










Diagnosing tropical waves

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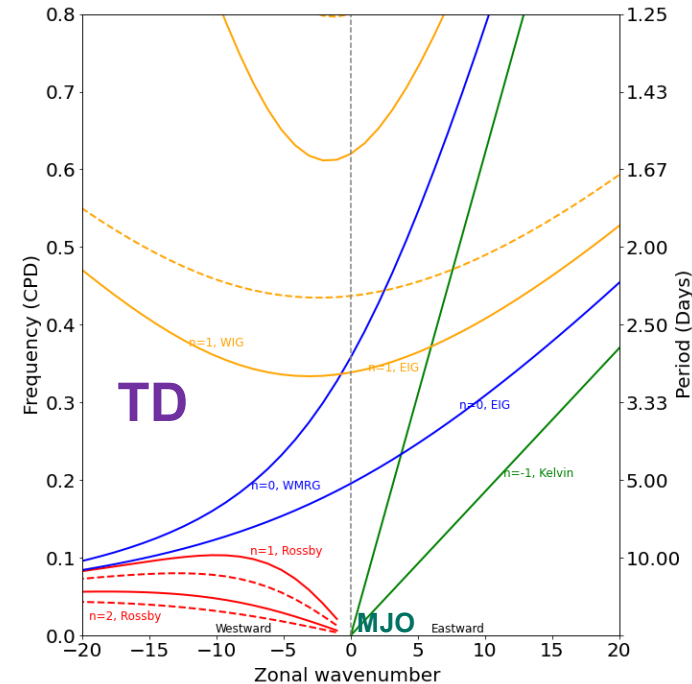
RESEARCH ARTICLE

The intricacies of identifying equatorial waves

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Andreas Schlueter⁸  | **Frank Sielmann⁶** | **Matthew C. Wheeler⁹** 

What are tropical waves?

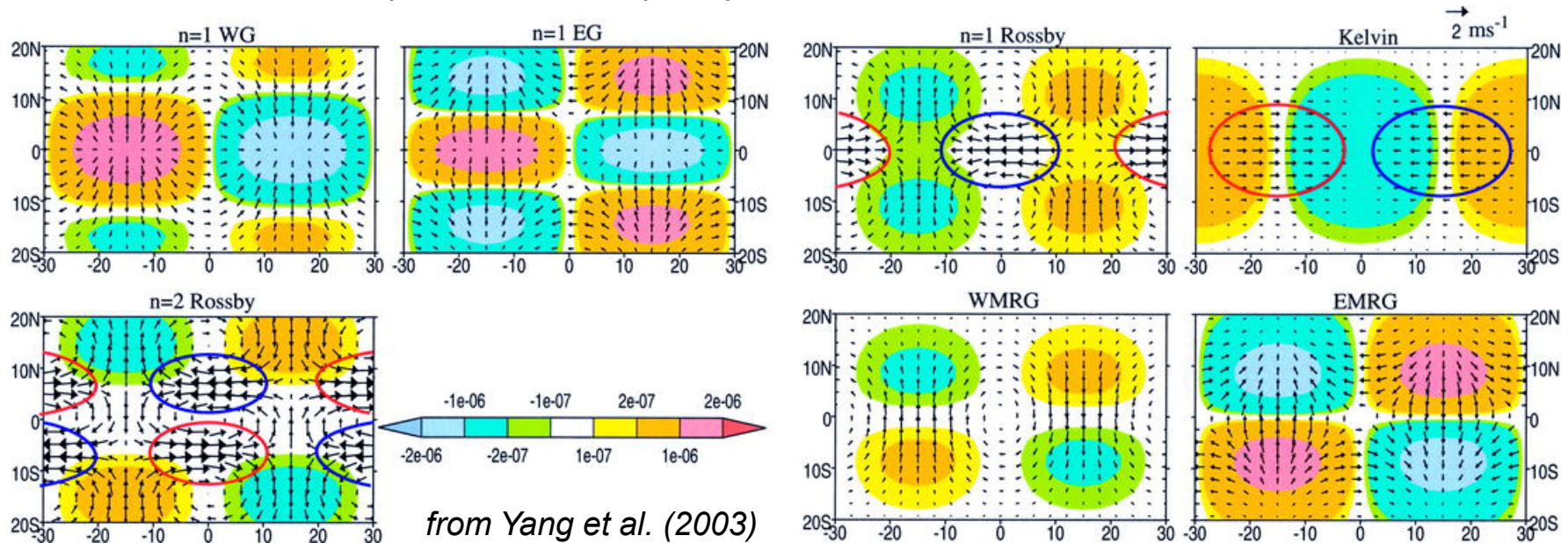
- Zonally propagating, synoptic- to planetary-scale disturbances with frequencies from a few days to several weeks
- Dynamical solutions to linear wave theory (“equatorial waves”, *Matsuno 1966*)
 - Kelvin waves (KW)
 - equatorial Rossby waves (ER)
 - mixed-Rossby gravity waves (MRG)
 - inertio-gravity waves (IG)
- Other modes: Tropical disturbances (TDs), Madden-Julian Oscillation (MJO), ...
- Coupling with convection creates link to clouds / rainfall



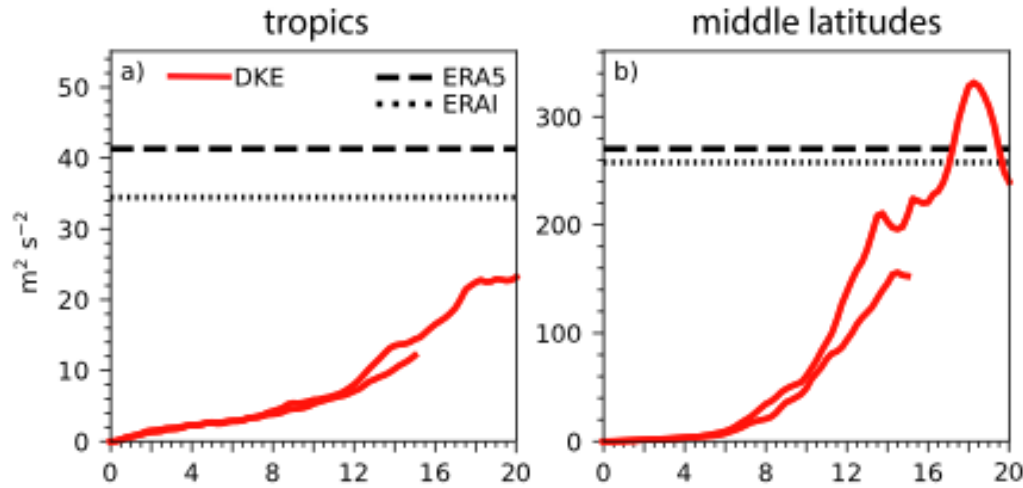
Solutions to rotating, linearized shallow-water equations on tropical β -plane ($D=8m$ & $90m$)

Spatial structures

- Linear modes have **theoretical** patterns in wind, geopotential and convergence.
- The other modes (TD, MJO etc.) only have **empirical** patterns!

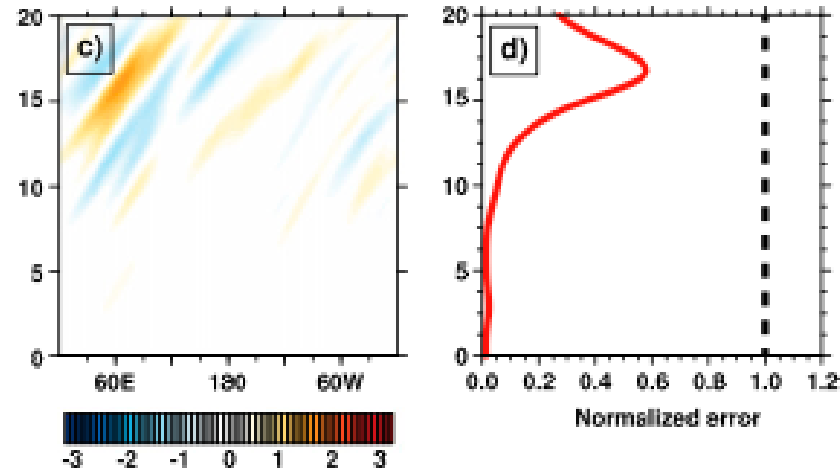


Why do tropical waves matter?



from Judt (2020) based on “identical-twin predictability” experiments with 4km grid spacing (convection permitting)

Error in Kelvin wave winds



How to identify tropical waves?

emphasize
spatial
characteristics

can be applied
to short
time-series

from Knippertz
et al. (2022)

Broad filter windows (space only)	
3DS-HF 3D SPATIAL PROJECTION USING HOUGH FUNCTIONS <i>Žagar et al. (2009b, 2016), Castanheira & Marques (2015), Ogrosky & Stechmann (2015, 2016), Marques & Castanheira (2018)</i>	$[u, v, \phi] (x, y_n, \sigma_m / p_m)$
Broad filter windows (time & space)	
2DS-PCF 2D SPATIAL PROJECTION USING PARABOLIC CYLINDER FUNCTIONS <i>Yang et al. (2003), Yang et al. (2007a,b,c), Yang & Hoskins (2013), Ferrett et al. (2020)</i>	$u/v/\phi (x, y_n, t)$
Intermediate filter windows (time & space)	
2DS-EOF 2D SPATIAL PROJECTION USING TIME-EXTENDED EMPIRICAL ORTHOGONAL FUNCT. <i>Roundy & Schreck (2009), Roundy (2012)</i>	$OLR (x, y, t)$

Narrow filter windows (time & space)	
FWF-PCF FREQUENCY-WAVENUMBER FILTERING USING PARABOLIC CYLINDER FUNCTIONS <i>Gehne & Kleeman (2012), Li & Stechmann (2020)</i>	Scalar (x, y_n, t)
FWF-FFT FREQUENCY-WAVENUMBER FILTERING USING FAST-FOURIER TRANSFORM <i>Takayabu (1994a,b), Wheeler & Kiladis (1999), Kiladis et al. (2009), Roundy (2020)</i>	Scalar (x, \bar{y}, t)
FWF-Wavelet FREQUENCY-WAVENUMBER FILTERING USING WAVELETS <i>Wong (2009), Kikuchi & Wang (2010), Kikuchi (2014), Dias & Kiladis (2014), Roundy (2018)</i>	Scalar (x, \bar{y}, t)

emphasize
propagation
characteristics

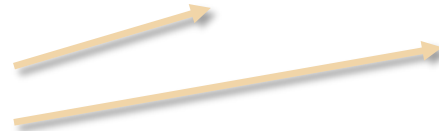
can only be
applied
to long
time-series

3D Spatial Projection – Hough Functions

3DS-HF *Žagar et al. (2016)*

- **Hough Functions (HFs)** are **3D** solutions of the rotating, linearized shallow-water equations on the **sphere**
- Full **multivariate, instantaneous projection** of dynamical fields (**u,v,Z**)
- Restrict zonal wavenumber to $1 \leq |k| \leq 15$
- Time filtering ($2d \leq |T| \leq 30d$) after re-projection into physical space

n=1 EIG



k

2D Spatial Projection – Parabolic Cylinder Funct.

2DS-PCF *Yang et al. (2003)*

- **Parabolic Cylinder Functions (PCFs)** are the meridional basis of solutions of the rotating, linearized shallow-water equations on the **tropical β -plane**
- Fourier filter for wavenumber $1 \leq |k| \leq 15$
- Fourier filter for wave periods $2d \leq |T| \leq 30d$
- **Single-variate, instantaneous projection** of dynamical fields **(u, v, Z) onto PCFs** with fixed meridional scale of 6°

n=1 EIG



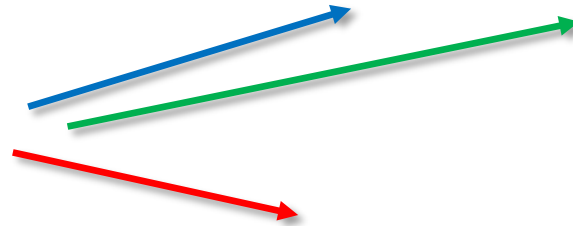
k

2D Spatial Projection – Time-Extended EOFs

2DS-EOF *Roundy & Schreck (2009)*

- Define empirical wave patterns using past fields of Outgoing Longwave radiation (**OLR**) and **Time-Extended Empirical Orthogonal Functions** (EEOFs)
- Use **Fast Fourier Transform (FFT)** to filter for **broad frequency-wavenumber (ω - k) windows** specific for individual wave types
- Project OLR fields of interest onto EEOFs

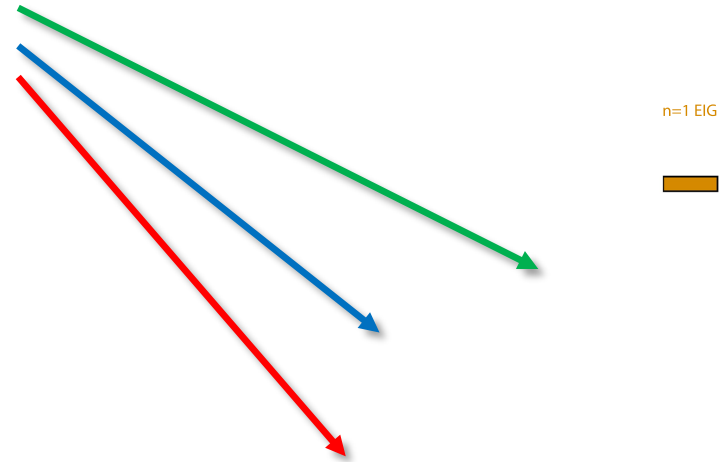
n=1 EIG



Freq.-Wavenumber Filtering – Fast Fourier Transf.

FWF-FFT *Wheeler & Kiladis (1999)*

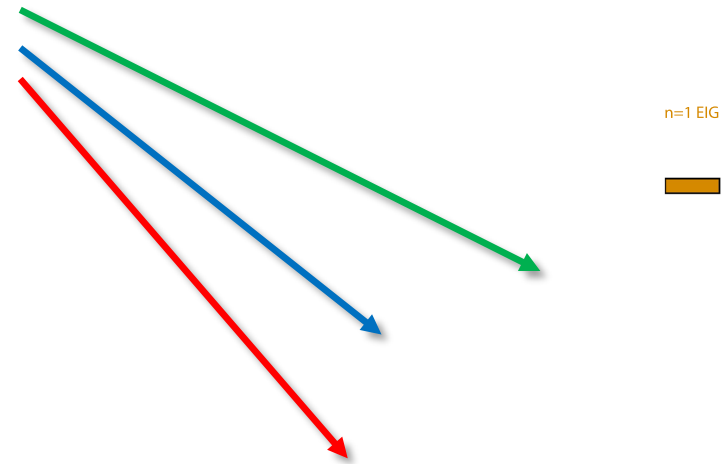
- Use **Fast Fourier Transform (FFT)** to filter for **narrow ω -k windows** specific for individual wave types
- These filter windows have been defined on basis of spectral peaks in OLR
- They can be applied to **any scalar!**
- Average fields meridionally to obtain equator-symmetric (for **KW** & **ER**) and -antisymmetric (for **MRG**) signals



Freq.-Wavenumber Filtering – Wavelets

FWF-wavelet *Kikuchi (2014)*

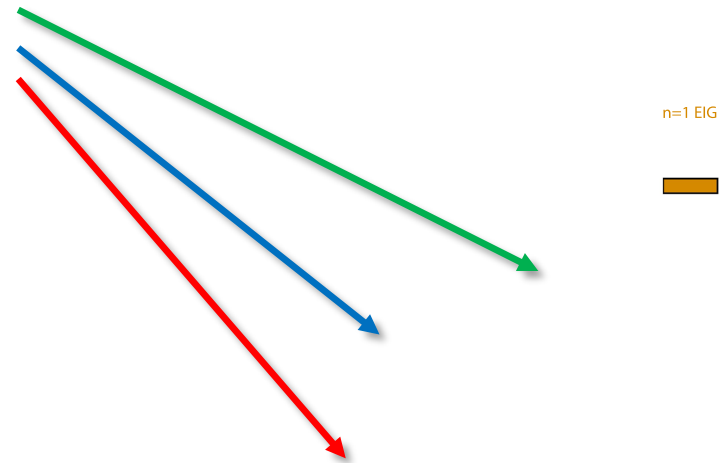
- Use **wavelets** to filter for **narrow ω -k windows** specific for individual wave types
- Wavelets allow localization in longitude and time
- They can be applied to **any scalar!**
- Average fields meridionally to obtain equator-symmetric (for **KW** & **ER**) and -antisymmetric (for **MRG**) signals



Freq.-Wavenumber Filtering using PCFs

FWF-PCF *Gehne & Kleeman (2012)*

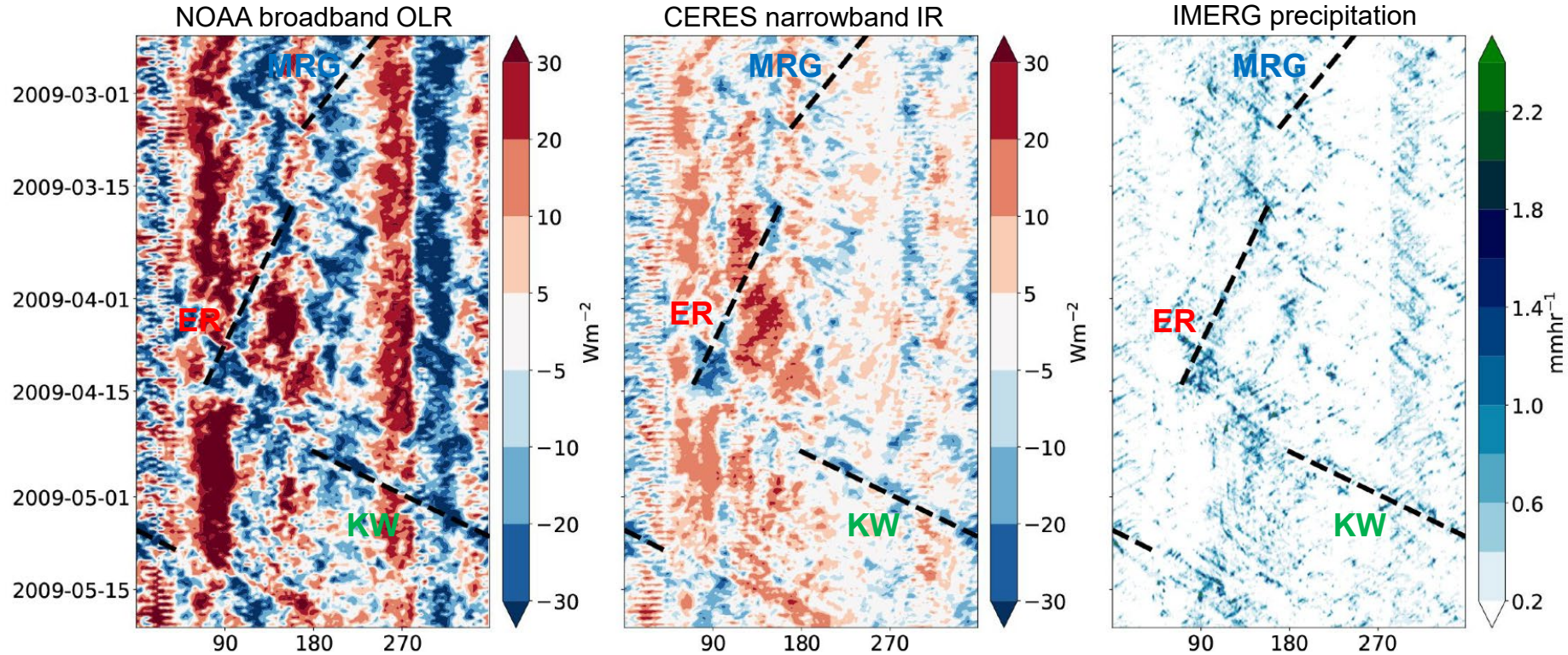
- Project fields on **Parabolic Cylinder Functions** (PCFs) to obtain equator-symmetric (for **KW** & **ER**) and -antisymmetric (for **MRG**) signals of different meridional wavelength
- They can be applied to **any scalar!**
- Use **Fast Fourier Transform (FFT)** to filter for **narrow ω - k windows** specific for individual wave types



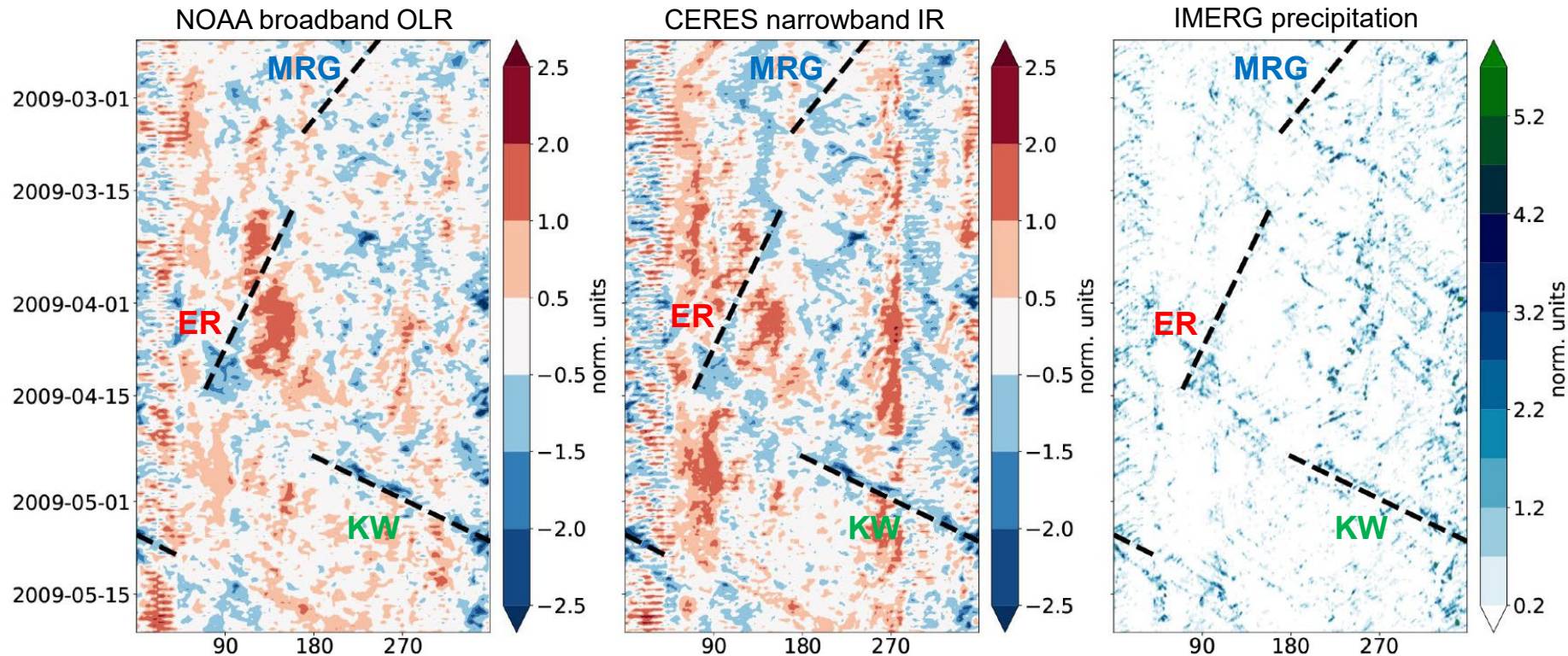
Case study 20 February – 20 May 2009

(also discussed in “Year of Tropical Convection” overview paper
[*Waliser et al. 2012*])

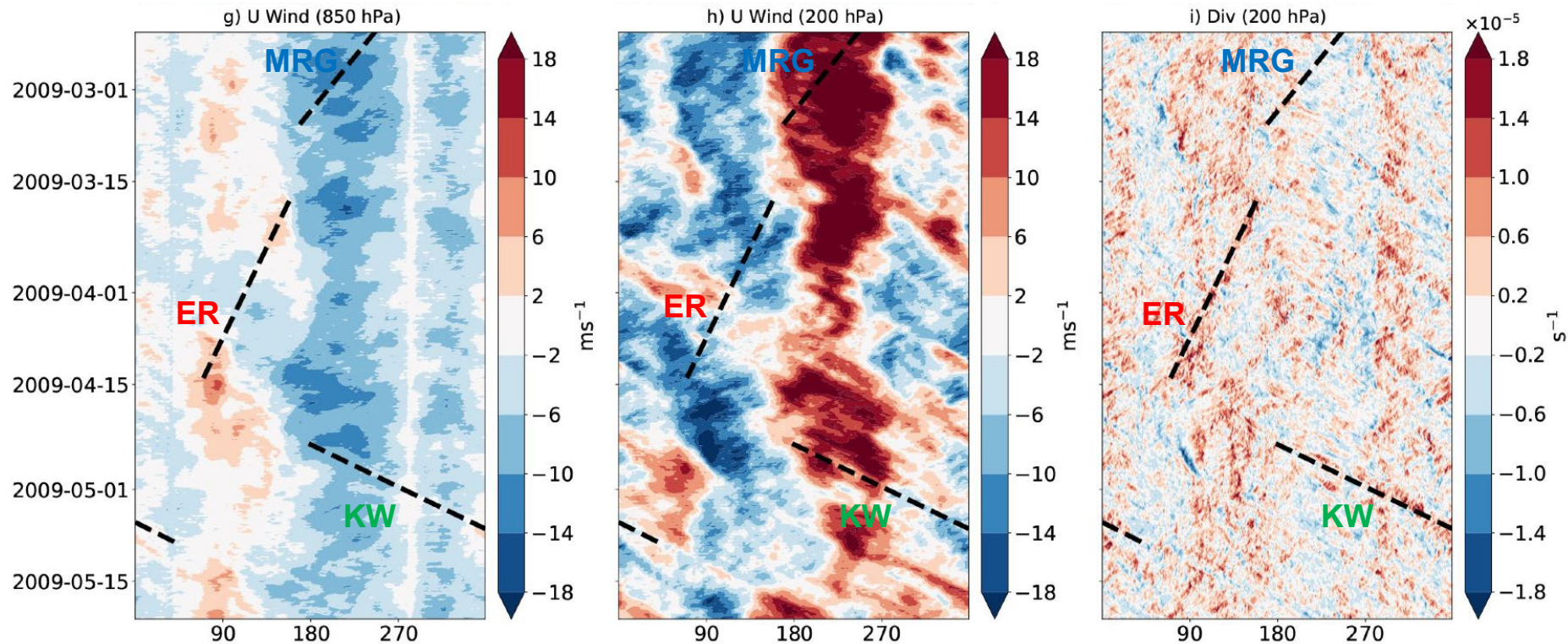
Unfiltered anomalies – clouds & rain



Unfiltered normalized anomalies – clouds & rain

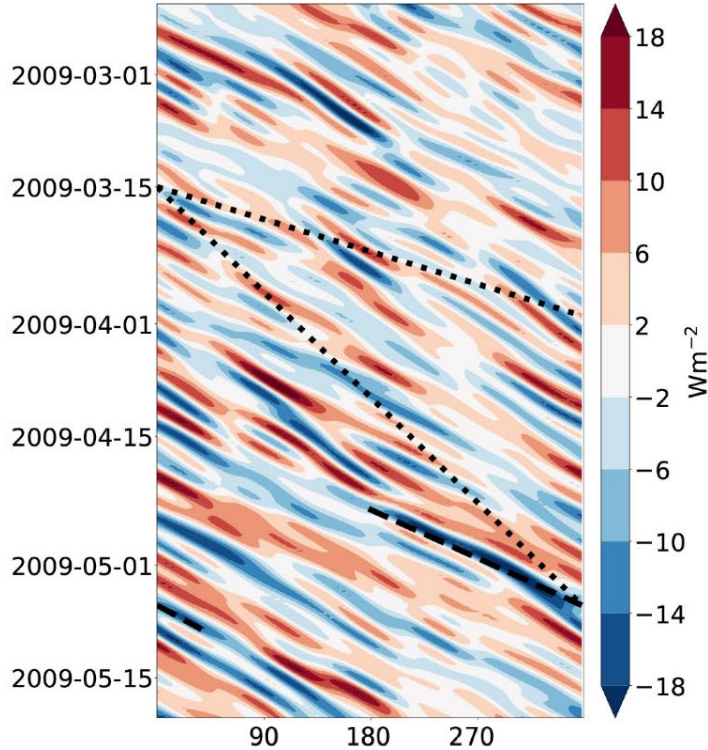


Unfiltered full fields – U wind & divergence

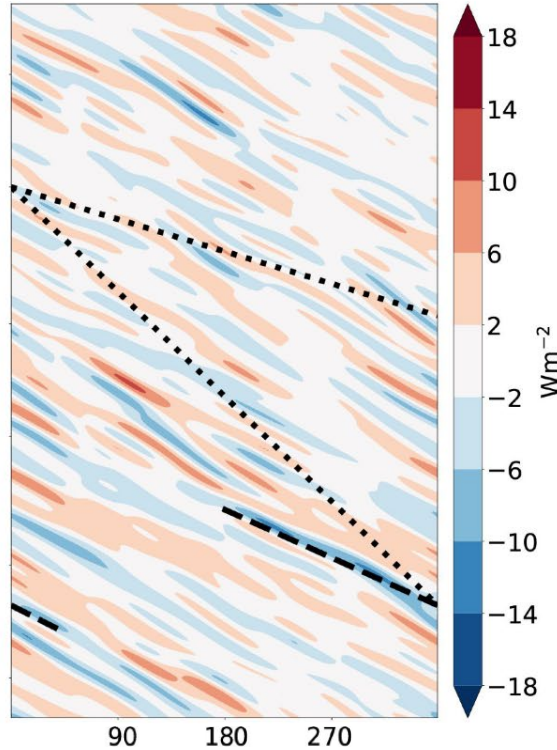


KW – FWF-FFT – clouds & rain

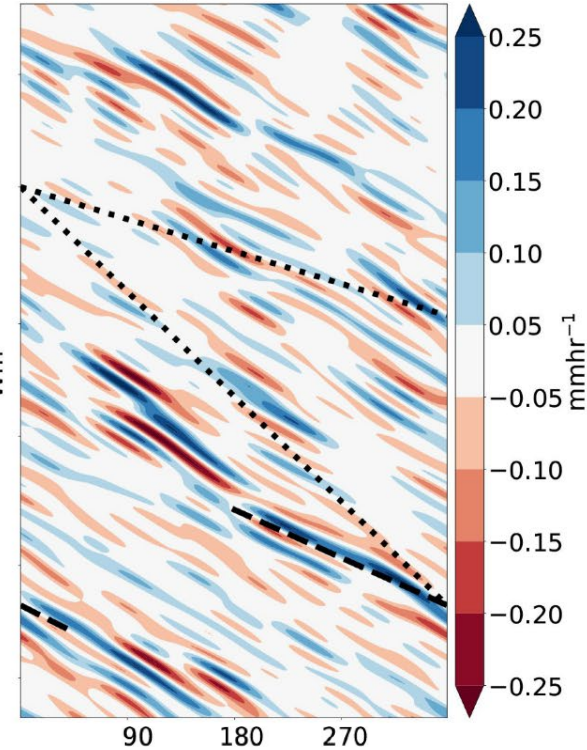
NOAA broadband OLR



CERES narrowband IR

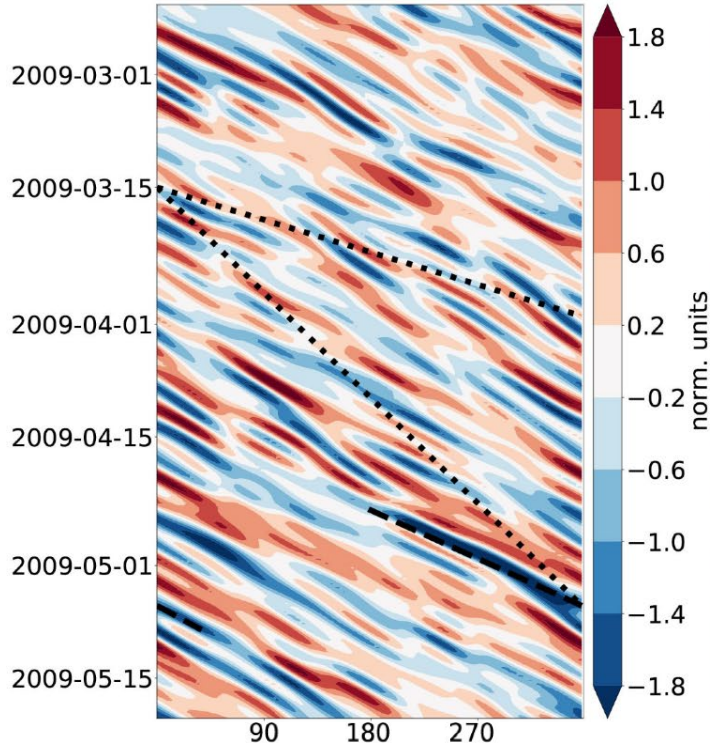


IMERG precipitation

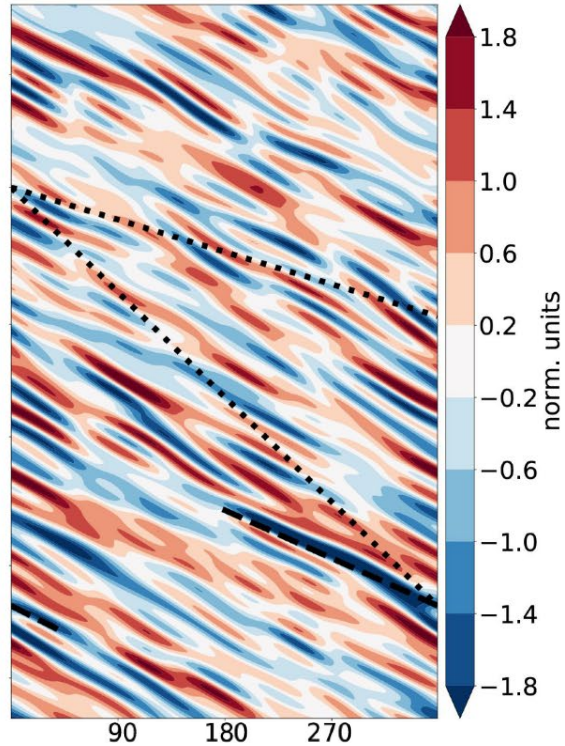


KW – FWF-FFT – clouds & rain (normalized)

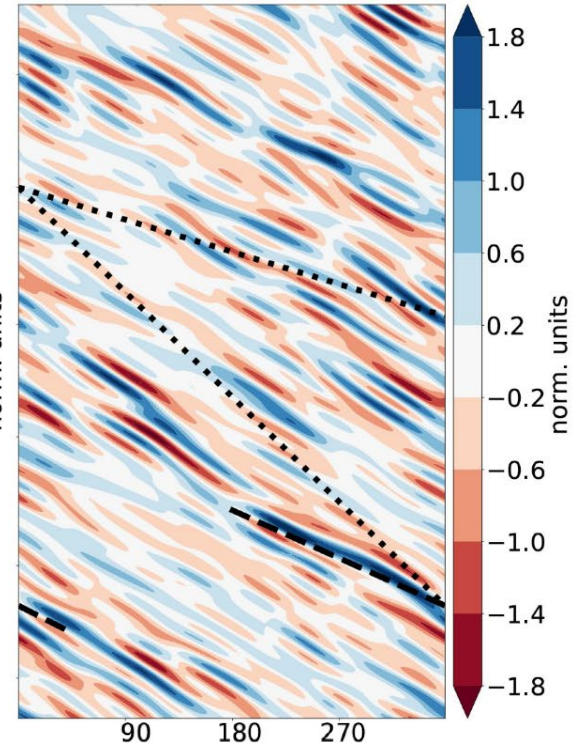
NOAA broadband OLR



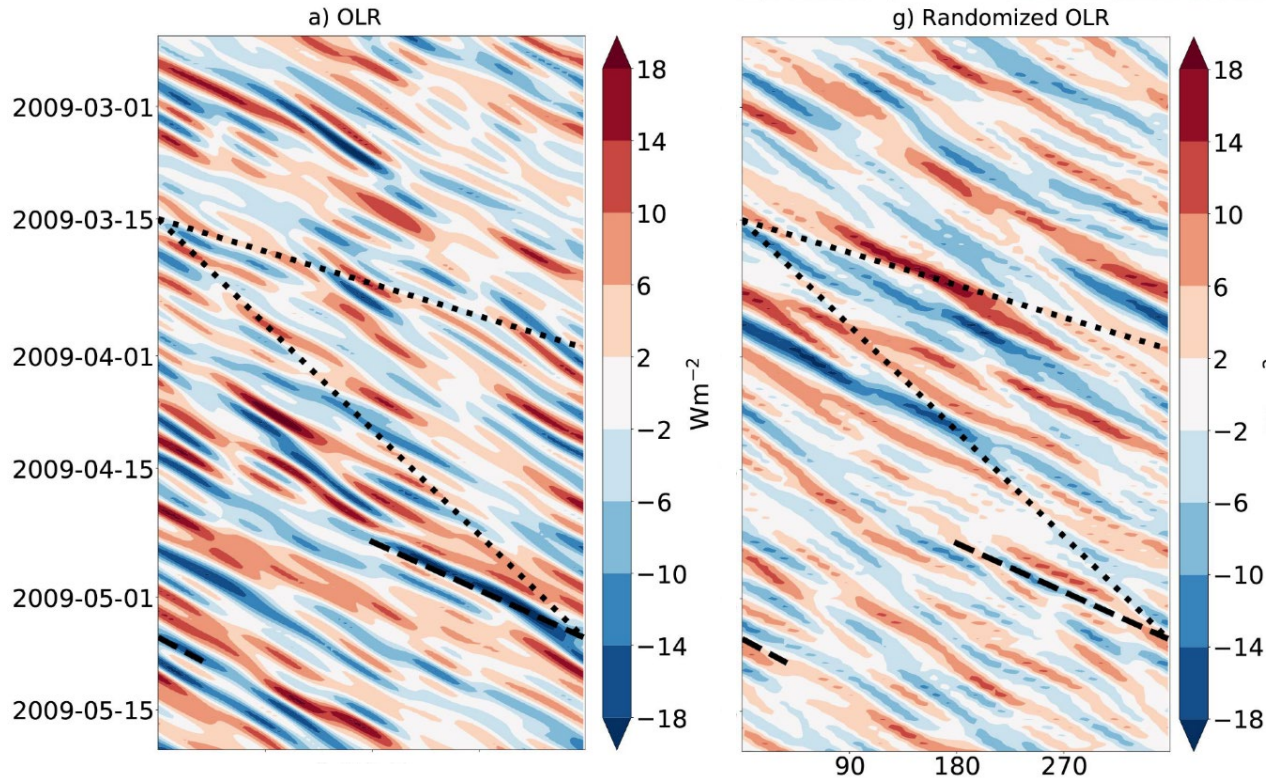
CERES narrowband IR



IMERG precipitation

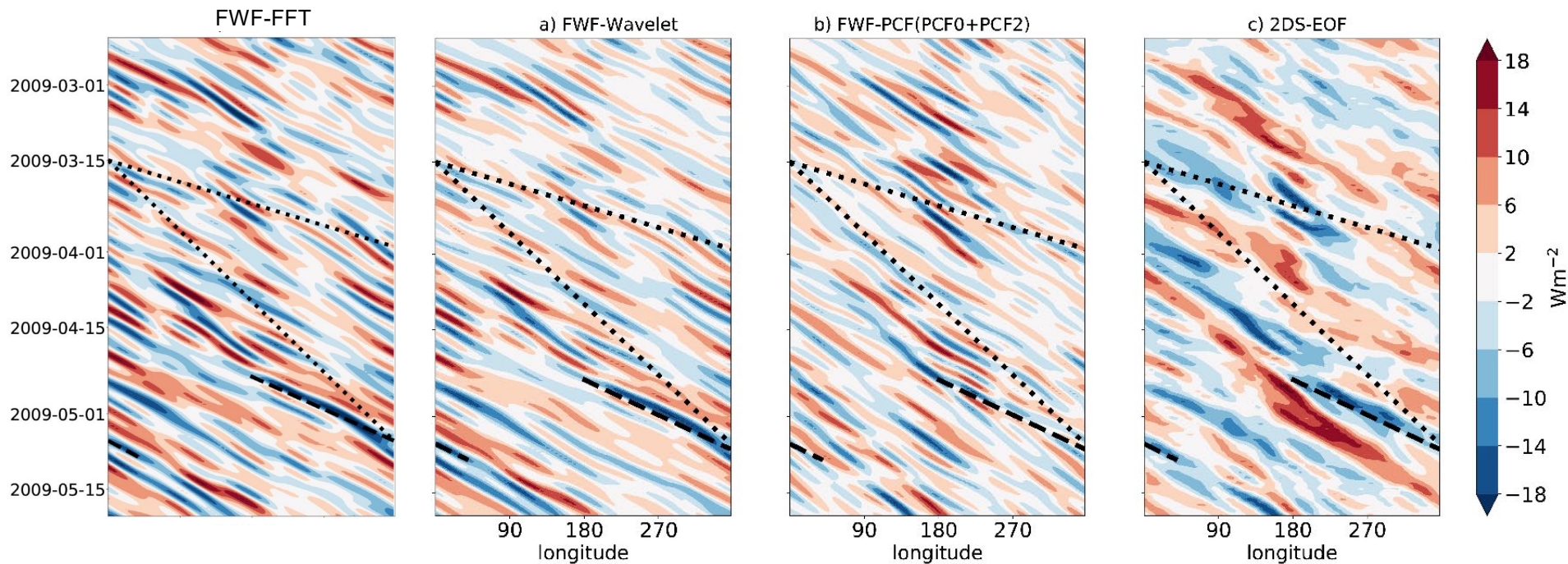


KW – OLR – Randomization

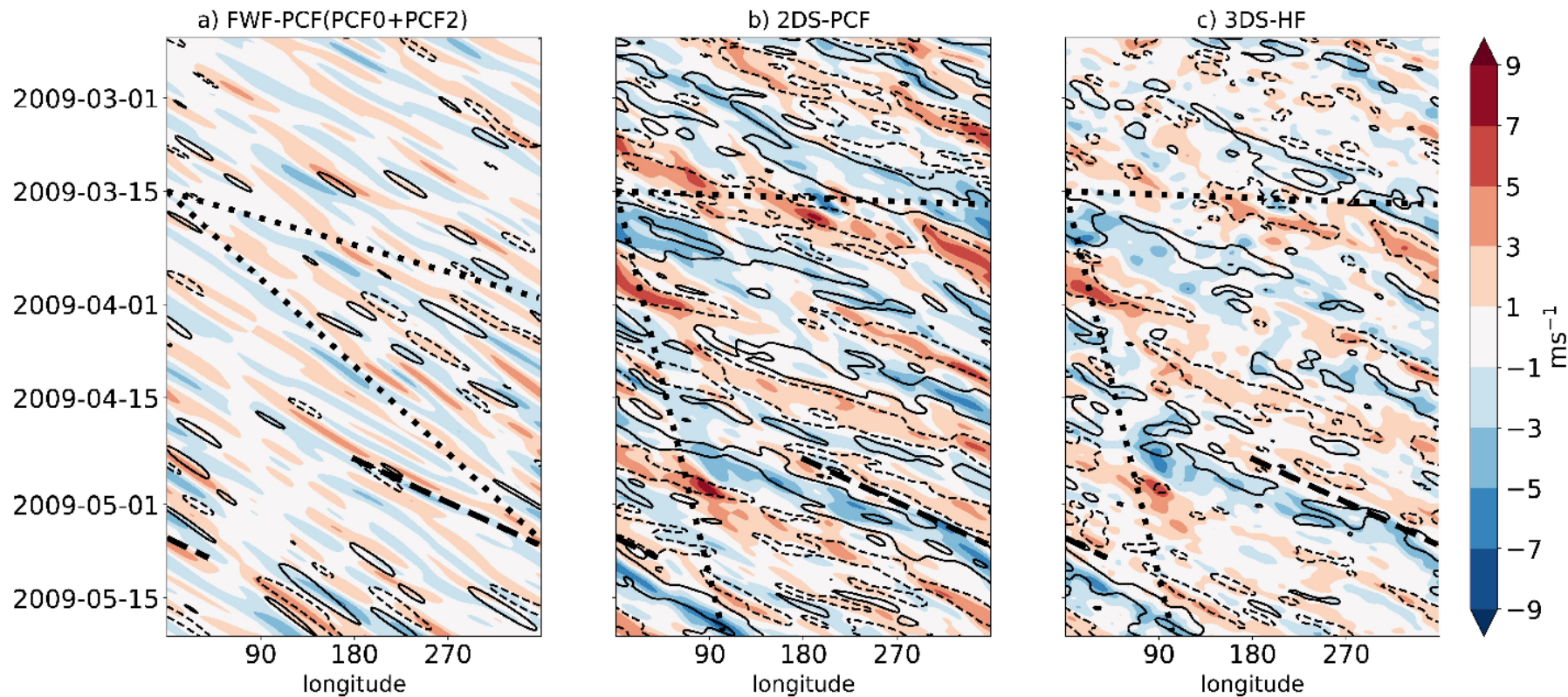


**Beware of
overinterpreting
noise!!**

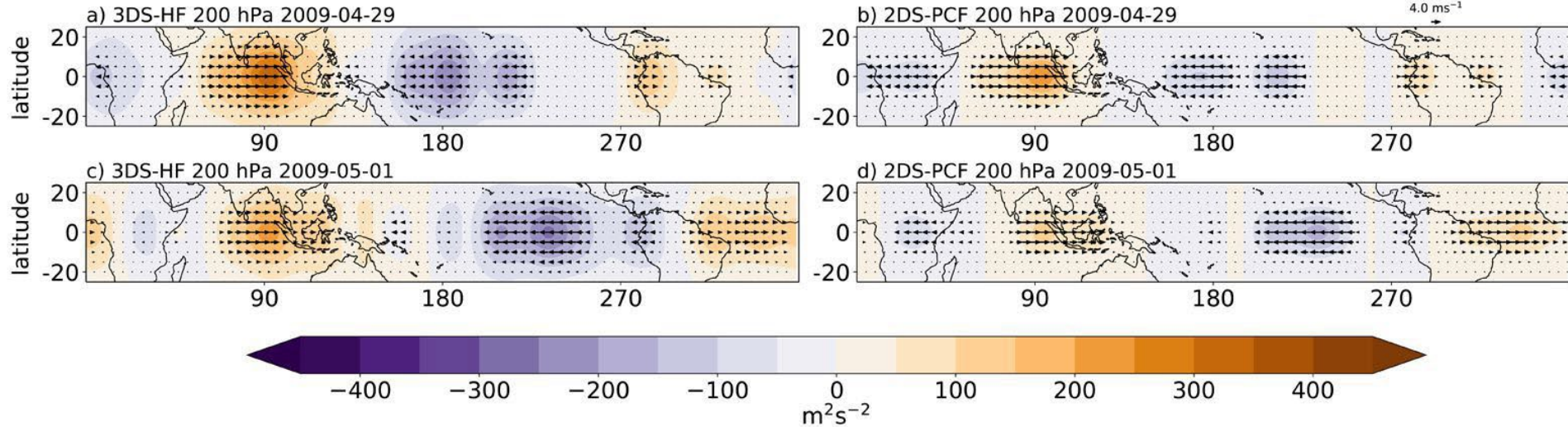
KW – OLR – Comparison of methods



KW – U wind – Comparison of methods

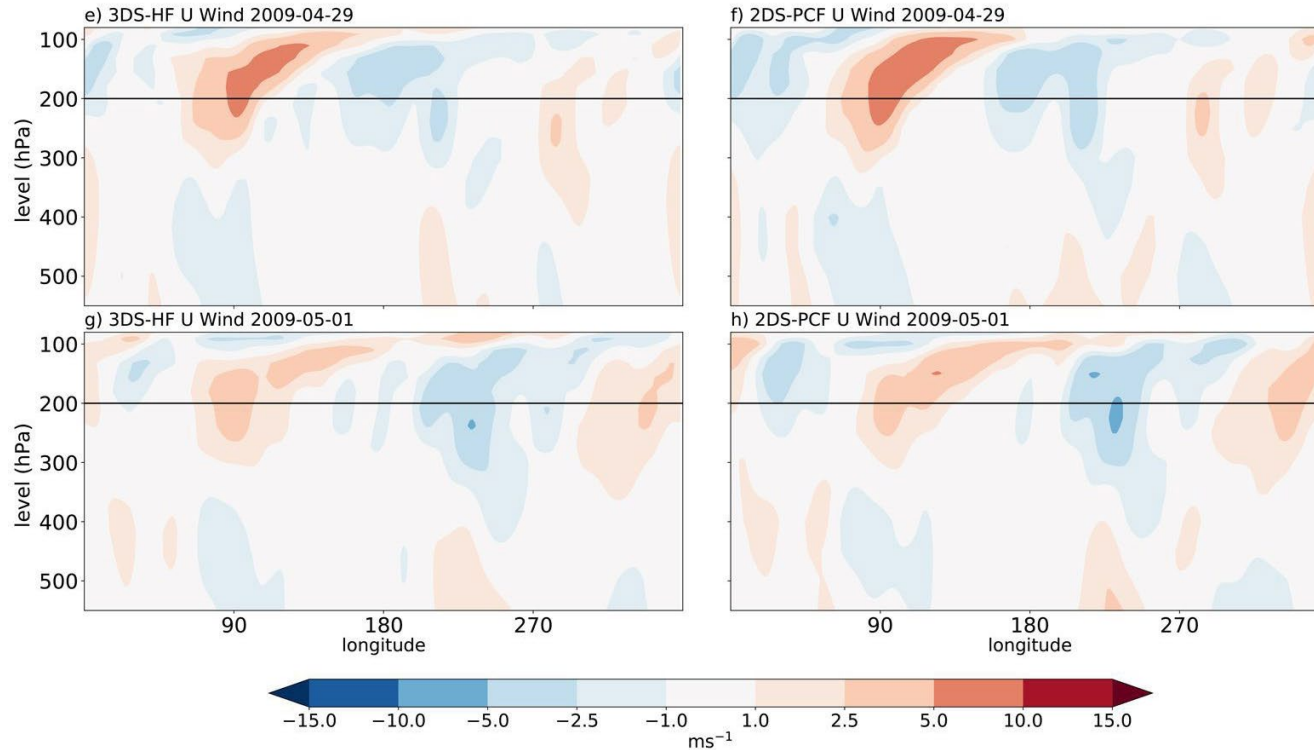


KW – U wind & Z – Comparison of methods

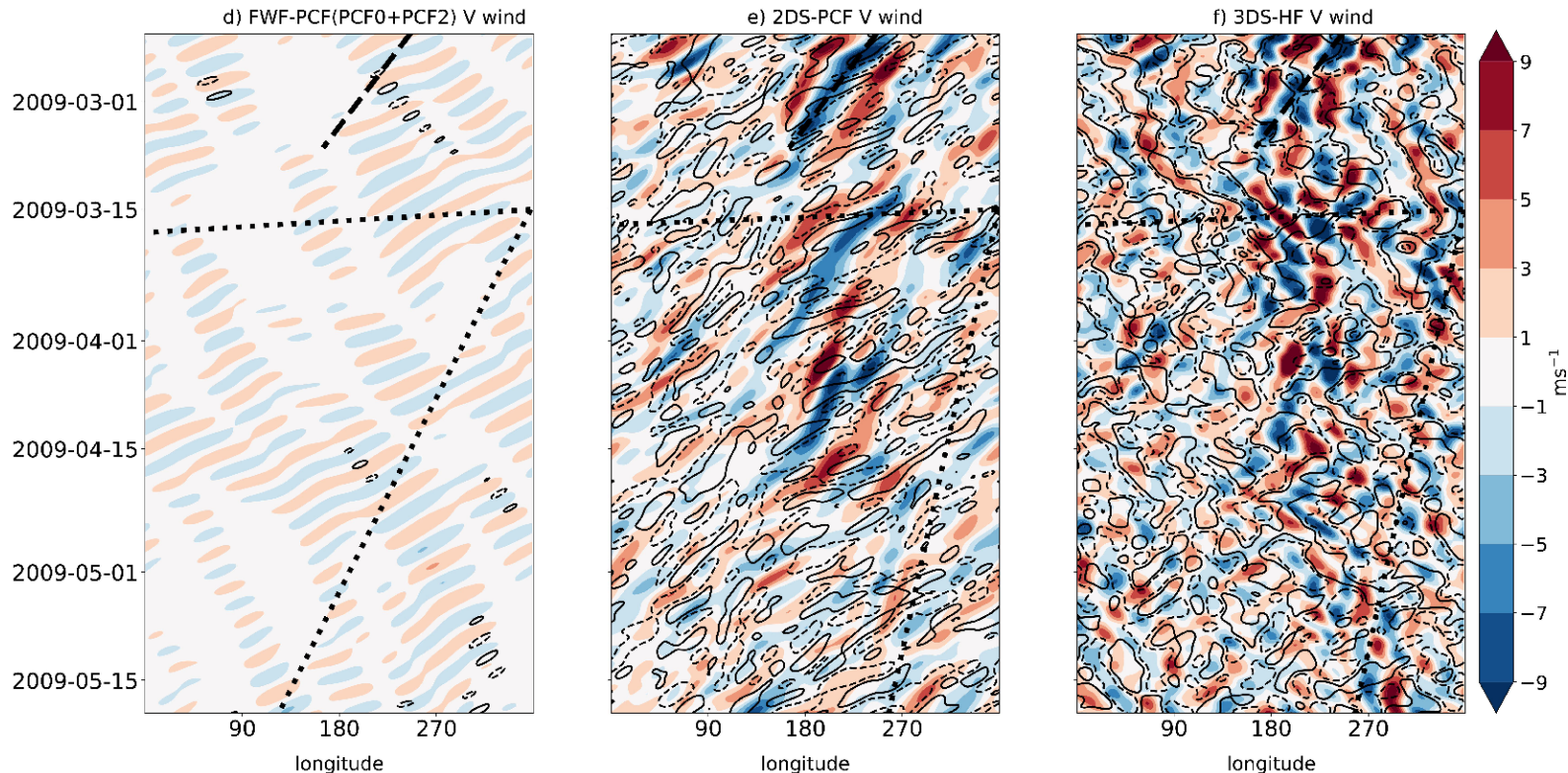


Setting a meridional scale in 2DS-PCF confines signal to inner tropics!

KW – U wind & Z – Comparison of methods



MRG – V wind – Comparison of methods



Explained variance for climatological period 2001–2018

(method is based on squared correlation between wave-filtered signals and variance in raw data [*Schlueter et al. 2019*])

Equator-symmetric variance in OLR

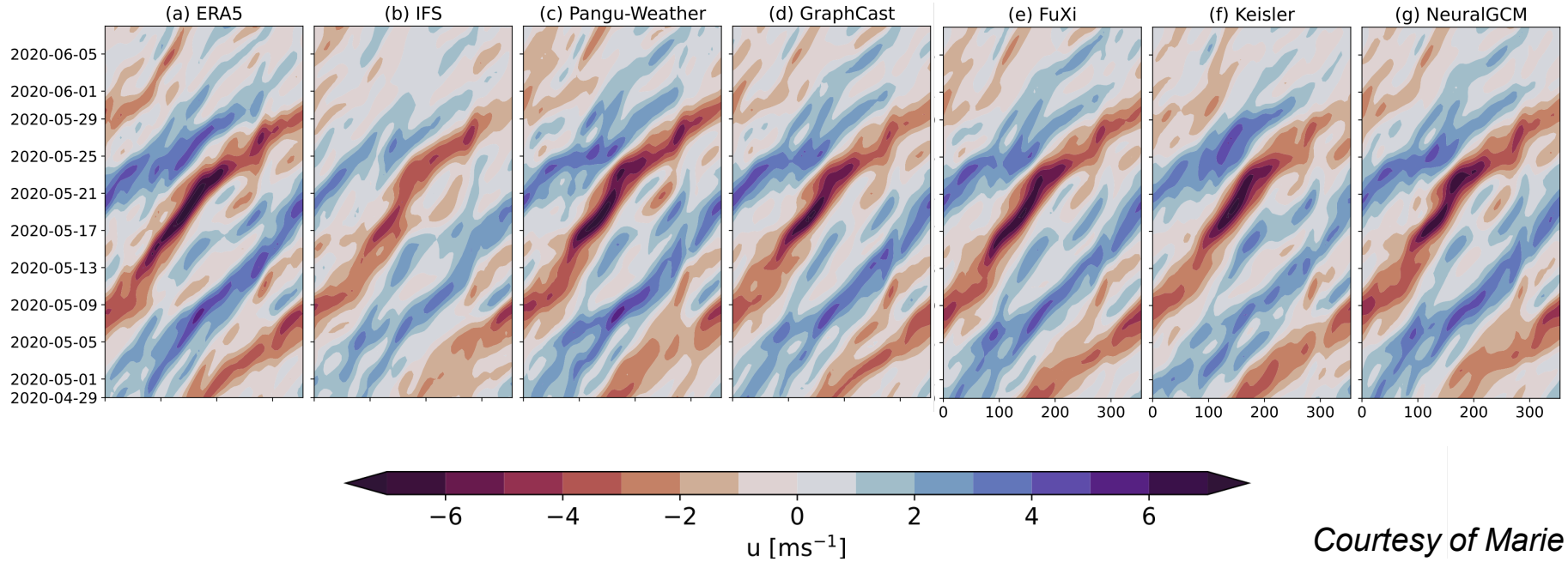


Africa

Forecast evaluation

(comparison of model vs. data-driven forecasts based on the BSc thesis of *Marie Müller* at KIT)

5-day forecasts of KW in U_{850hPa} (FWF-FFT)



Courtesy of Marie Müller (KIT)

Conclusions

- Tropical waves shape synoptic- to planetary variability in the tropics with important ramifications for predictability (and data assimilation).
- Here we presented the first ever systematic comparison of the six most common objective identification methods.
- A case study and a climatological analysis show considerable differences with respect to amplitude, spatial scale, and phase speed.
- KW: Frequency-wavenumber filter (FWF) methods show more fine-scale structure and slower propagation than spatial projection methods
- MRG (& ER): Generally large discrepancies between methods
- **Combine time-space filtering & spatial projection methods for robust results!**
- **Think about underlying assumptions when interpreting discrepancies!**