#### Field-particle correlation is a technique for determining what energy transfer processes are actually important in a given element of plasma





#### Field-particle correlation is a technique for determining what energy transfer processes are actually important in a given element of plasma

- Understanding the dynamics as a function of time, not just in the asymptotic limit is critical
- Need to distinguish the secular evolution from oscillatory motion
- Distinguishing between multiple processes occurring simultaneously critical for understanding the physics

Measurements are primarily **in situ** 







Starting with the Vlasov equation, we multiply by the energy for the given species ( $m_sv^2/2$ ), to obtain an expression for the evolution of the phase space energy density

$$\frac{\partial w_s}{\partial t} = -\mathbf{v} \cdot \nabla w_s - q_s \frac{v^2}{2} \mathbf{E} \cdot \frac{\partial f_s}{\partial v} - q_s \frac{v^2}{2} (\mathbf{v} \times \mathbf{E})$$
  
where  $w_s(\mathbf{r}, \mathbf{v}, t) = m_s v^2 f_s(\mathbf{r}, \mathbf{v}, t)/2$ 

(Klein+ 2016, Howes+2017)





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 Contributes zero net energy - transfers energy within physical and phase space

(Klein+ 2016, Howes+2017)





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- Magnetic fields do no work

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$$C_E(\mathbf{v}, t, \tau) = C\left(-q_e \frac{v^2}{2} \frac{\partial f_e}{\partial v}, E\right) = -\frac{1}{N} \sum_{j=1}^N q_e \frac{v^2}{2} \frac{\partial f_e}{\partial v}$$

It can be shown that when integrated over physical space and velocity space, this term is proportional to  $j \cdot E$ 

(Klein+ 2016, Howes+2017)





#### The Field-Particle Correlation (FPC) signal of Landau damping $(v^2/2)(\partial \delta f/\partial v)E$



$$C_E(\mathbf{v}, t, \tau) = C\left(-q_e \frac{v^2}{2} \frac{\partial f_e}{\partial v}, E\right) = -\frac{1}{N} \sum_{j=1}^N q_e$$

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faster particles





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Start with the field-particle correlation

$$C_{E_{\parallel}}(\mathbf{v},t,\tau) = C\left(-q_e \frac{v_{\parallel}^2}{2} \frac{\partial f_e}{\partial v_{\parallel}}, E_{\parallel}\right) = -\frac{1}{N} \sum_{j=1}^N q_e \frac{v_{\parallel}^2}{2} \frac{\partial f_e}{\partial v_{\parallel}}$$









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Imagine that we have a single wave with frequency some rate 
$$\gamma$$
, and plug that into the FPC expression



 $\omega_R$ , damped at







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$$C_{E_{\parallel}} = \int_{-\infty}^{\infty} x(t) w(t - t_0) e^{-i\omega_R t} dt$$

And we get exactly a short-time Fourier transform evaluated at the frequency of the wave!



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Equivalent to only looking at the real part of a Fourier transform. Both the frequency and phase information is included, but convoluted together.

$$C_{E_{\parallel}} = \sum_{n} \int_{-\infty}^{\infty} -q_e \frac{v_{\parallel}^2}{2} \frac{\partial f_e}{\partial v_{\parallel}} E_{0,n} e^{\gamma_n t} w(t-t_0) e^{-i\omega_{R,n} t} dt$$

$$C_{E_{\parallel}} = \sum_{n} \int_{-\infty}^{\infty} x_n(t) w(t-t_0) \left[ \cos(\omega_{R,n}) + i \sin(\omega_{R,n}) \right] dt$$

By transforming the quantities individually first, we can recover both the magnitude and phase information as a function of time, frequency, and velocity, then evaluate the relative phase for each frequency and point in time.

$$C_{E} = \left| STFT \left[ \Re \left( \frac{v^{2}}{2} \frac{\partial \delta f}{\partial v} \right) \right] \right| \left| STFT \left[ \Re \left( E \right) \right] \right| F(\phi_{f}, \phi_{E})$$





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 $Re[e^{i(\phi f - \phi E)}] = \cos(\phi_f - \phi_E)$ 



#### Applying the wavelet transform to electric field data from Gkeyll simulation of electron landau damping at a single frequency





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#### Applying the wavelet transform to electric field data from Gkeyll simulation of electron landau damping at two frequencies









#### Applying the wavelet transform to electric field data from Gkeyll simulation of electron landau damping at two frequencies









# Applying the frequency-resolved FPC to data from MMS spacecraft



Emily Lichko



0└ \_3

-2

-1

0

 $v_{\parallel}/v_{\rm th,e}$ 

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10

–4 ù

-6

#### Applying the frequency-resolved FPC to data from MMS spacecraft





Emily Lichko



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#### Applying the wavelet transform to electric field data from **Gkeyll simulation of electron landau damping**



$$C_{E_{\parallel}} = \int_{-\infty}^{\infty} x(t) w(t - t_0) e^{-i\omega_R t} dt$$

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$$C_{E_{\parallel}} = \int_{-\infty}^{\infty} x(t) w(t - t_0) e^{-i\omega_R t} dt$$



#### Fundamental limitation on the area in frequency-time space and on the frequency resolution

1. Heisenberg-Gabor Limit - because time and frequency are not independent variables, the uncertainty in a frequency over a time period is bounded by a constant, *i.e.* 

#### $\Delta f \Delta t \geq 1$

2. Limitation on the ability to distinguish peaked distributions of nearby frequencies





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# Applying the frequency-resolved FPC to data from MMS spacecraft



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#### Applying the frequency-resolved FPC to data from MMS spacecraft







# Applying the frequency-resolved FPC to data from MMS spacecraft



Emily Lichko

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#### Applying the frequency-resolved FPC to data from MMS spacecraft



	×10 <sup>-3</sup>
_	7
_	6
_	5
_	4
_	3
_	2
_	1
	0

#### Applying the frequency-resolved FPC to data from MMS spacecraft



	×10 <sup>-3</sup>
_	7
_	6
_	5
_	4
_	3
_	2
_	1
	0

# Applying the frequency-resolved FPC to data from MMS spacecraft



Emily Lichko



# Applying the frequency-resolved FPC to data from MMS



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- Updated method of determining the energy transfer between the fields and particles from kinetic processes
- Not only does this method add an additional dimension to the traditional field-particle correlation method, but it provides better resolution when there are competing dissipation processes

#### Summary













- Updated method of determining the energy transfer between the fields and particles from kinetic processes
- Not only does this method add an additional dimension to the traditional field-particle correlation method, but it provides better resolution when there are competing dissipation processes



## Thank you! Questions?



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Start with the field-particle correlation

$$C_E(\mathbf{v}, t, \tau) = C\left(-q_e \frac{v^2}{2} \frac{\partial f_e}{\partial v}, E\right) = -\frac{1}{N} \sum_{j=1}^N q_e \frac{v^2}{2} \frac{\partial f_e}{\partial v}$$

Because

$$C_E(v,t_0,\tau) = \int_{t_0-\tau/2}^{t_0+\tau/2} \left(-q_e \frac{v^2}{2} \frac{\partial f_e}{\partial v} E\right) dt = \int_{-\infty}^{\infty} \left(-q_e \frac{v^2}{2} \frac{\partial f_e}{\partial v} \right) dt$$

where  $w(t - t_0; \tau) = \begin{cases} 1 & \text{if } t_0 - \tau/2 \le t \le t_0 + \tau/2 \\ 0 & \text{otherwise} \end{cases}$ 

Imagine that we have a single wave with frequency  $\omega_R$ , damped at some rate  $\gamma$ , and plug that into the FPC expression

$$C_E = \int_{-\infty}^{\infty} \left( -q_e \frac{v^2}{2} \frac{\partial f_e}{\partial v} E_0 e^{\gamma t} \right) w(t - t_0; \tau) e^{-i\omega_R t} dt$$







$$C_{E_{\parallel}}(\mathbf{v},t,\tau) = C\left(-q_e \frac{v_{\parallel}^2}{2} \frac{\partial f_e}{\partial v_{\parallel}}, E_{\parallel}\right) = -\frac{1}{N} \sum_{j=1}^N q_e \frac{v_{\parallel}^2}{2} \frac{\partial f_e}{\partial v_{\parallel}} + \frac{1}{N} \sum_$$



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faster particles

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(Klein+ 2016, Howes+2017)

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- Magnetic fields do no work

(Klein+ 2016, Howes+2017)

![](_page_44_Figure_7.jpeg)

![](_page_44_Figure_8.jpeg)

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(Klein+ 2016, Howes+2017)

![](_page_45_Figure_7.jpeg)

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It can be shown that when integrated over physical space and velocity space, this term is proportional to j.E.

(Klein+ 2016, Howes+2017)

![](_page_46_Figure_9.jpeg)

![](_page_46_Figure_10.jpeg)

![](_page_46_Figure_12.jpeg)

![](_page_47_Figure_1.jpeg)

It can be shown that when integrated over physical space and velocity space, this term is proportional to j.E.

(Klein+ 2016, Howes+2017)

![](_page_47_Figure_5.jpeg)

![](_page_48_Figure_1.jpeg)

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(Klein+ 2016, Howes+2017)

![](_page_48_Figure_5.jpeg)

![](_page_49_Figure_1.jpeg)

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(Klein+ 2016, Howes+2017)

![](_page_49_Figure_5.jpeg)

The difficult aspect comes when we have an electric field that's composed of more than one wave

$$E = \sum_{n} E_{0,n} e^{\gamma_n t} e^{-i\omega_{R,n} t}$$

In that case, when we insert the electric field into our form of the field-particle correlation we get that the FPC is the sum of the short-time Fourier transform at each constituent frequency, summed together

$$C_{E_{\parallel}} = \sum_{n} \int_{-\infty}^{\infty} -q_e \frac{v_{\parallel}^2}{2} \frac{\partial f_e}{\partial v_{\parallel}} E_{0,n} e^{\gamma_n t} w(t-t_0) e^{-i\omega_{R,n} t} dt$$

![](_page_50_Figure_6.jpeg)

$$C_{E_{\parallel}} = \sum_{n} \int_{-\infty}^{\infty} x_n(t) w(t - t_0) e^{-i\omega_{R,n} t} dt$$

![](_page_50_Picture_9.jpeg)

![](_page_50_Picture_10.jpeg)

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In that case, when we insert the electric field into our form of the field-particle correlation we get that the FPC is the sum of the short-time Fourier transform at each constituent frequency, summed together

$$C_{E_{\parallel}} = \sum_{n} \int_{-\infty}^{\infty} -q_e \frac{v_{\parallel}^2}{2} \frac{\partial f_e}{\partial v_{\parallel}} E_{0,n} e^{\gamma_n t} w(t-t_0) e^{-i\omega_{R,n} t} dt$$

![](_page_51_Figure_6.jpeg)

$$C_{E_{\parallel}} = \sum_{n} \int_{-\infty}^{\infty} x_n(t) w(t-t_0) e^{-i\omega_{R,n}t} dt$$

![](_page_51_Picture_9.jpeg)

![](_page_51_Picture_10.jpeg)

The difficult aspect comes when we have an electric field that's composed of more than one wave

$$E = \sum_{n} E_{0,n} e^{\gamma_n t} e^{-i\omega_{R,n} t}$$

In that case, when we insert the electric field into our form of the field-particle correlation we get that the FPC is the sum of the short-time Fourier transform at each constituent frequency, summed together

$$C_{E_{\parallel}} = \sum_{n} \int_{-\infty}^{\infty} -q_e \frac{v_{\parallel}^2}{2} \frac{\partial f_e}{\partial v_{\parallel}} E_{0,n} e^{\gamma_n t} w(t-t_0) e^{-i\omega_{R,n} t} dt$$

![](_page_52_Figure_6.jpeg)

$$C_{E_{\parallel}} = \sum_{n} \int_{-\infty}^{\infty} x_n(t) w(t-t_0) e^{-i\omega_{R,n}t} dt$$

![](_page_52_Picture_9.jpeg)

![](_page_52_Picture_10.jpeg)

- 1. Ability to better represent short-lived signals instantaneously
- 2. Cleaner signals in an environment with multiple dissipation processes

Main issue is that our models for the electric field and distribution function have both a real and imaginary component, but we can only measure the real part of each of these signatures

$$C_{E_{\parallel}} = \sum_{n} \int_{-\infty}^{\infty} x_n(t) w(t - t_0) \left[ \cos(\omega_{R,n}) + i \sin(\omega_{R,n}) \right] dt$$

Equivalent to only looking at the real part of a Fourier transform. Both the frequency and phase information is included, but convoluted together.

![](_page_53_Figure_7.jpeg)

#### Applying the wavelet transform to electric field data from **Gkeyll simulation of electron landau damping**

![](_page_54_Figure_1.jpeg)

![](_page_54_Picture_5.jpeg)

# Applying the frequency-resolved FPC to a Gkeyll simulation of electron landau damping

![](_page_55_Figure_1.jpeg)

![](_page_55_Picture_4.jpeg)

![](_page_55_Picture_5.jpeg)