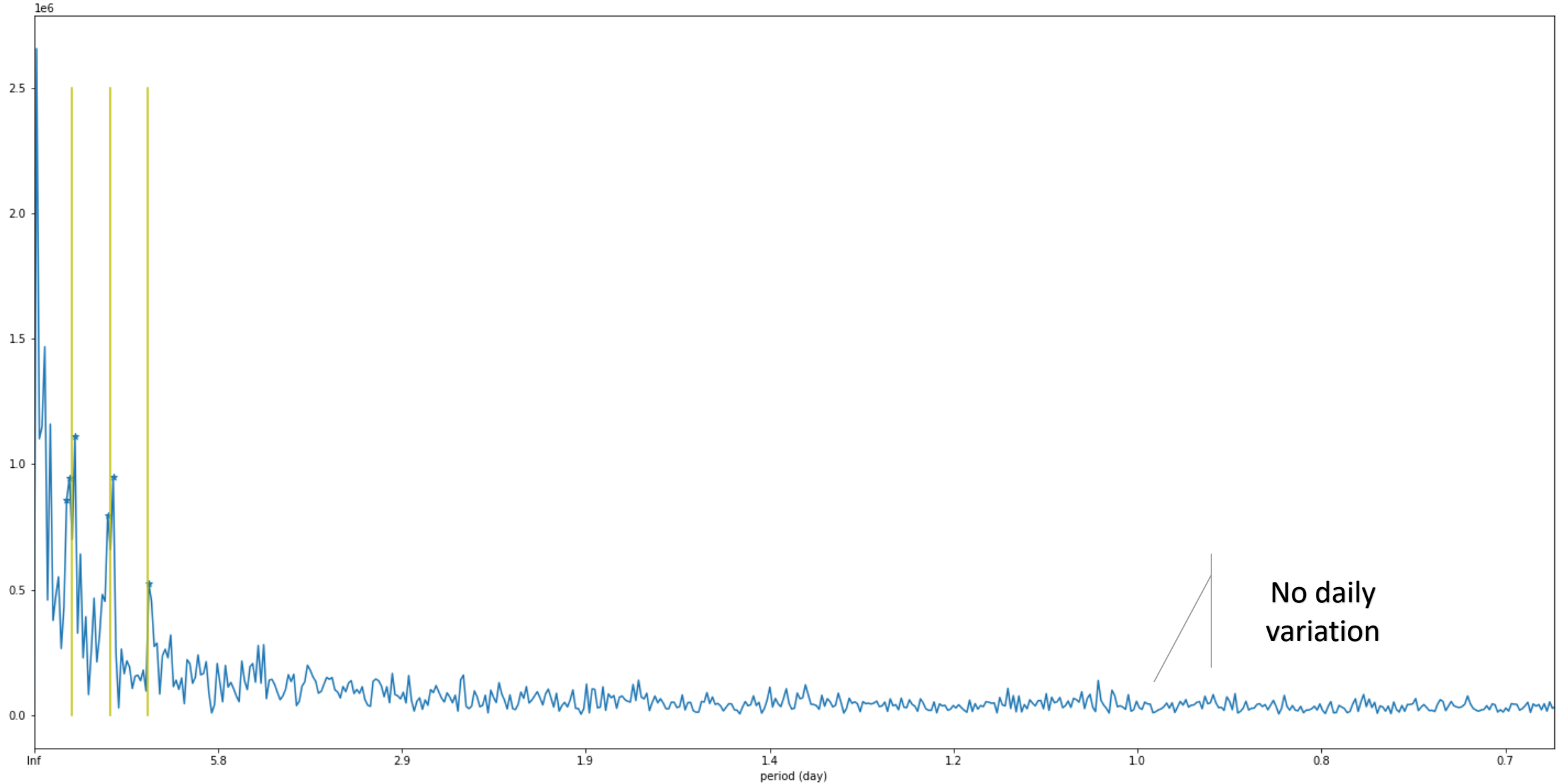
Corrected count c_i w/o outlier



MCMU tube 0 Fourier transform

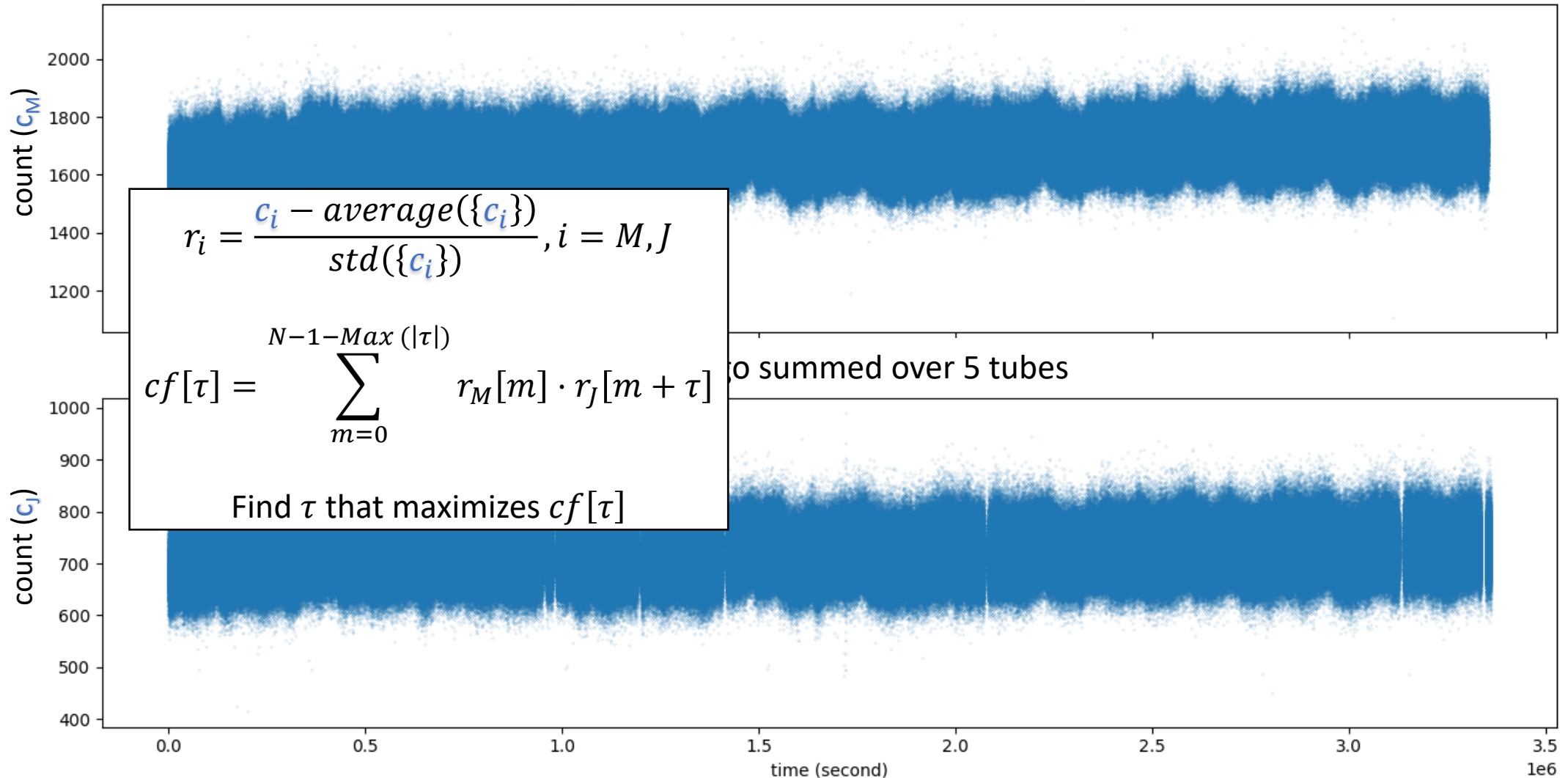


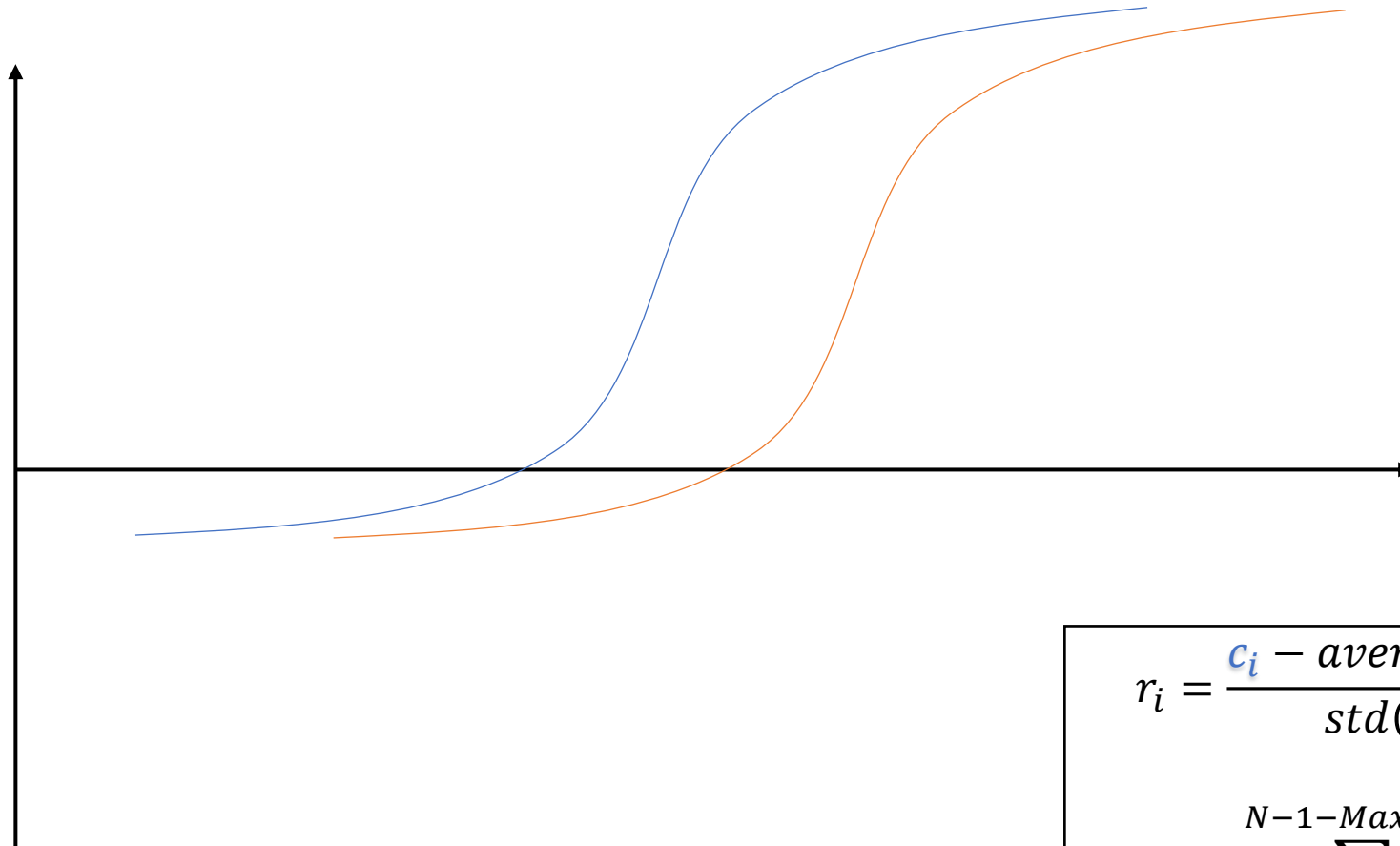
JBGO tube 0 Fourier transform



Whole station count

McMurdo summed over 11 tubes

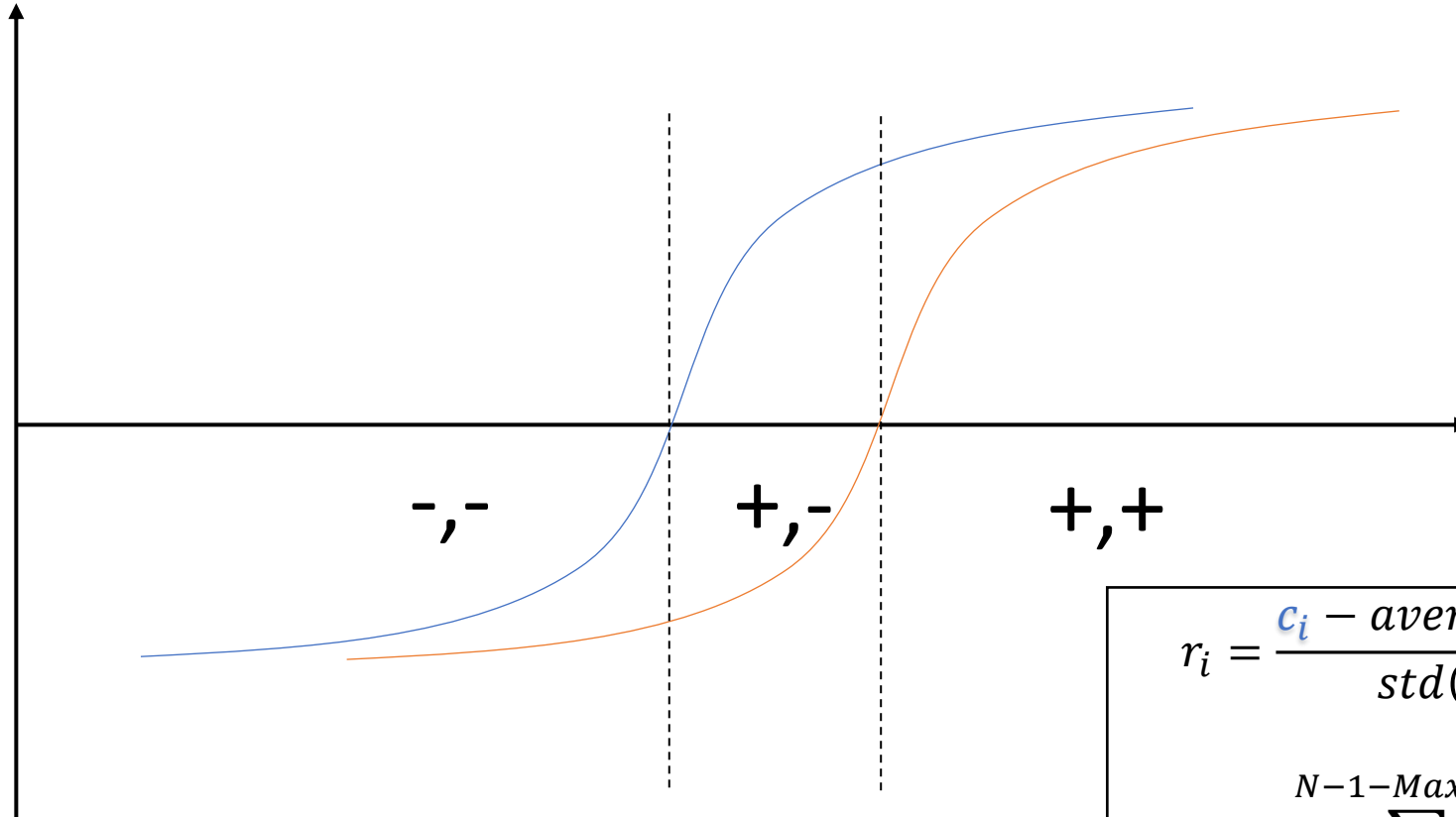




$$r_i = \frac{c_i - \text{average}(\{c_i\})}{\text{std}(\{c_i\})}, i = M, J$$

$$cf[\tau] = \sum_{m=0}^{N-1-\text{Max}(|\tau|)} r_M[m] \cdot r_J[m + \tau]$$

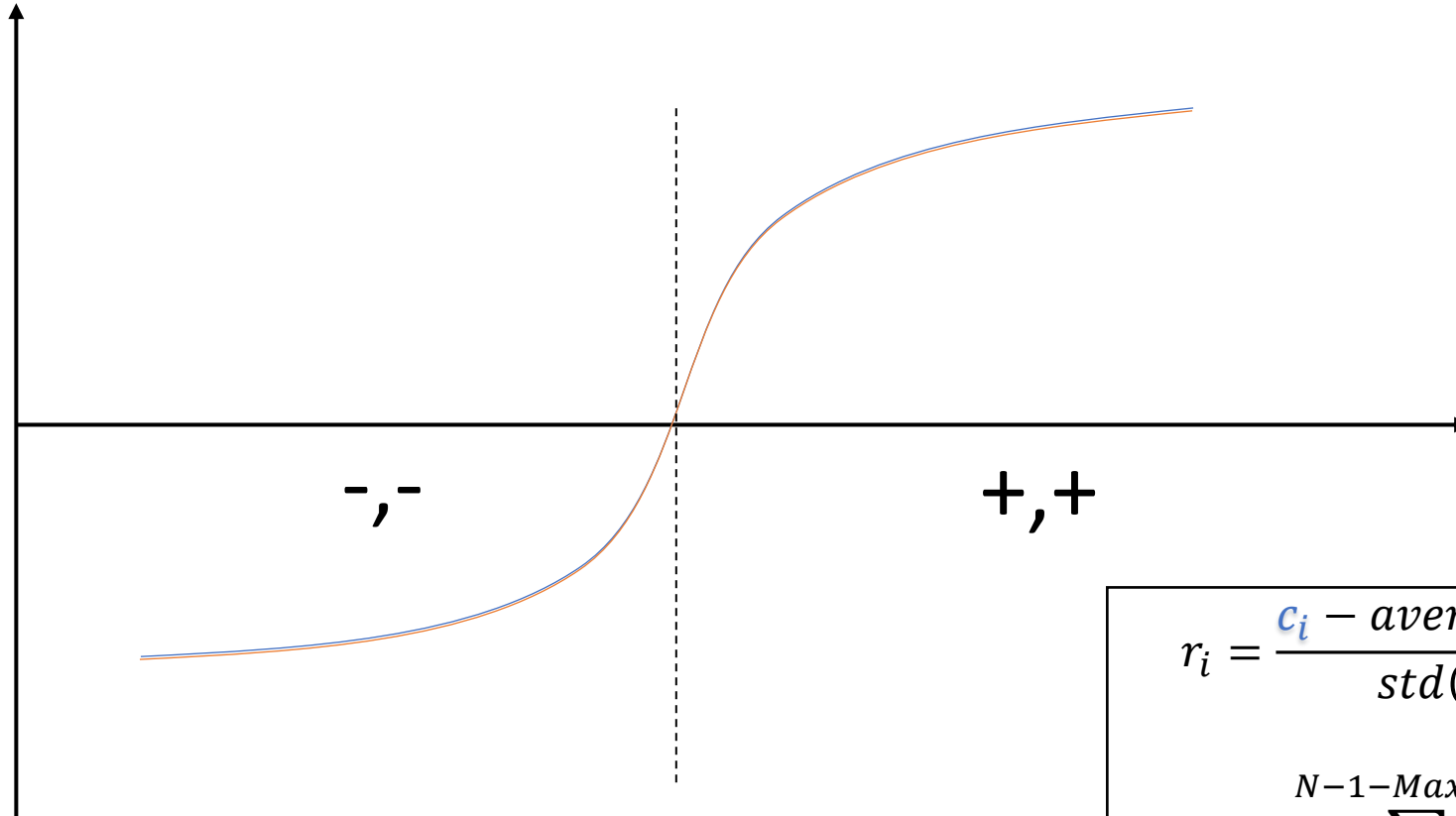
Find τ that maximizes $cf[\tau]$



$$r_i = \frac{c_i - \text{average}(\{c_i\})}{\text{std}(\{c_i\})}, i = M, J$$

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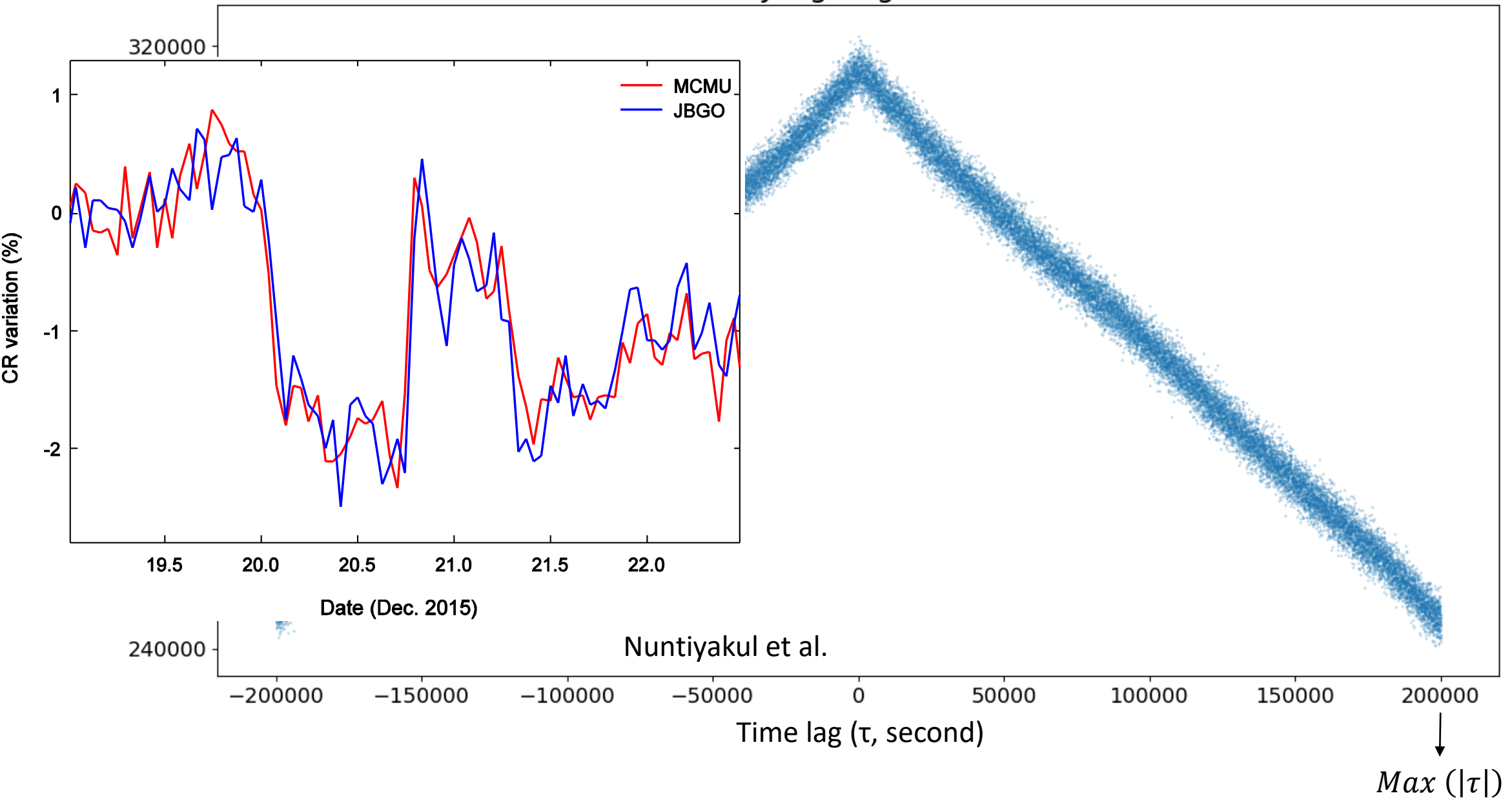


$$r_i = \frac{c_i - \text{average}(\{c_i\})}{\text{std}(\{c_i\})}, i = M, J$$

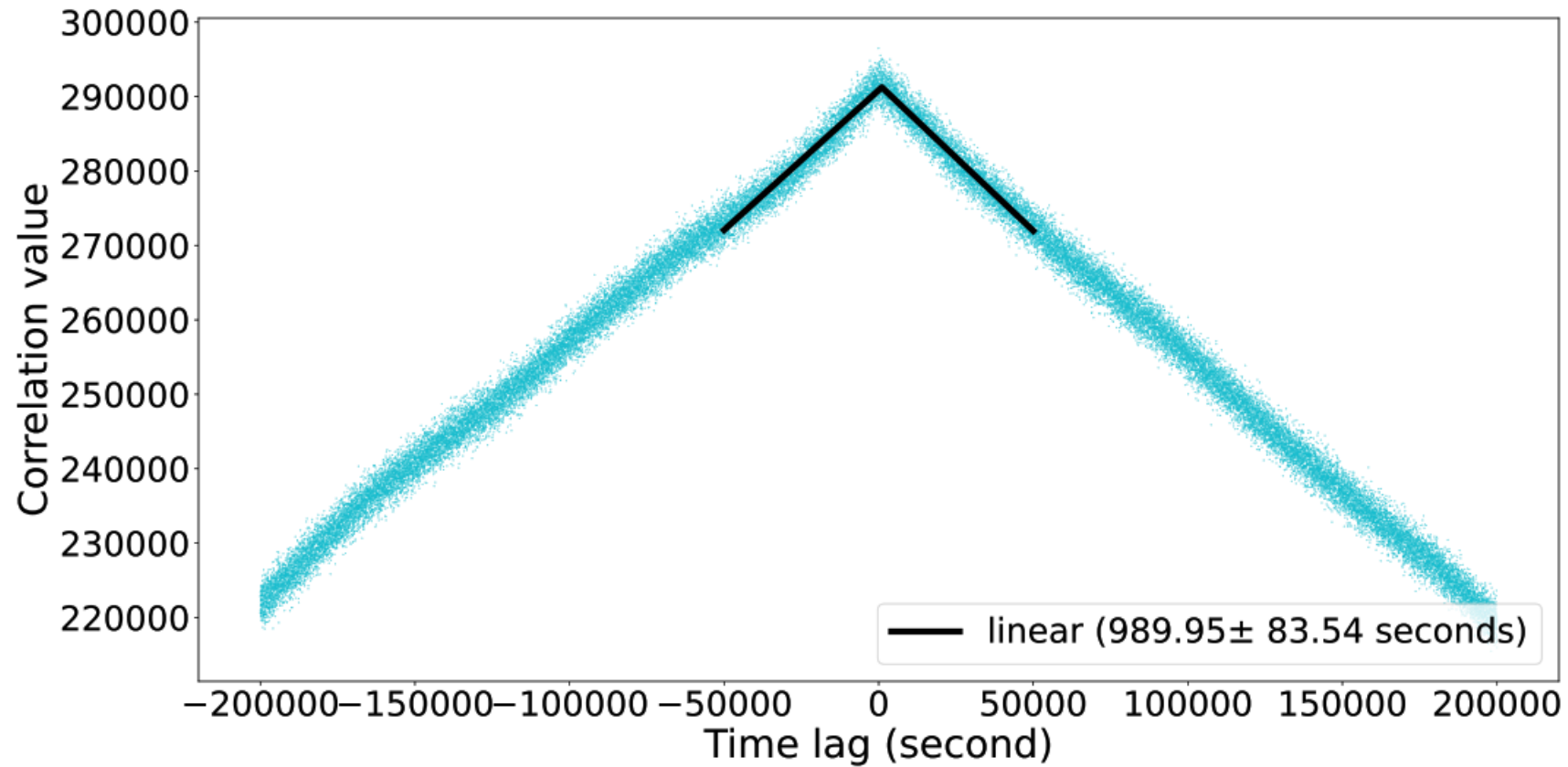
$$cf[\tau] = \sum_{m=0}^{N-1-\text{Max}(|\tau|)} r_M[m] \cdot r_J[m + \tau]$$

Find τ that maximizes $cf[\tau]$

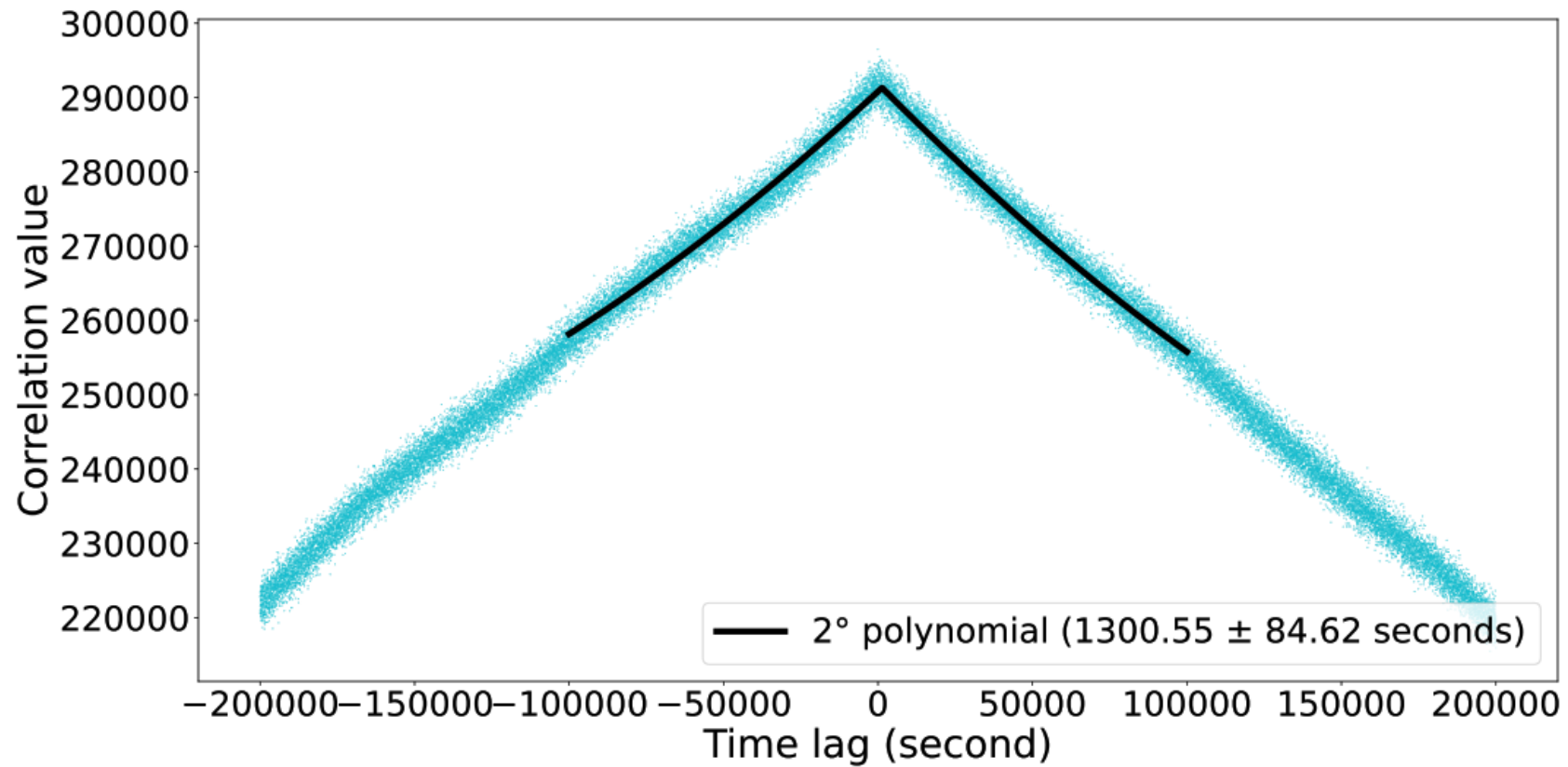
McMurdo vs Jang Bogo, whole dataset



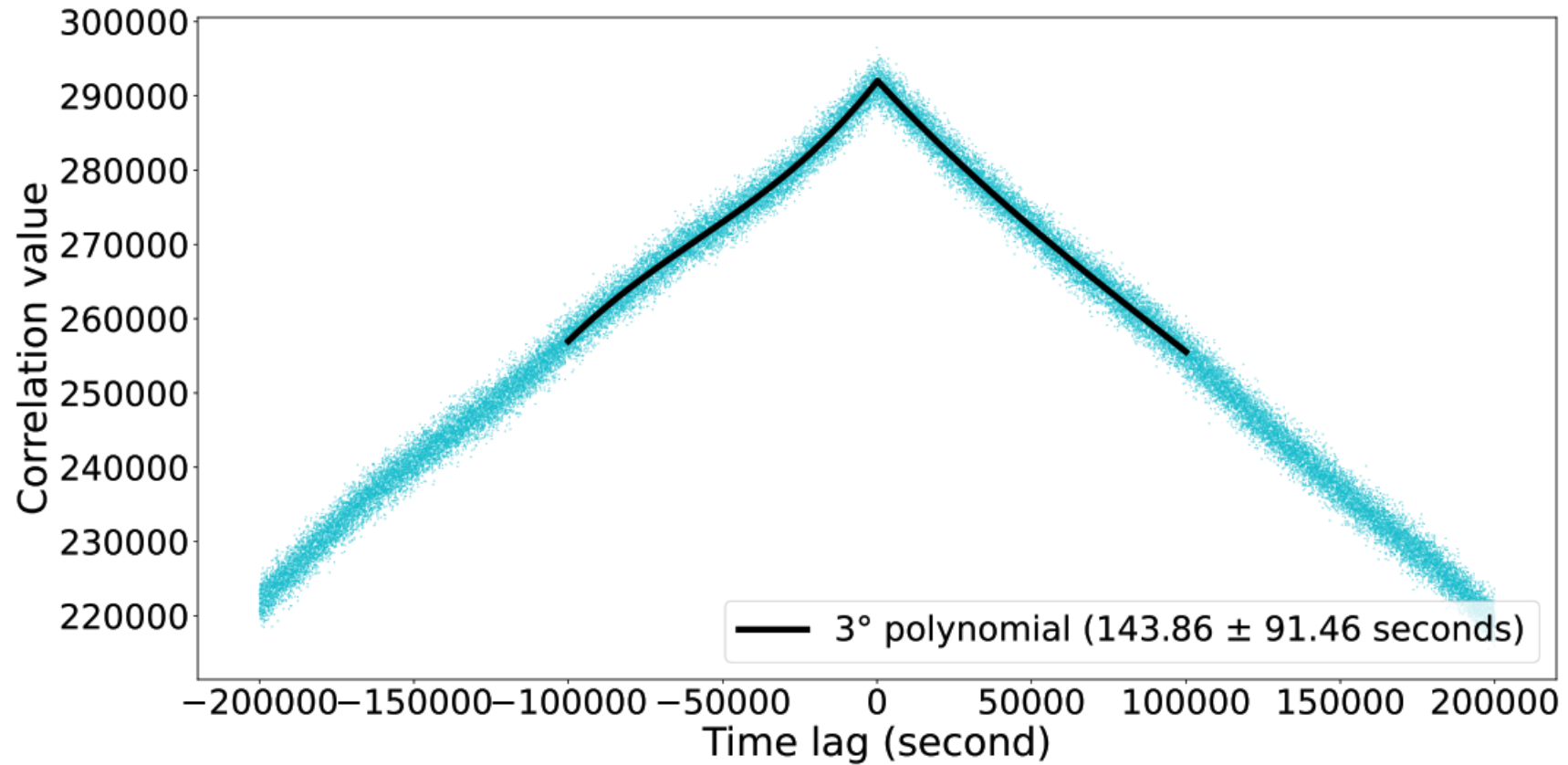
Linear, whole station



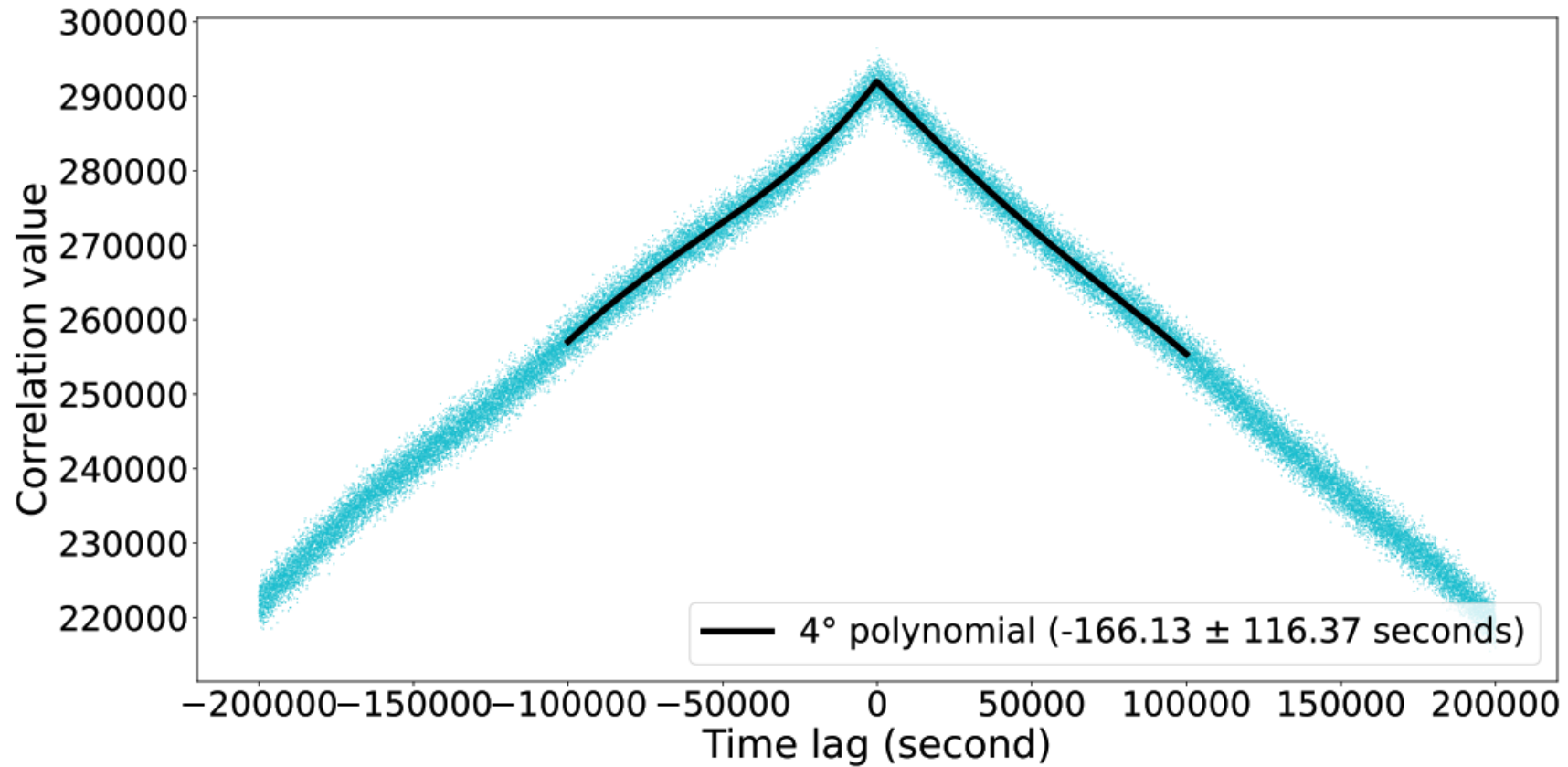
2° polynomial, whole station



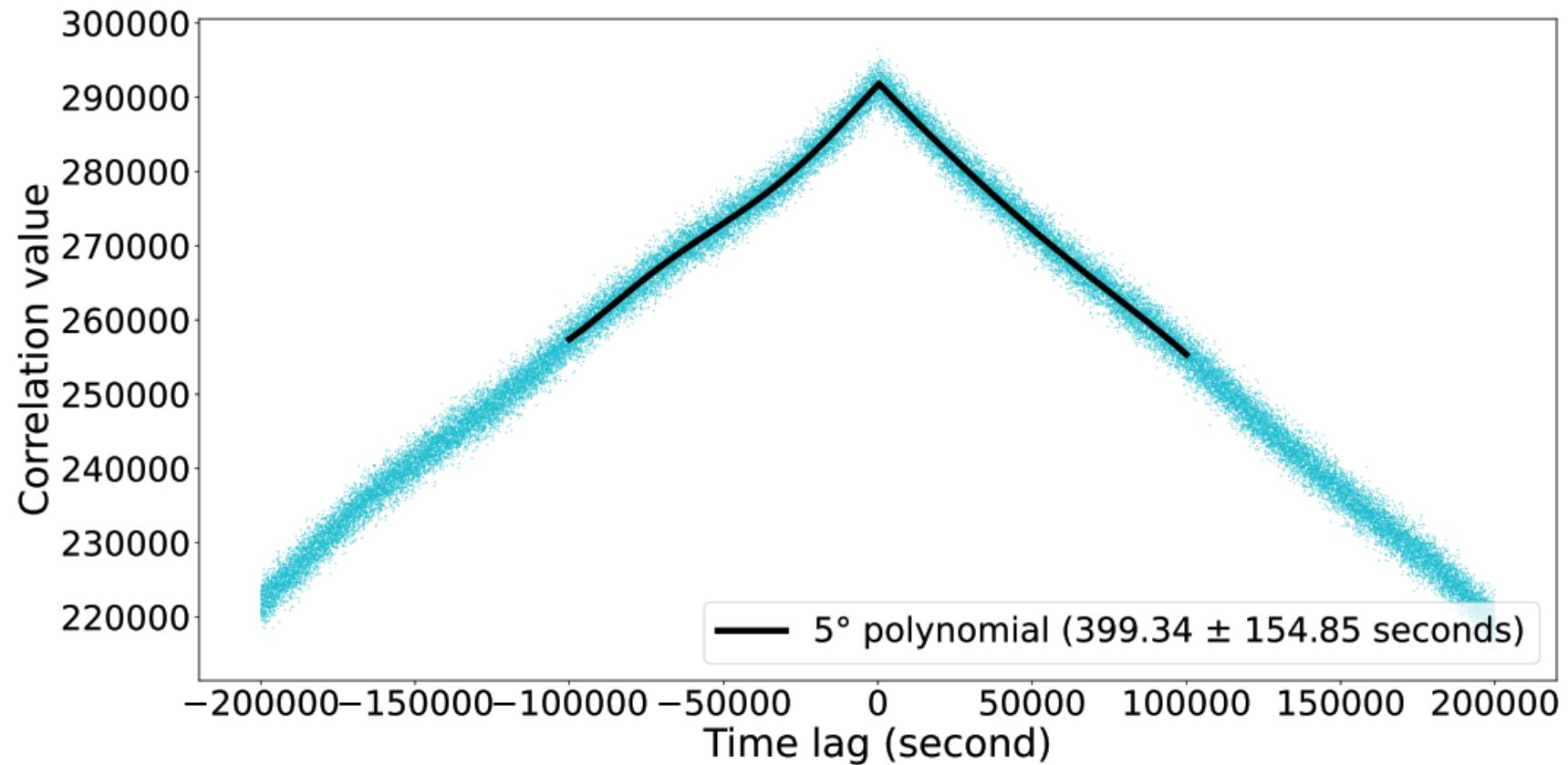
3° polynomial, whole station



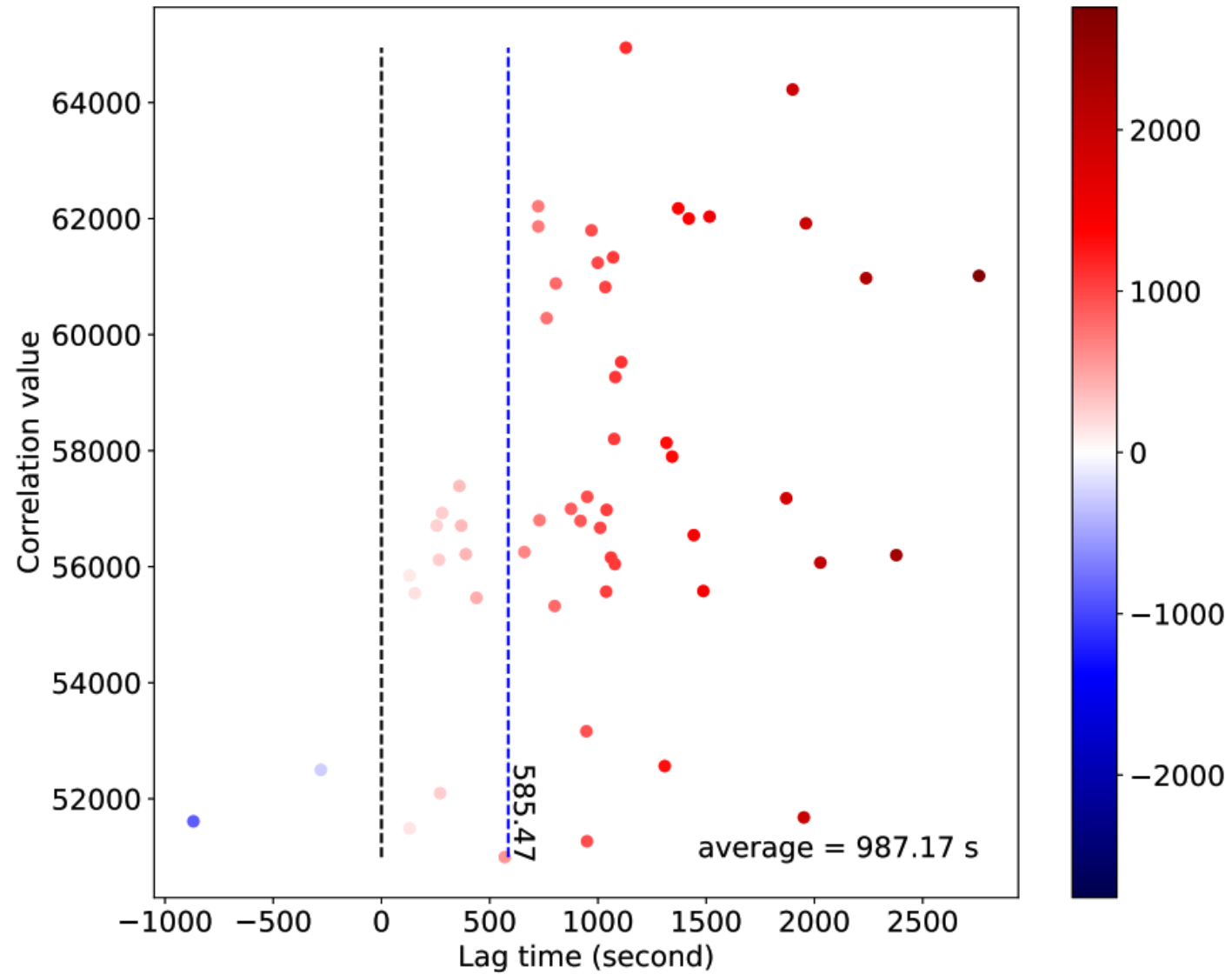
4° polynomial, whole station



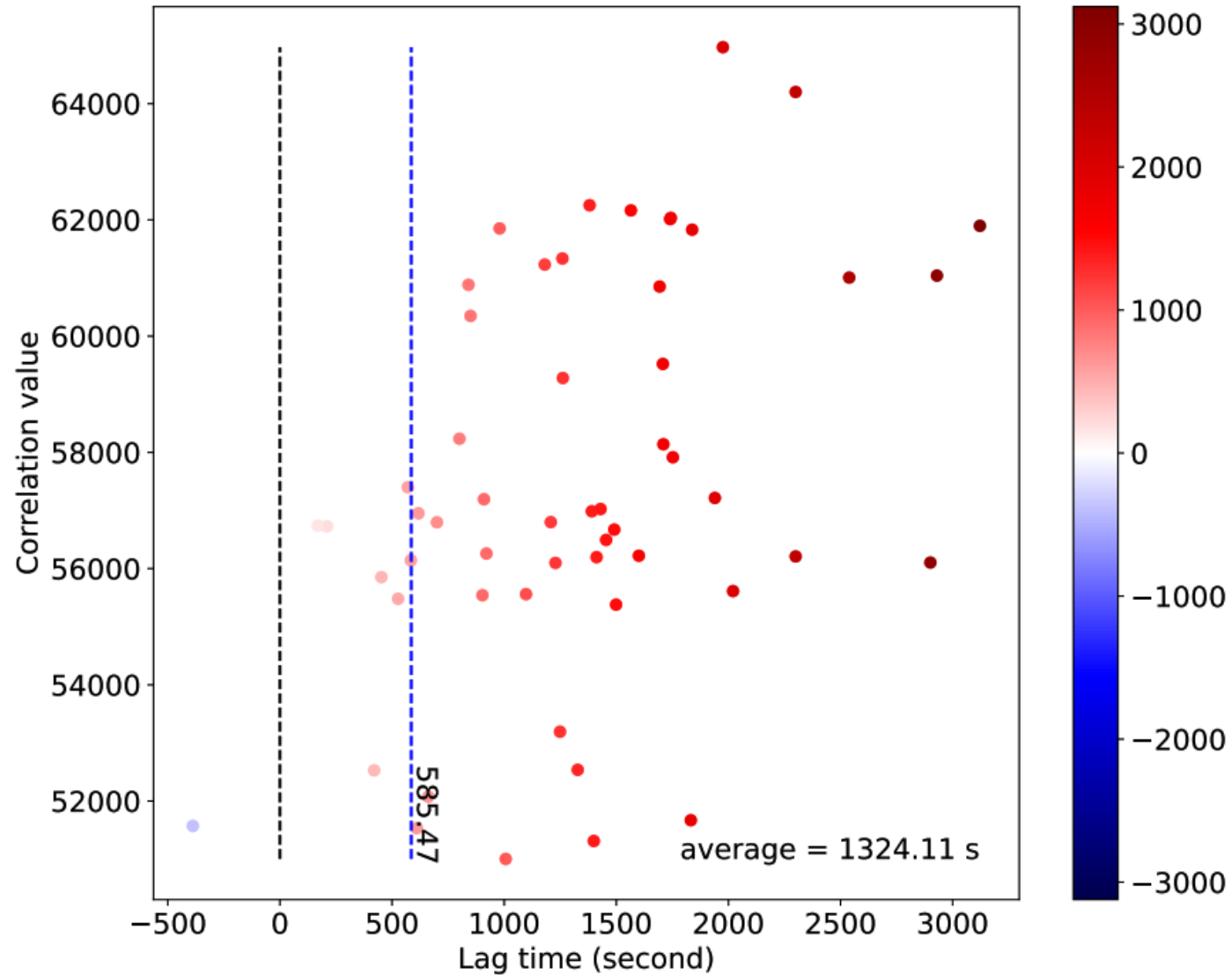
5° polynomial, whole station



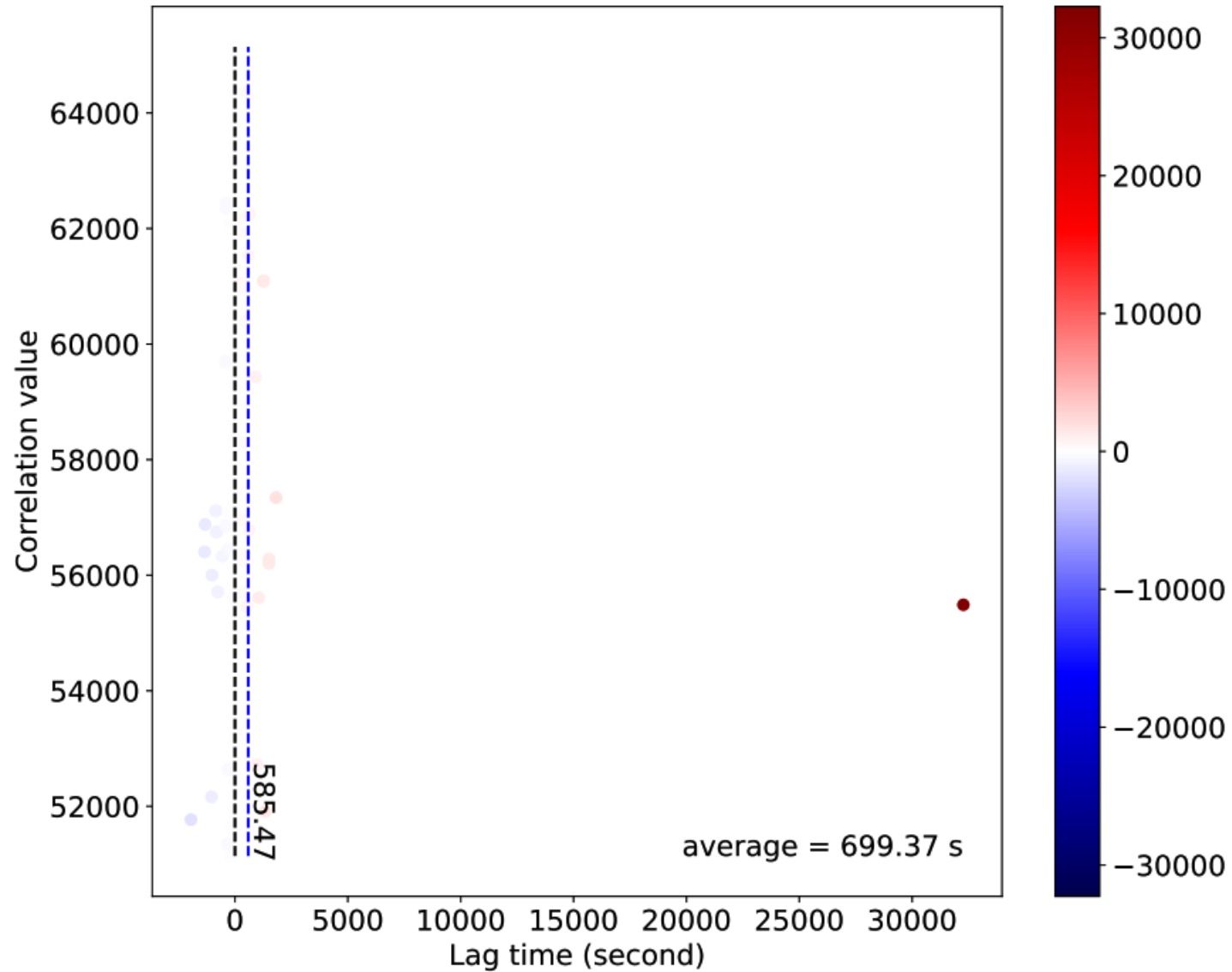
Linear, tube by tube, peak only



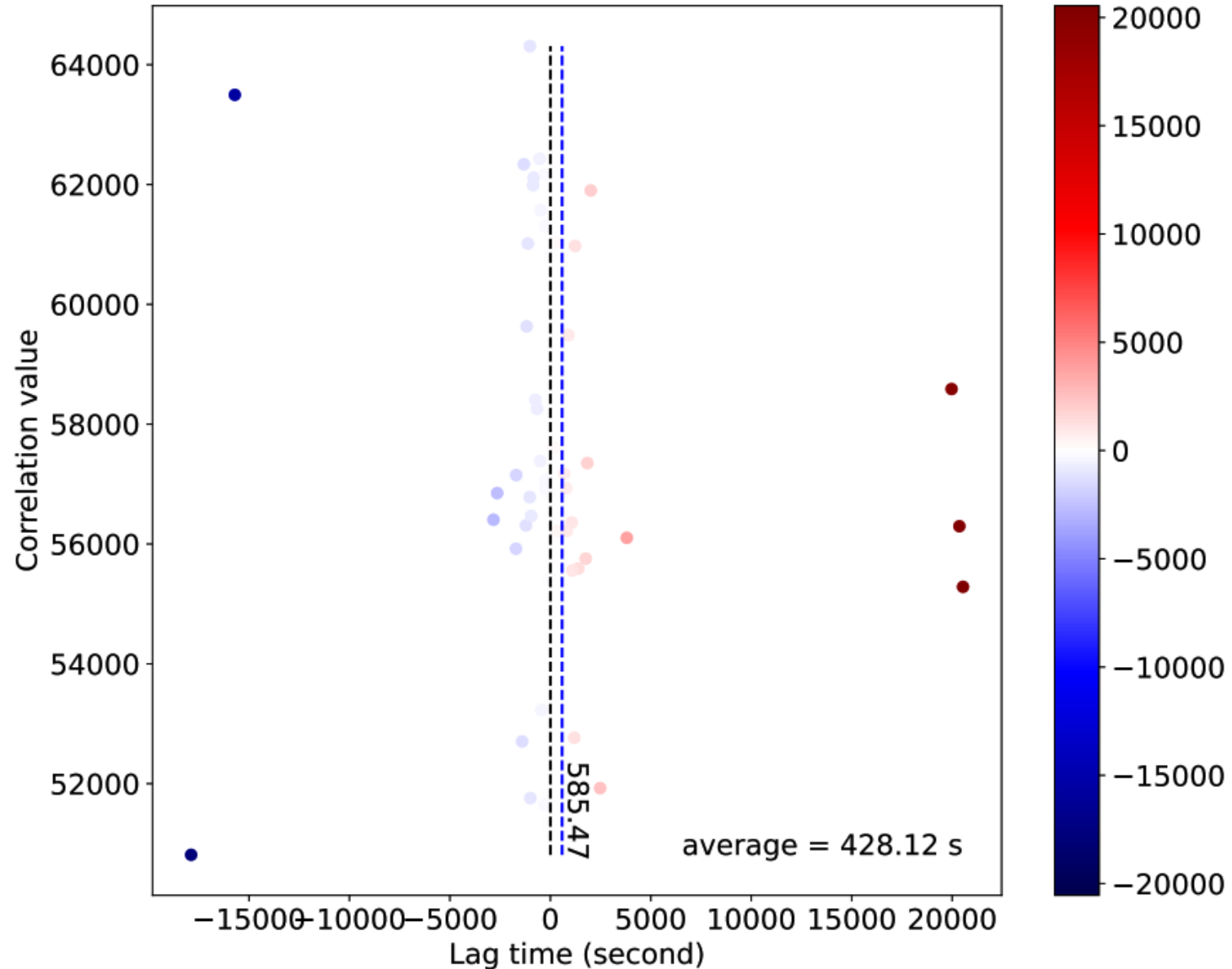
2° polynomial, tube by tube, peak only



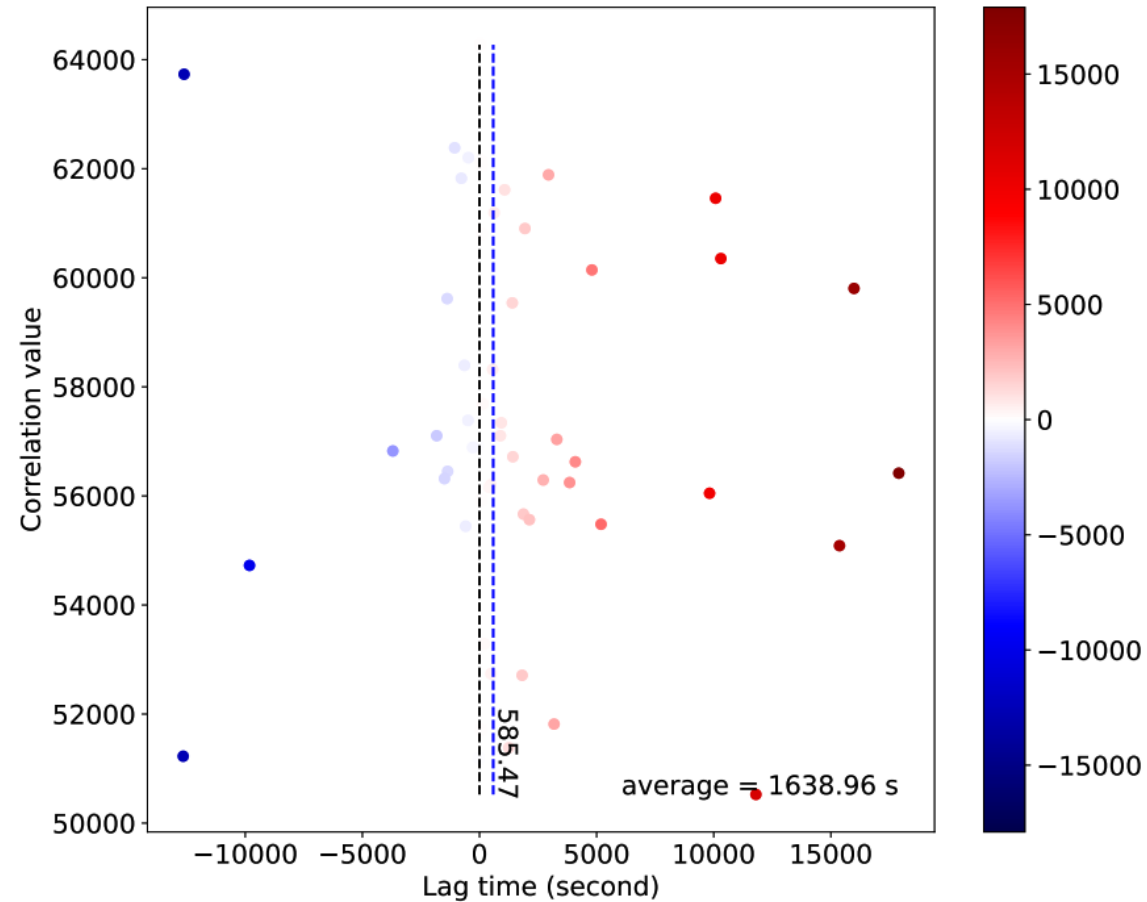
3^o polynomial, tube by tube, peak only



4^o polynomial, tube by tube, peak only



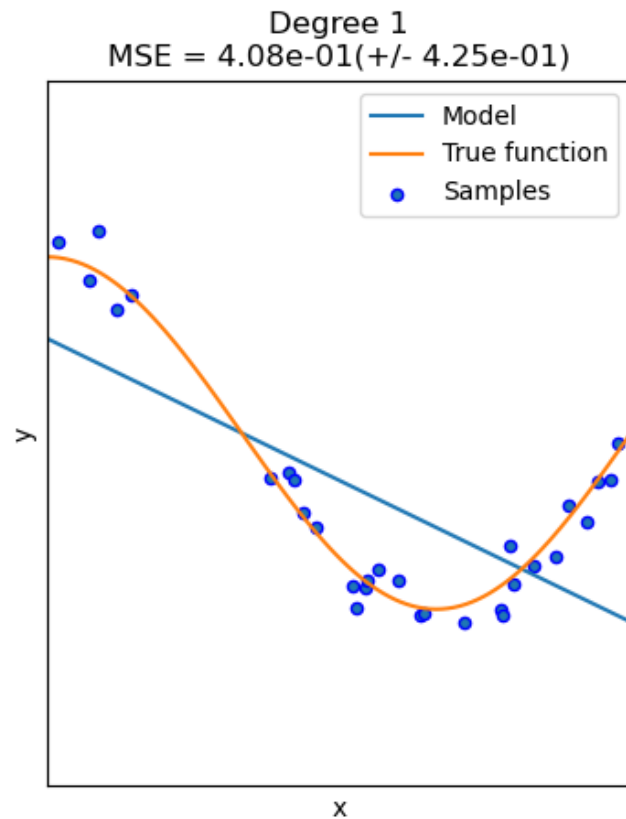
5° polynomial, tube by tube, peak only



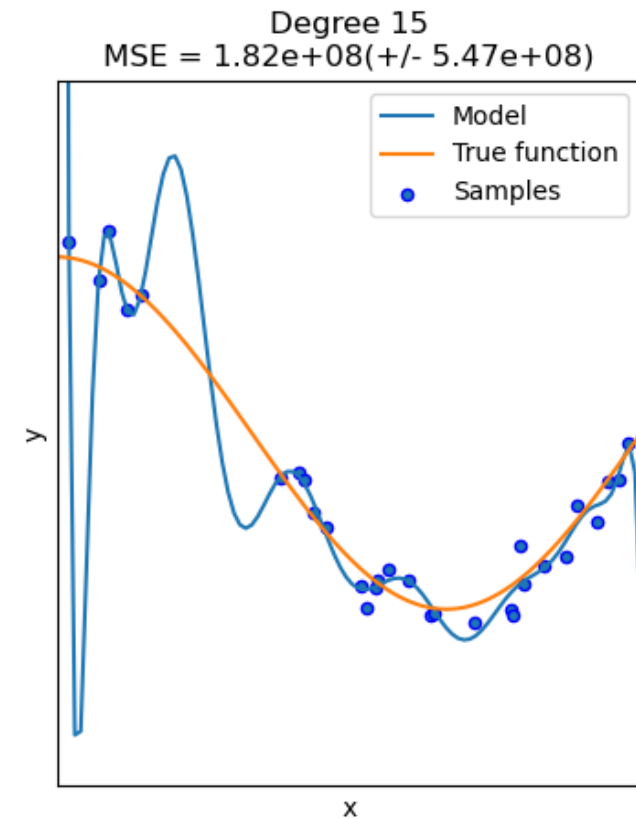
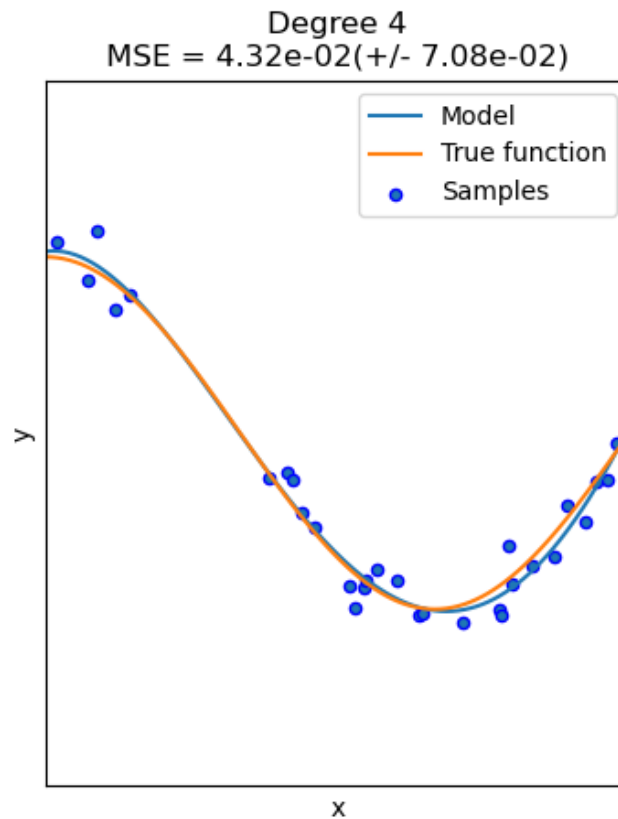
Which one?

- Introduce variation while keeping the middle value
 - By randomly removing data
- Inspired by k-fold cross-validation (k=5 in this work)

Underfitting and overfitting



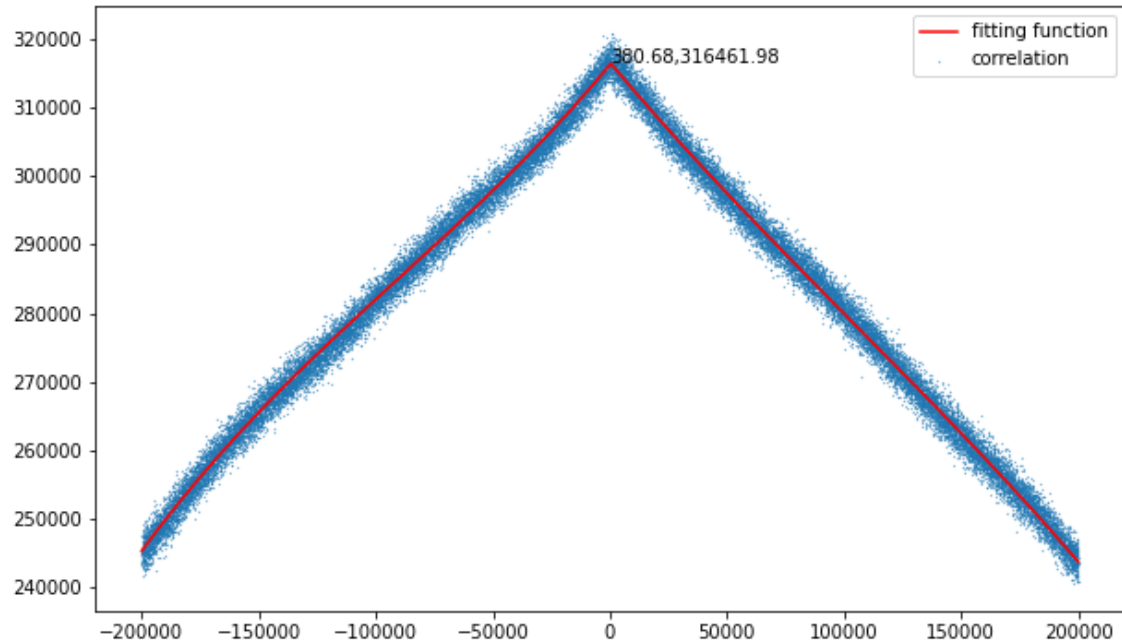
underfitting



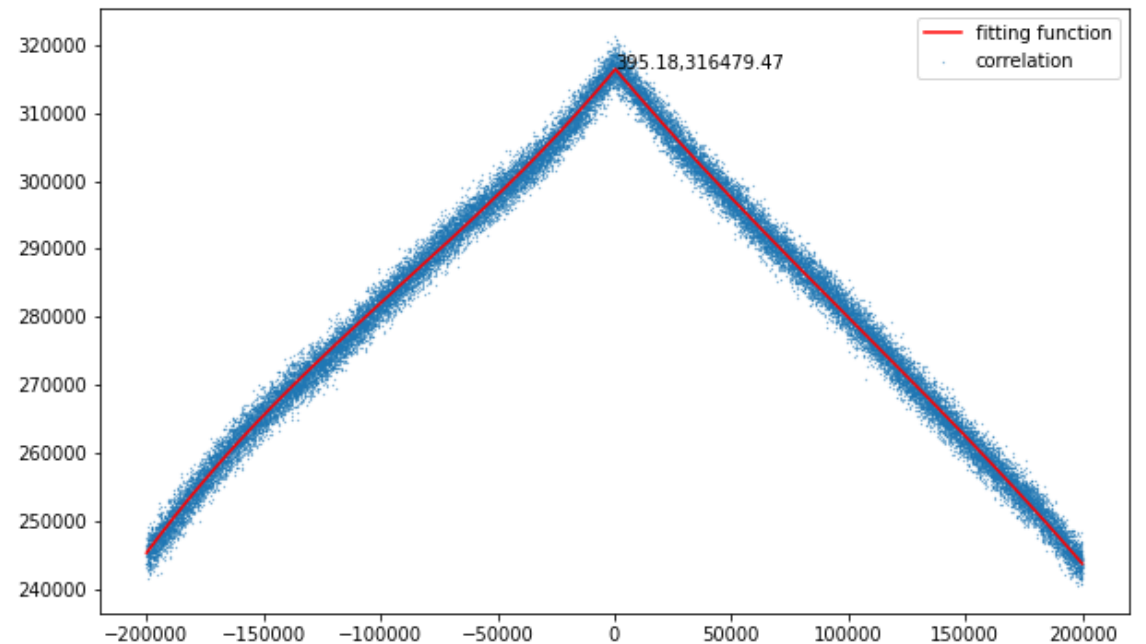
overfitting

5-fold cross-validation

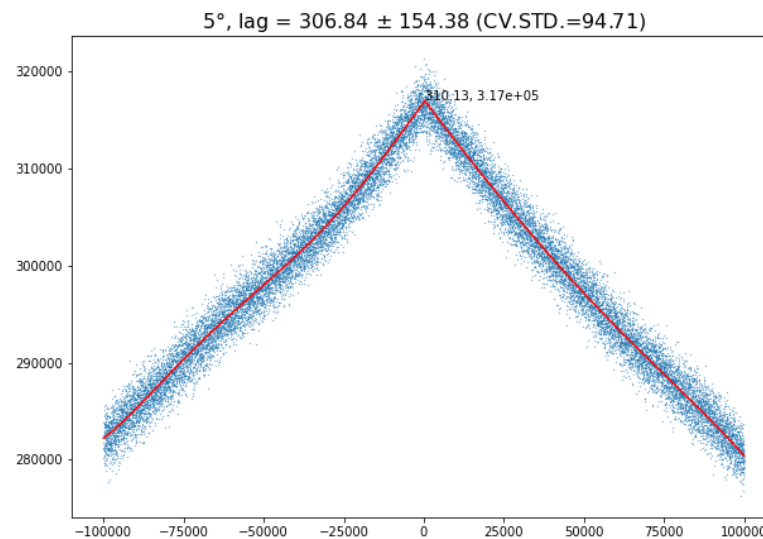
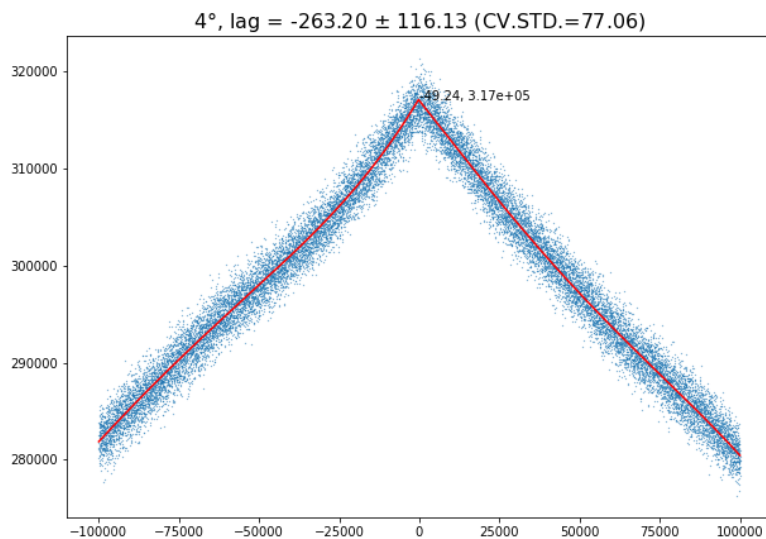
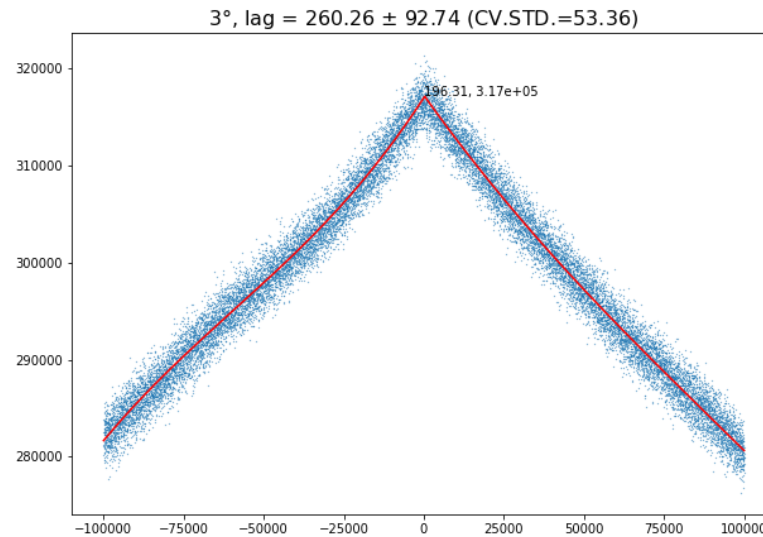
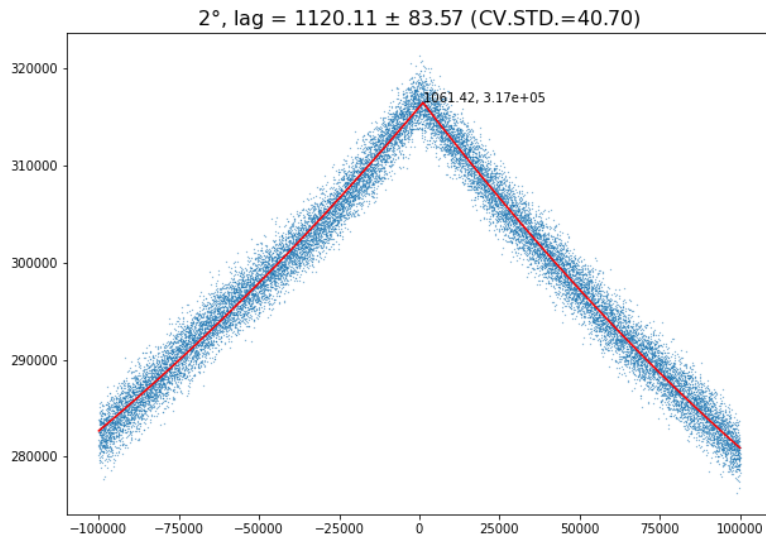
1/5 removed



other 1/5 removed



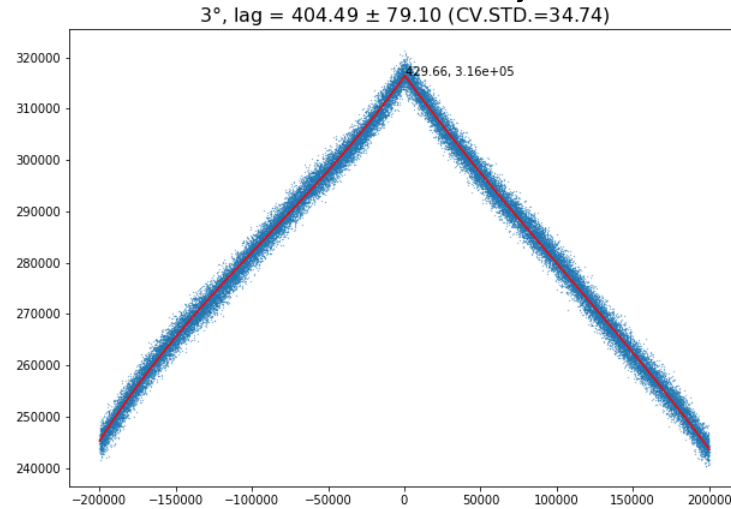
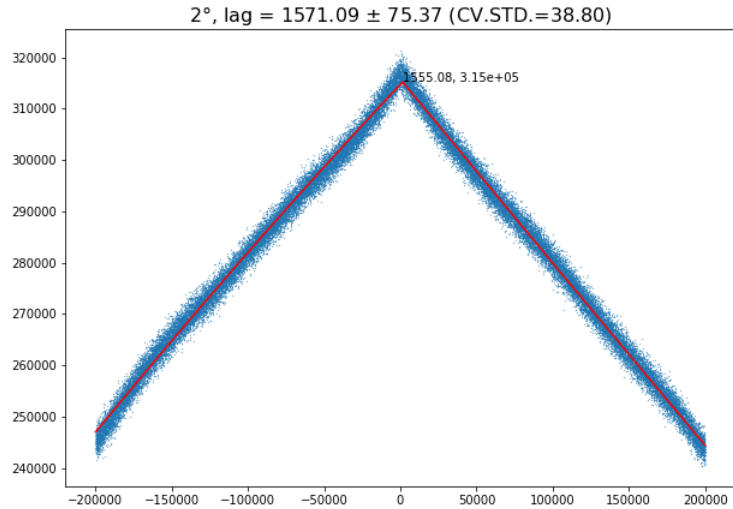
5-fold cross-validation, from -100k to 100k seconds, 1000 iterations



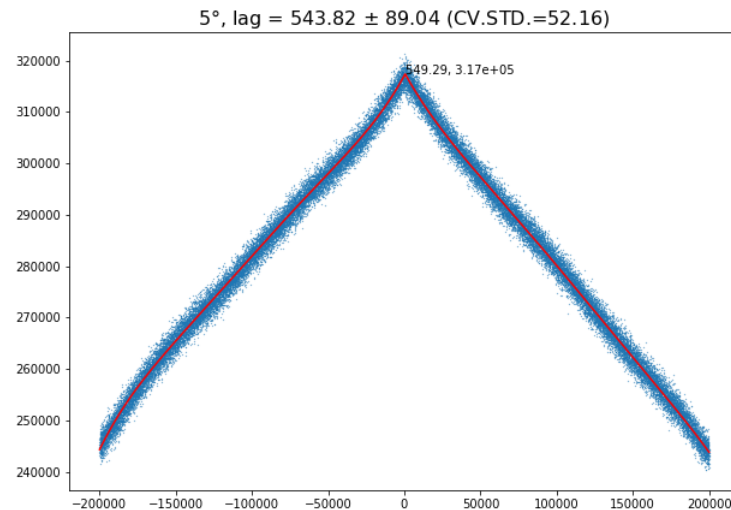
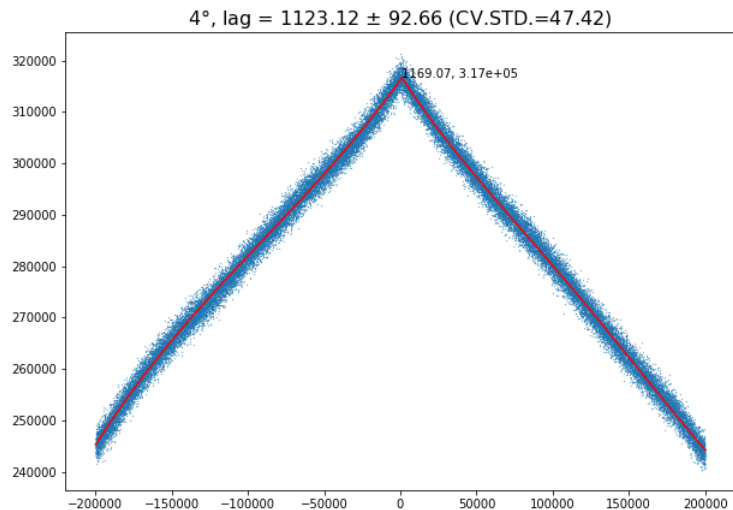
CV.STD = cross-validation STD
calculated from 5*iteration values of
 τ at peak

iteration = 1000

5-fold cross-validation, 1000 iterations from -200k to 200k seconds, 1000 iterations

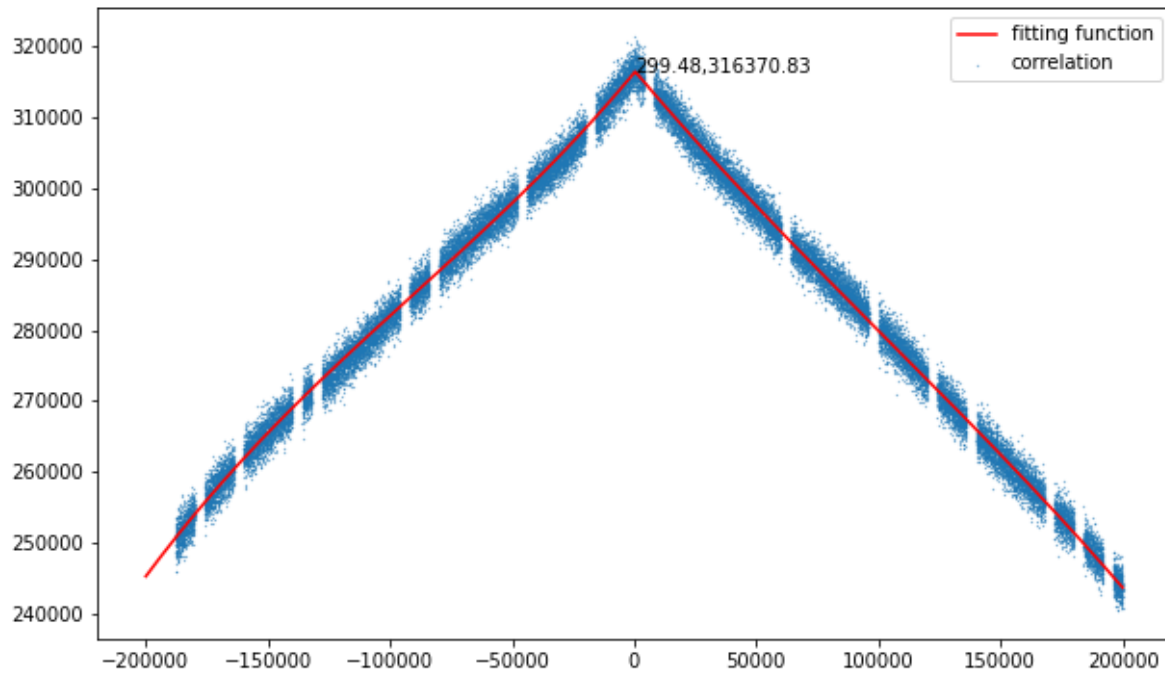


CV.STD = cross-validation STD

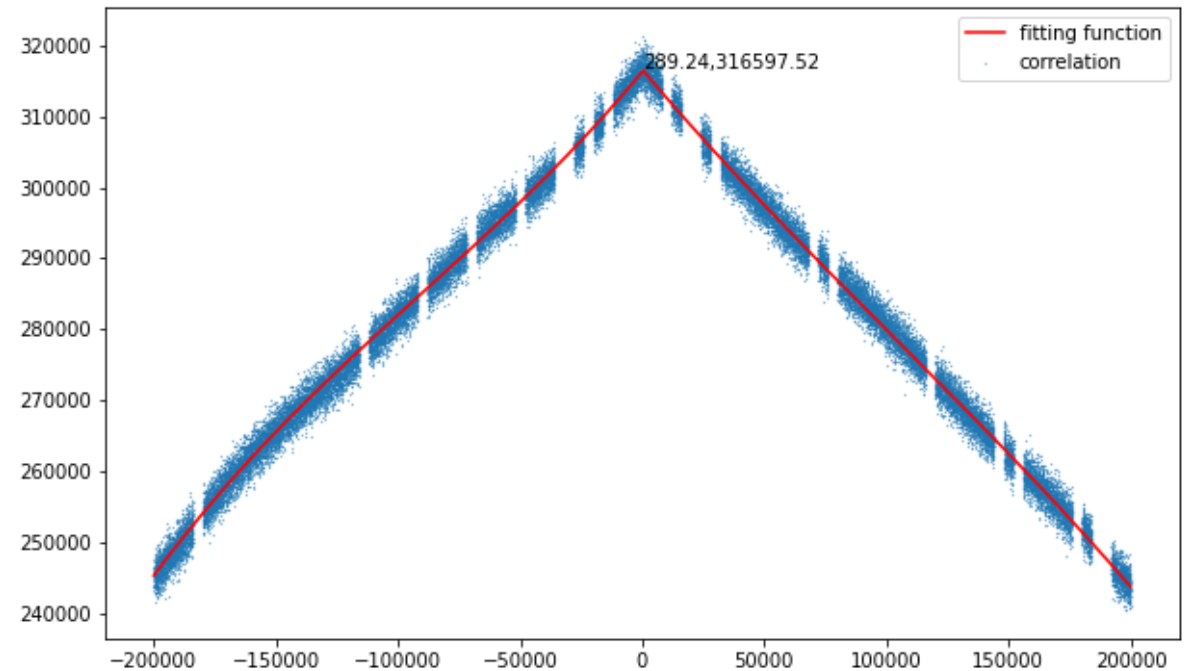


5-fold cross validation, 100 chunks

1/5 of chunks removed

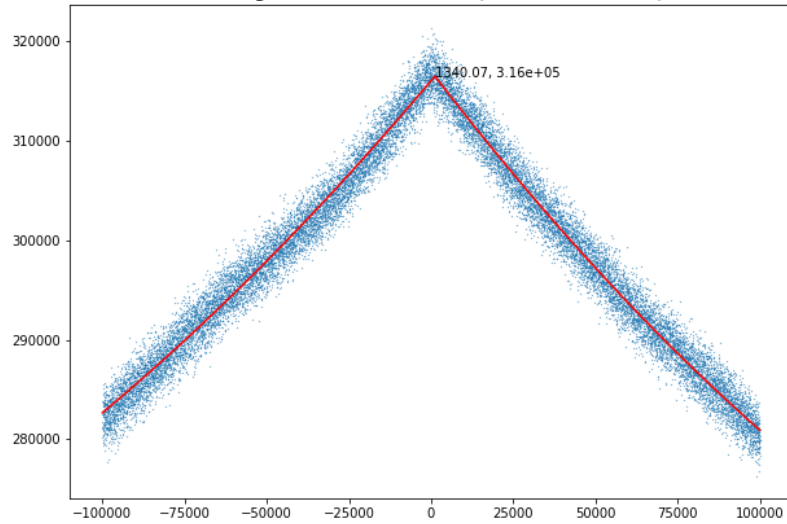


other 1/5 of chunks removed

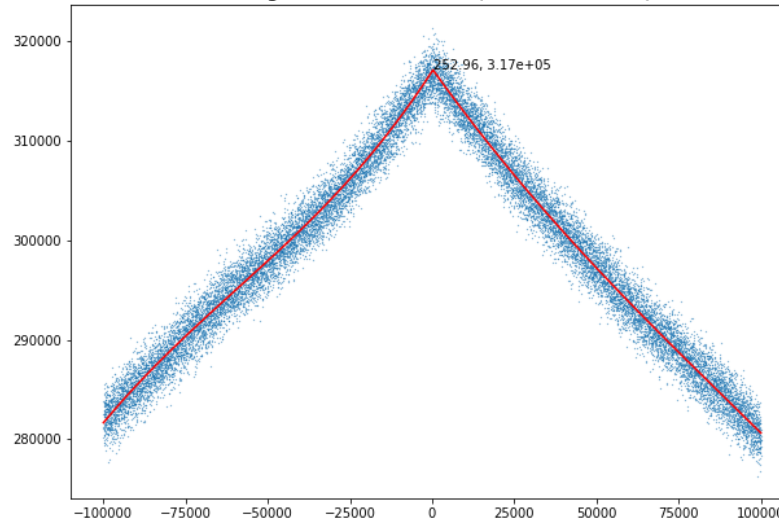


5-fold cross 5-fold cross validation, 100 chunks from -100k to 100k seconds, 1000 iterations

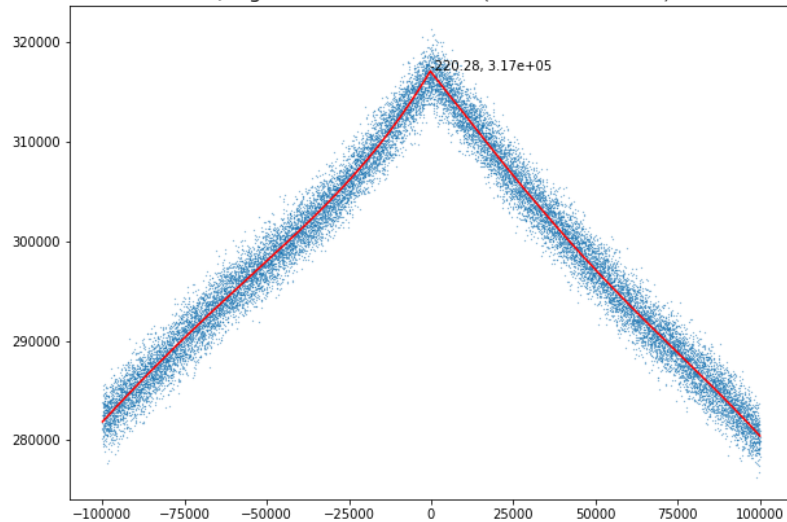
2°, lag = 1127.76 ± 83.57 (CV.STD.=153.75)



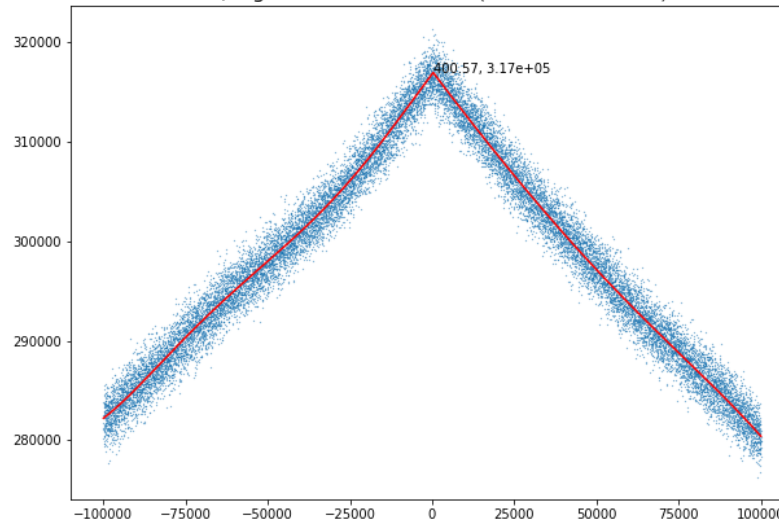
3°, lag = 254.59 ± 92.74 (CV.STD.=88.36)



4°, lag = -275.31 ± 116.13 (CV.STD.=166.27)

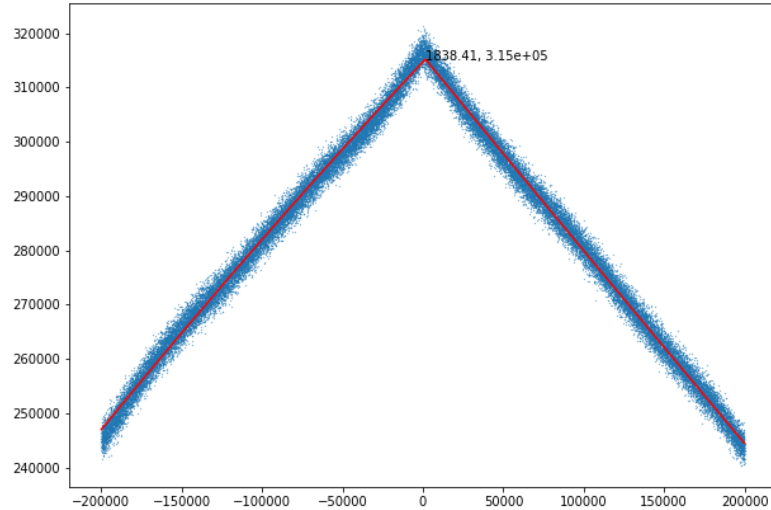


5°, lag = 324.35 ± 154.38 (CV.STD.=149.63)

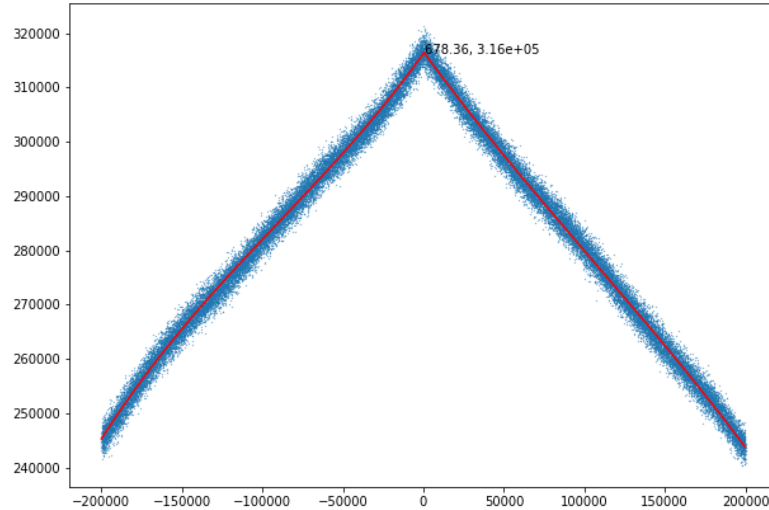


5-fold cross validation, 100 chunks from -200k to 200k seconds, 1000 iterations

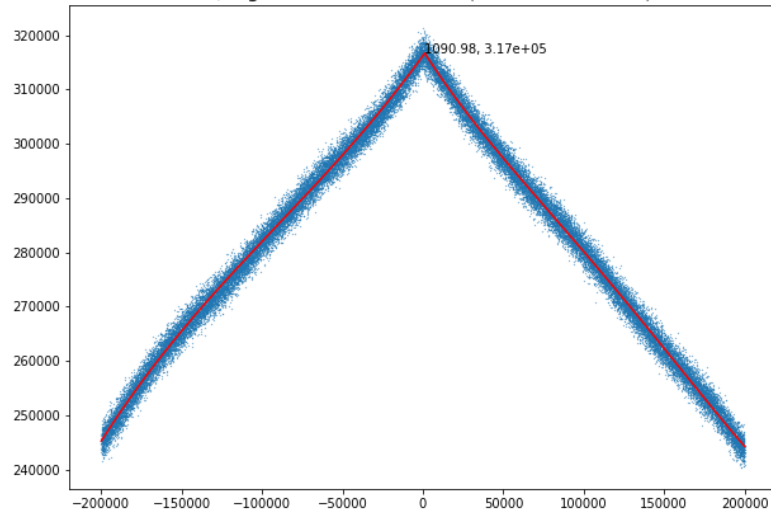
2°, lag = 1570.33 ± 75.37 (CV.STD.=392.45)



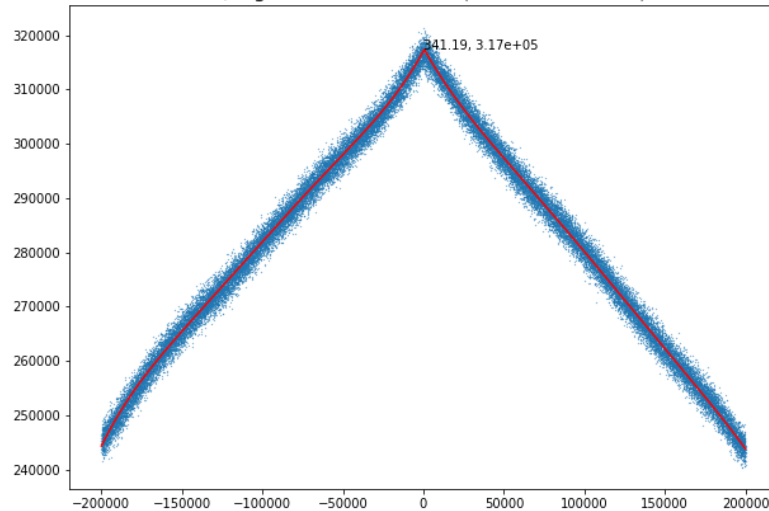
3°, lag = 401.56 ± 79.10 (CV.STD.=211.65)



4°, lag = 1167.04 ± 92.66 (CV.STD.=284.42)



5°, lag = 552.97 ± 89.04 (CV.STD.=283.36)



Works on progress

- Segment correlation i.e., correlation of data at MCMU at 03:00-06:00
- temporal correlation i.e., $corr(n, \tau) = \sum_i r_M[i + n] \cdot r_J[i + n + \tau]$
- Fewer sample, recalculate average and SD for every τ while taking missing data into account
 - for each τ if $r_M[m]$ or $r_J[m + \tau]$ is missing, both are treated as missing
 - Performance problem

$$r_i = \frac{c_i - average(\{c_i\})}{std(\{c_i\})}, i = M, J$$

$$cf[\tau] = \sum_{m=0}^{N-1-Max(|\tau|)} r_M[m] \cdot r_J[m + \tau]$$

Find τ that maximizes $cf[\tau]$

Thank you