Sun-to-Earth CME Modeling with OSPREI: **Using Ensembles to Explore Uncertainties**

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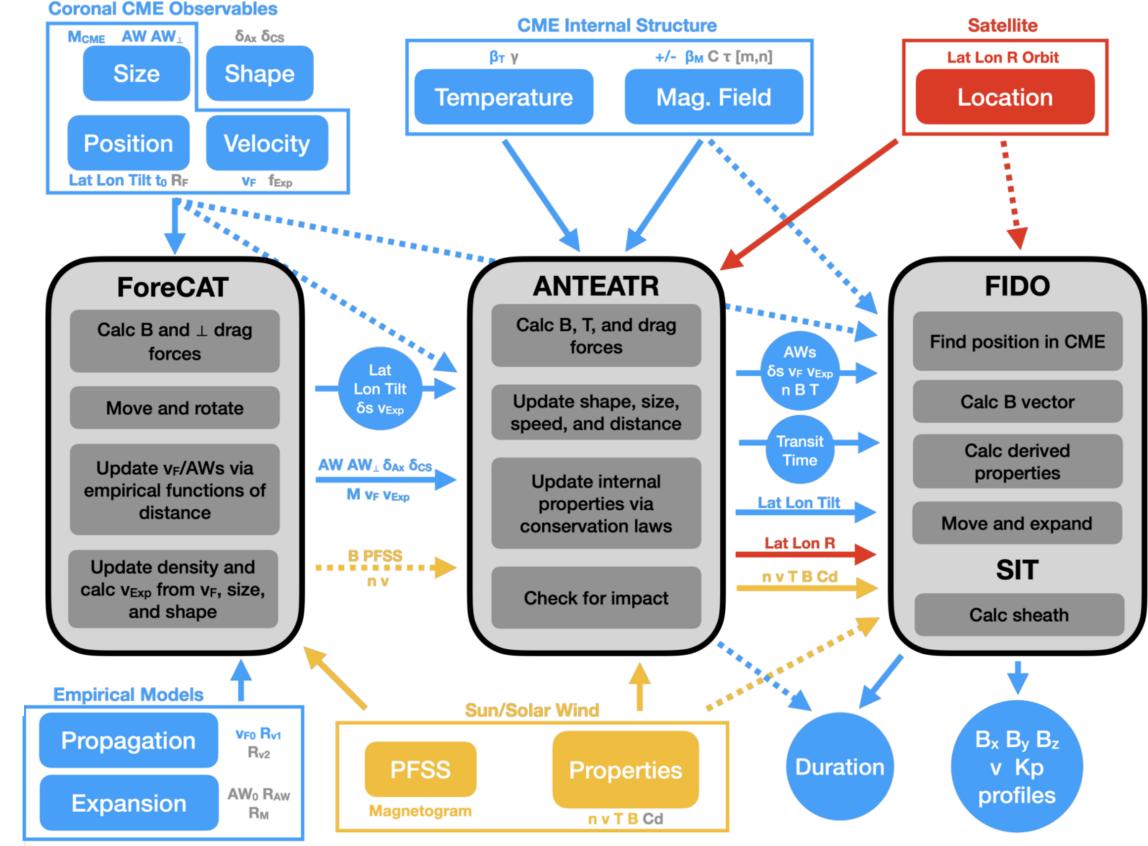
Kay, Mays, Collado-Vega (2022), Space Weather, 20, 4, e2021SW002914

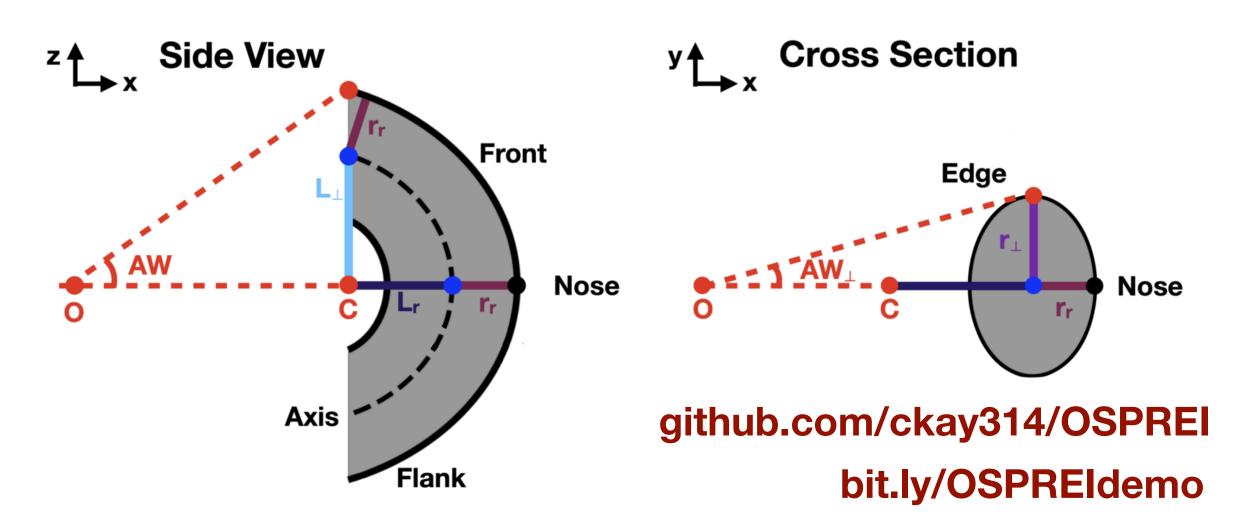




OSPREI Suite

- Set of three fully-coupled models to describe the Sun-to-Earth evolution of CMEs
- ForeCAT coronal deflection and rotation of CMEs from background magnetic forces
- ANTEATR interplanetary propagation including CME expansion and deformation
- **FIDO** in situ magnetic field and velocity profiles
- Toroidal axis shape is hybrid of parabola and ellipse
- Elliptical cross section

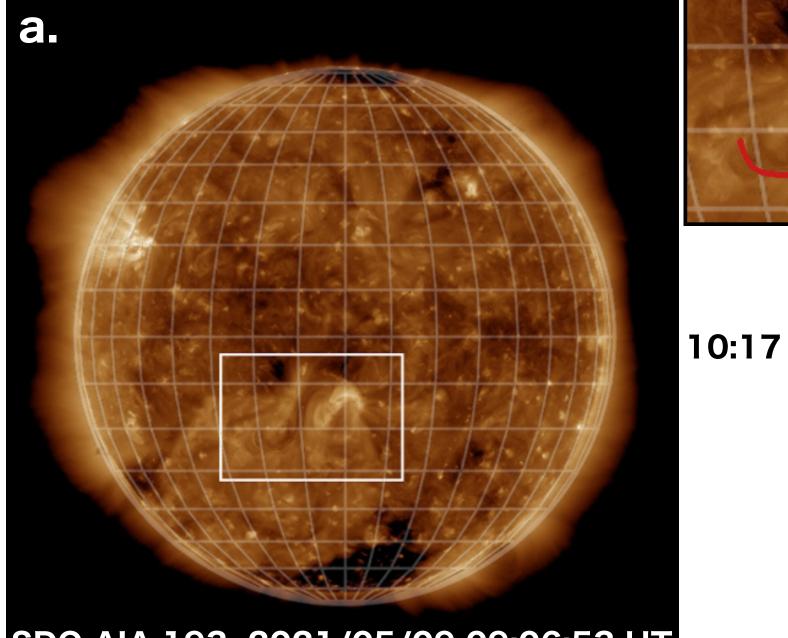


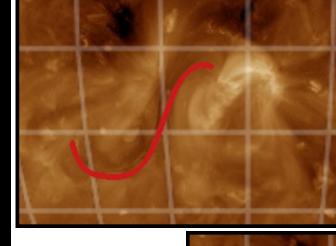


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Test Case

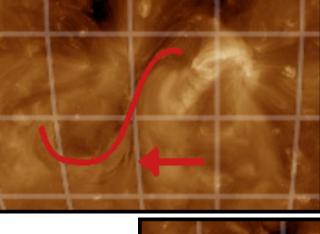
- Approach test case as if we were forecasting in real time
- Eruption on 2021 May 09 at 10:06 UT around S20E10, shock arriving at 05:48 UT on May 12 (DONKI catalog)
- EUV signatures earliest movement for precise timing, forward S shapes for handedness
- GCS reconstruction rough constraints on position/orientation and velocity
- In situ OMNI data shown but not used in determining inputs

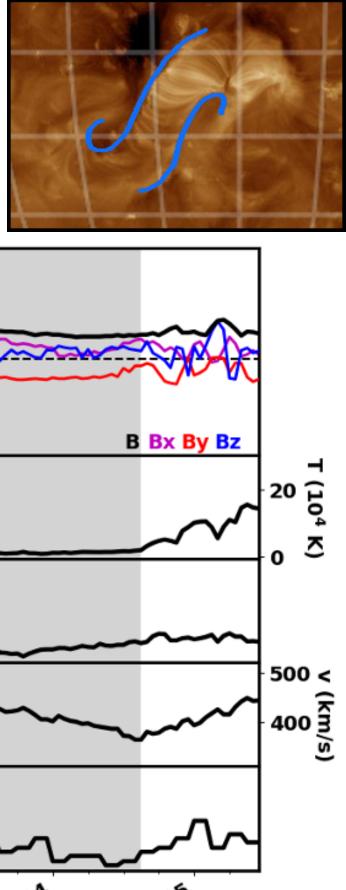




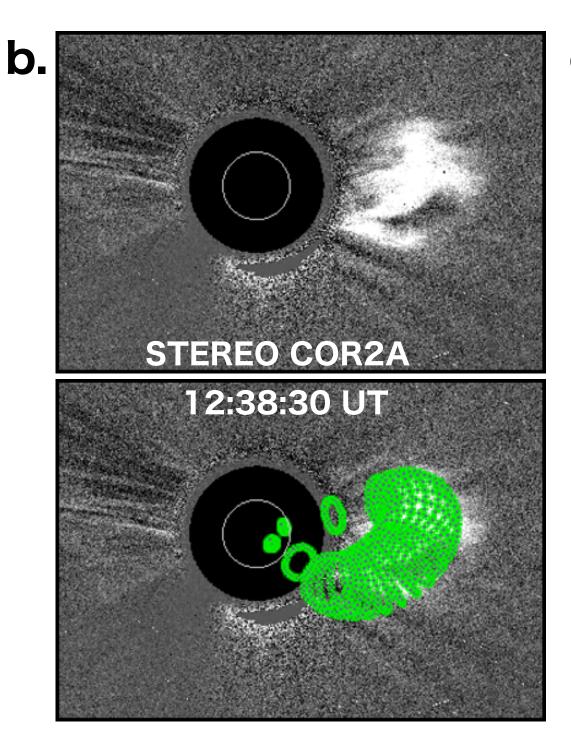
09:06 UT

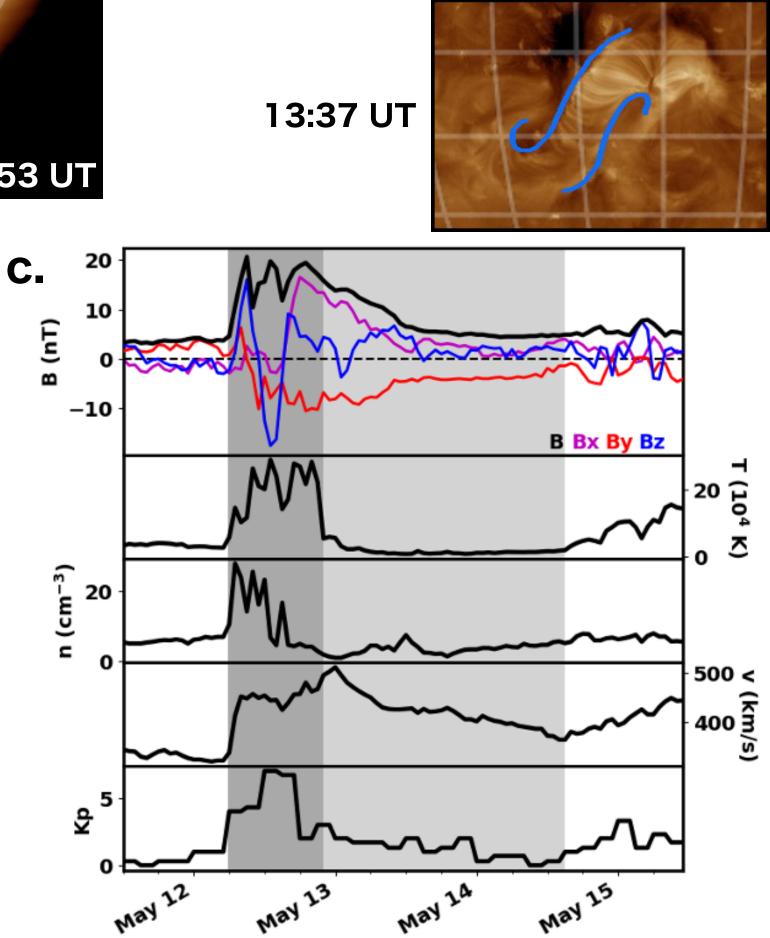
10:17 UT





SDO AIA 193 2021/05/09 09:06:53 UT





OSPREI Inputs

- left at defaults (13) but a few hard to constrain (4) inputs
- Use ensemble to sample uncertainty in 16 different inputs

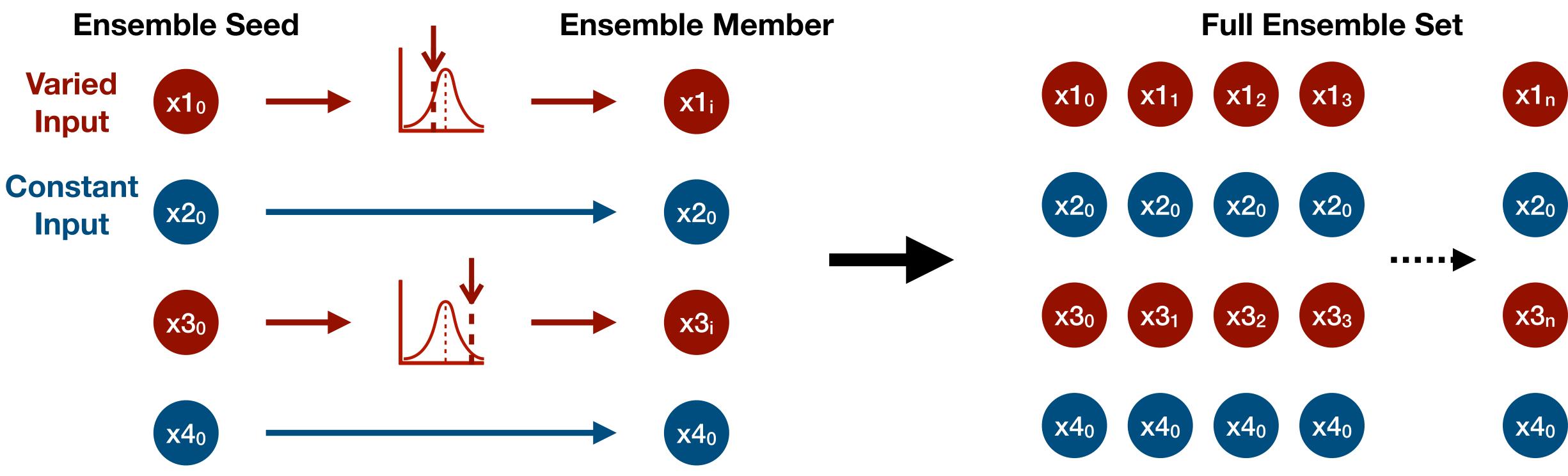
Parameter	CME 1	Source	Parameter	CME 1	Source
ForeCAT CME Properties			ANTEATR CME Properties		
	2021/05/09	EUV	Flux rope magnetic scaling (β_M)	$4{\pm}0.25$	-
Start time (t_0)	09:00 UT		Elliptical flux rope model powers ([m,n])	[0,1]	Default
Starting nose height (R_{F0})	$1.1 R_s$	Default	Elliptical flux rope model twist (τ)	1	Default
Initial latitude (Lat)	$-12\pm1^{\circ}$	EUV/DONKI	Elliptical flux rope model tor/pol ratio (C)	1.927	Default
Initial longitude (Lon)	$-10\pm1^{\circ}$	EUV/DONKI	Flux rope temperature scaling (β_T)	$4{\pm}0.25$	-
Initial tilt (Tilt)	$45\pm5^{\circ}$	EUV	Adiabatic index (γ)	$1.33{\pm}0.1$	Default
Max coronal velocity (v_F)	$800{\pm}50 \text{ km/s}$	GCS/DONKI	Interplanetary expansion factor (f_{Exp})	$0.5 {\pm} 0.1$	Default
Max coronal angular width (AW)	$30\pm5^{\circ}$	GCS/DONKI	EIDO CME Droportion		
Max coronal perpendicular AW (AW_{\perp})	$10\pm1^{\circ}$	—	FIDO CME Properties	Diaht	DIN
Maximum mass (M_{CME})	$3{\pm}0.5{\times}10^{15}~{ m g}$	—	Flux rope handedness $(+/-)$	Right	EUV
Coronal axis aspect ratio (δ_{Ax})	$0.75 {\pm} 0.1$	Default	Solar Wind Properties		
Coronal cross section aspect ratio (δ_{CS})	$1{\pm}0.1$	De fault	Solar wind 1 AU velocity	$350{\pm}25~{\rm km/s}$	OMNI
ForeCAT empirical models			Solar wind 1 AU density	$5\pm1~{\rm cm}^{-3}$	OMNI
Initial slow rise velocity (v_{F0})	40 km/s	EUV/GCS*	Solar wind 1 AU magnetic field	5 ± 1 nT	OMNI
Start of rapid acceleration (R_{v1})	$1.5 R_s$	EUV/GCS*	Solar wind 1 AU temperature	$4{\times}10^4~{ m K}$	OMNI
Height of max coronal velocity (R_{v2})	$1.0 R_s$ $10 R_s$	Default	Drag coefficient	1	Default
Expansion model initial AW (AW ₀)	$10 \ n_s$ 5°	Default	Satellite Parameters		
Expansion model length scale (R_{AW})		Default		9 9 0	Forth locatio
Height of max mass (R_M)	$\begin{array}{c} 1 \ R_s \\ 10 \ R_s \end{array}$	Default	Latitude	-3.3°	Earth locatio
(n_M)	$10 \ m_s$	Defuuit	Longitude	· /	Earth locatio
			Distance Orbital Speed	$213 R_s$	
			Orbital Speed	$2.8 \times 10^{-6} \text{ rad/s}$	Earth's orbit

• Large number of input parameters (34) but most have sources (17) or can be

All longitudes in Stonyhurst coordinates at the start time

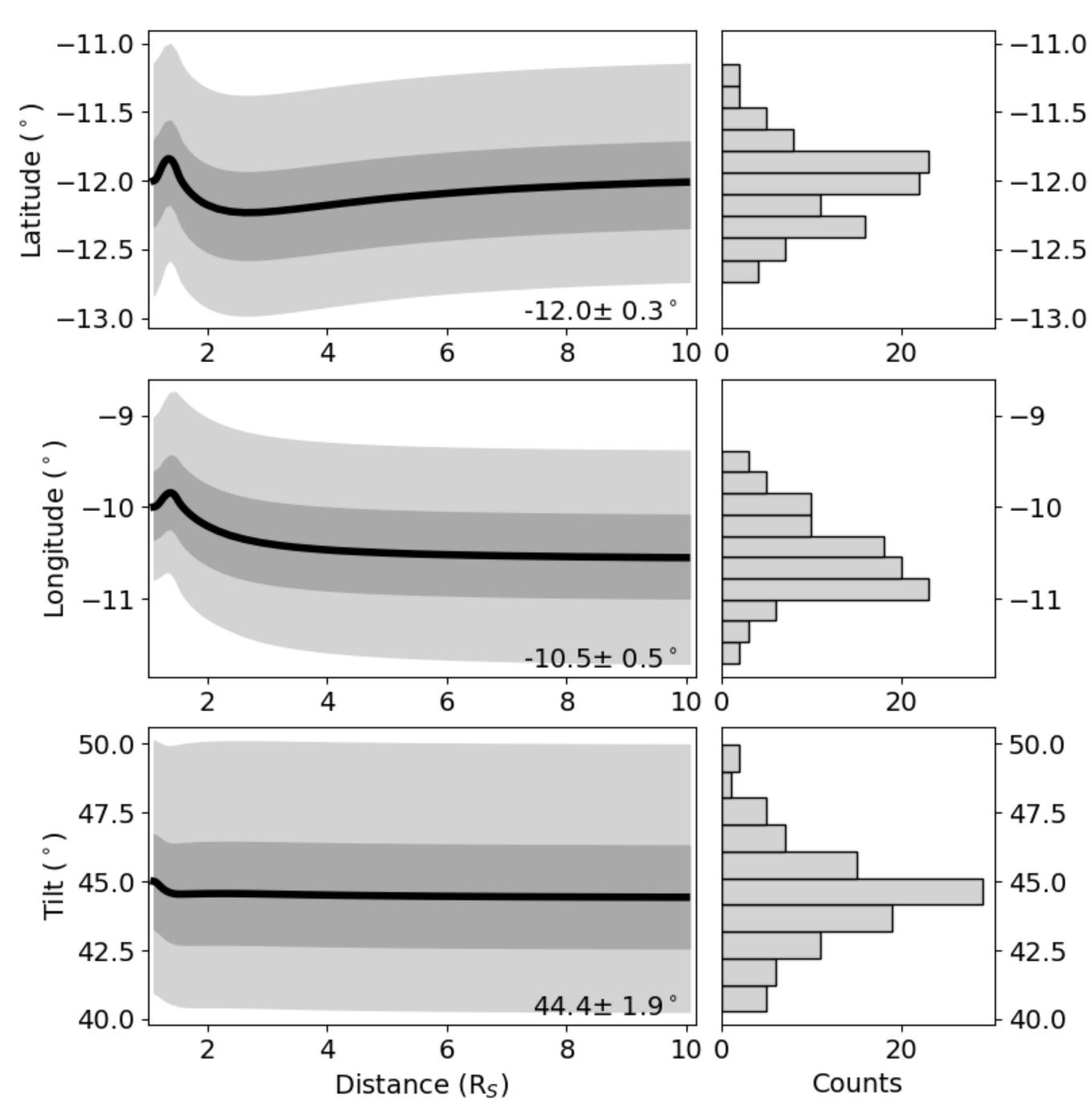
OSPREI Ensembles

- Individual components very efficient (~min/simulation) allowing for ensemble simulations on prediction timescales
- Use ensembles to explore sensitivity to uncertain input parameters
- Pick certain inputs to vary, simultaneously vary them randomly while holding all other parameters constant

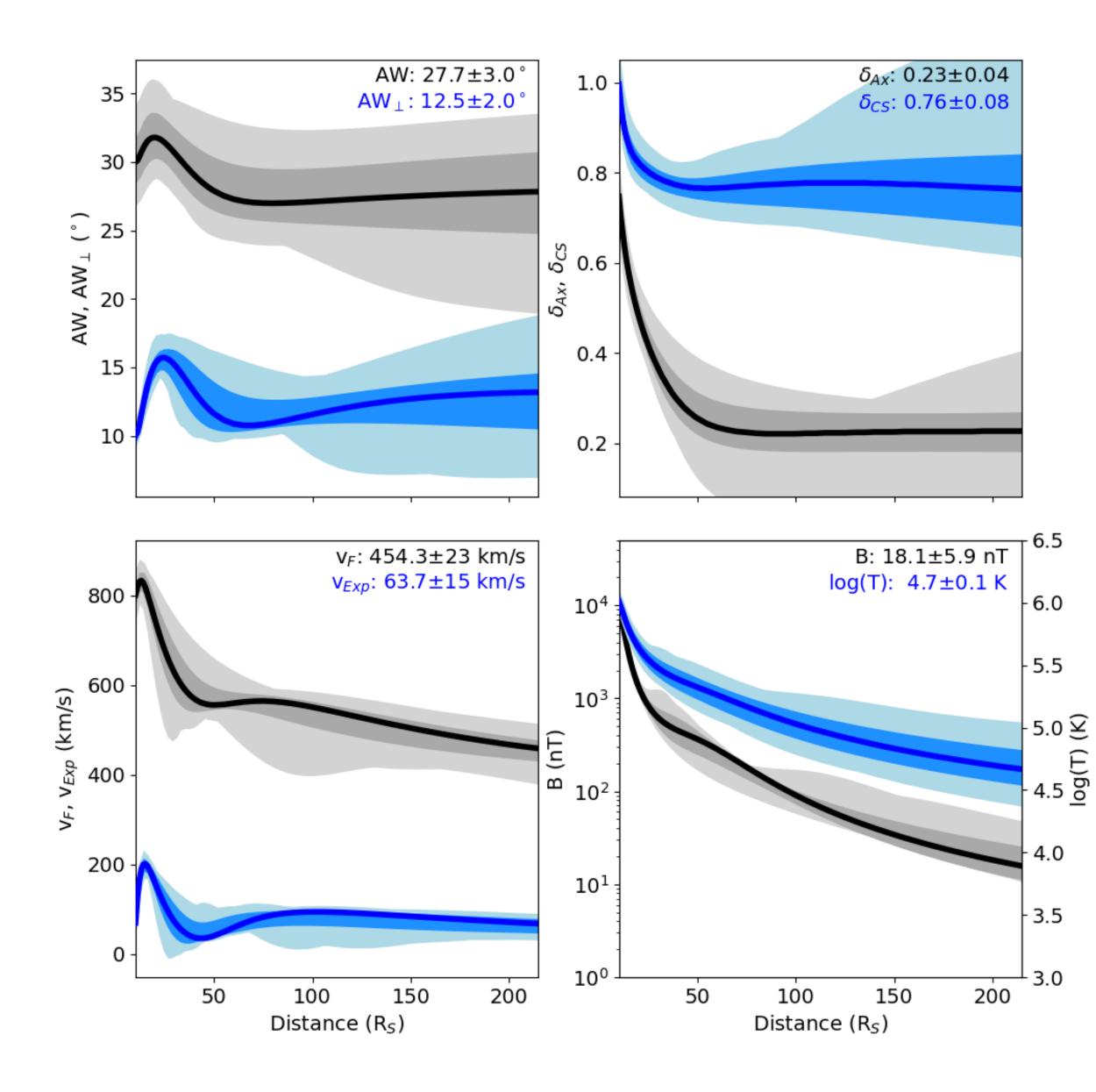


Coronal Results

- ForeCAT results for the coronal deflection and rotation versus distance
 - Black line shows ensemble seed, dark gray region is core of ensemble, light gray is full extent
- OSPREI varies inputs normal distribution with σ set to 1/3 of provided uncertainty (99.7% of random values within given range)
- Negligible deflection or rotation for this case → spread in each output is essentially the same the corresponding spread in that input



Interplanetary Results





- IP model simulates deceleration, expansion, and deformation
- IP evolution affected by CME geometry, speed, internal properties and solar wind properties → direct relationship between inputs/outputs less obvious than in coronal model
- Most cases behave similarly with subtle changes in exact value but see some extreme outliers
 - Synergistic variation in multiple inputs leads to greater output variation
 - More on diagnosing these cases later

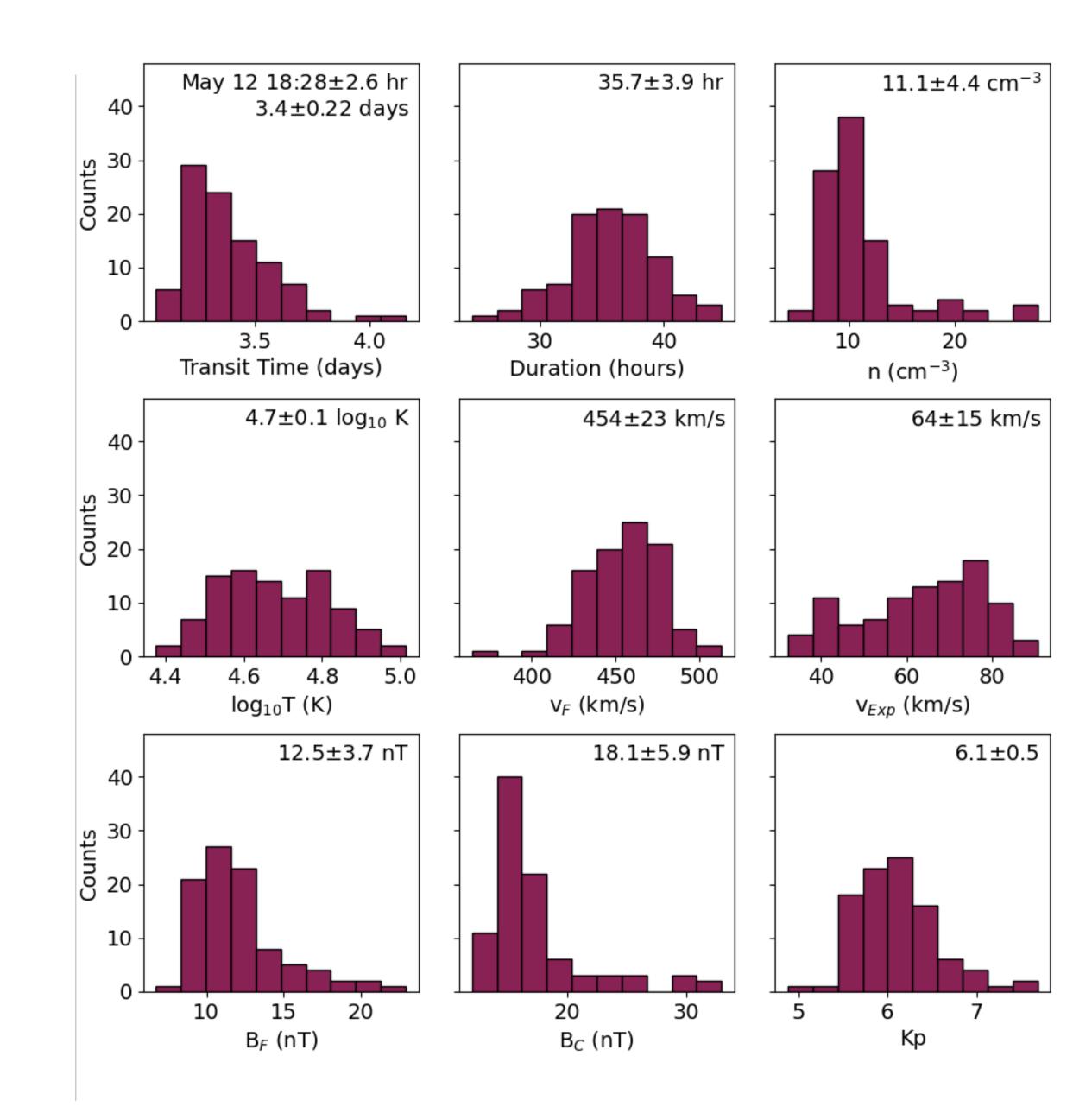


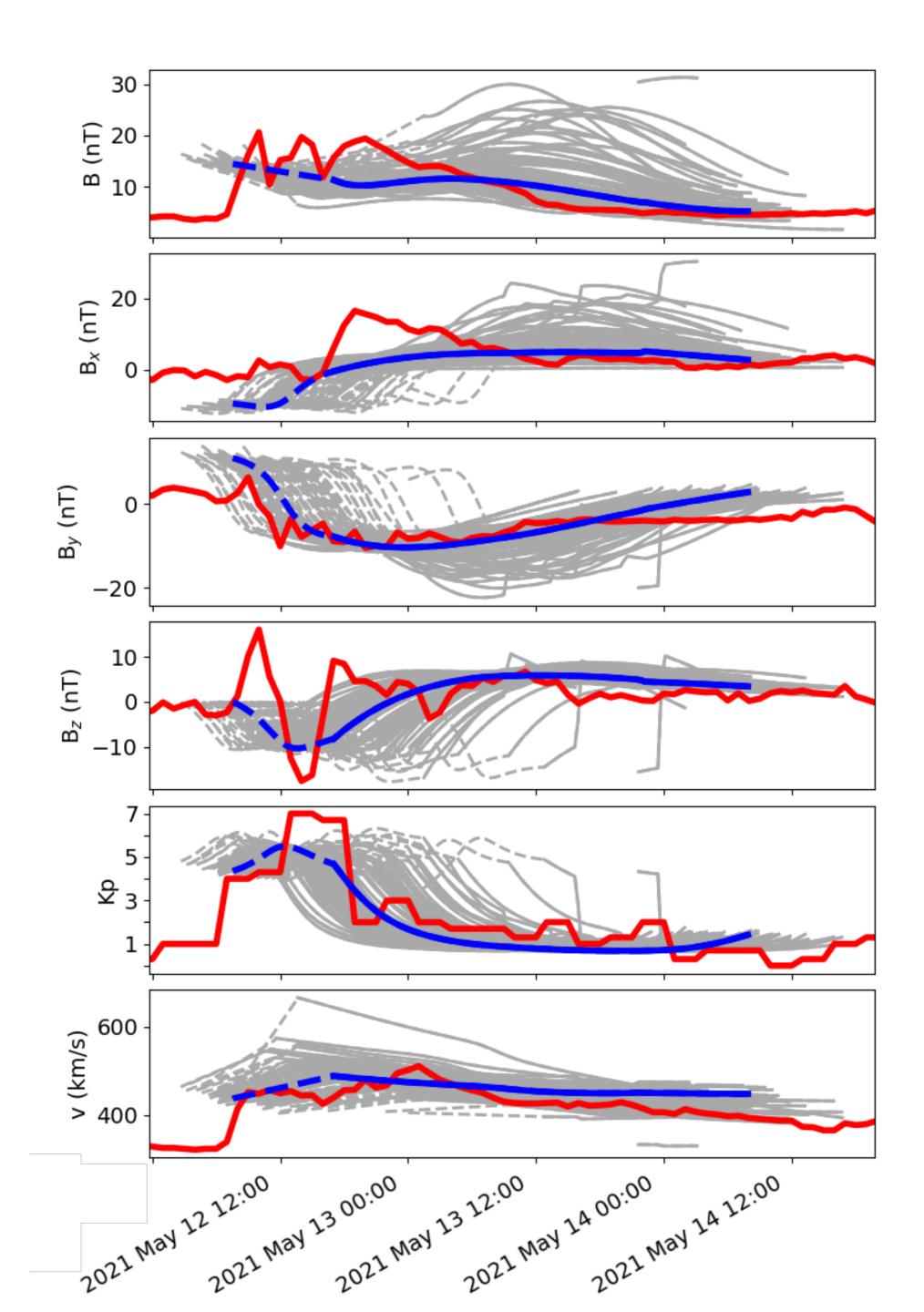


Interplanetary Results

- For forecasting purposes, the full IP evolution is likely unnecessary
- Produce histograms of parameters important for prediction
 - Transit time, duration, internal properties, estimated Kp
- Have measure of most probable values and the spread in each one
 - Some distributions highly peaked, others are flatter







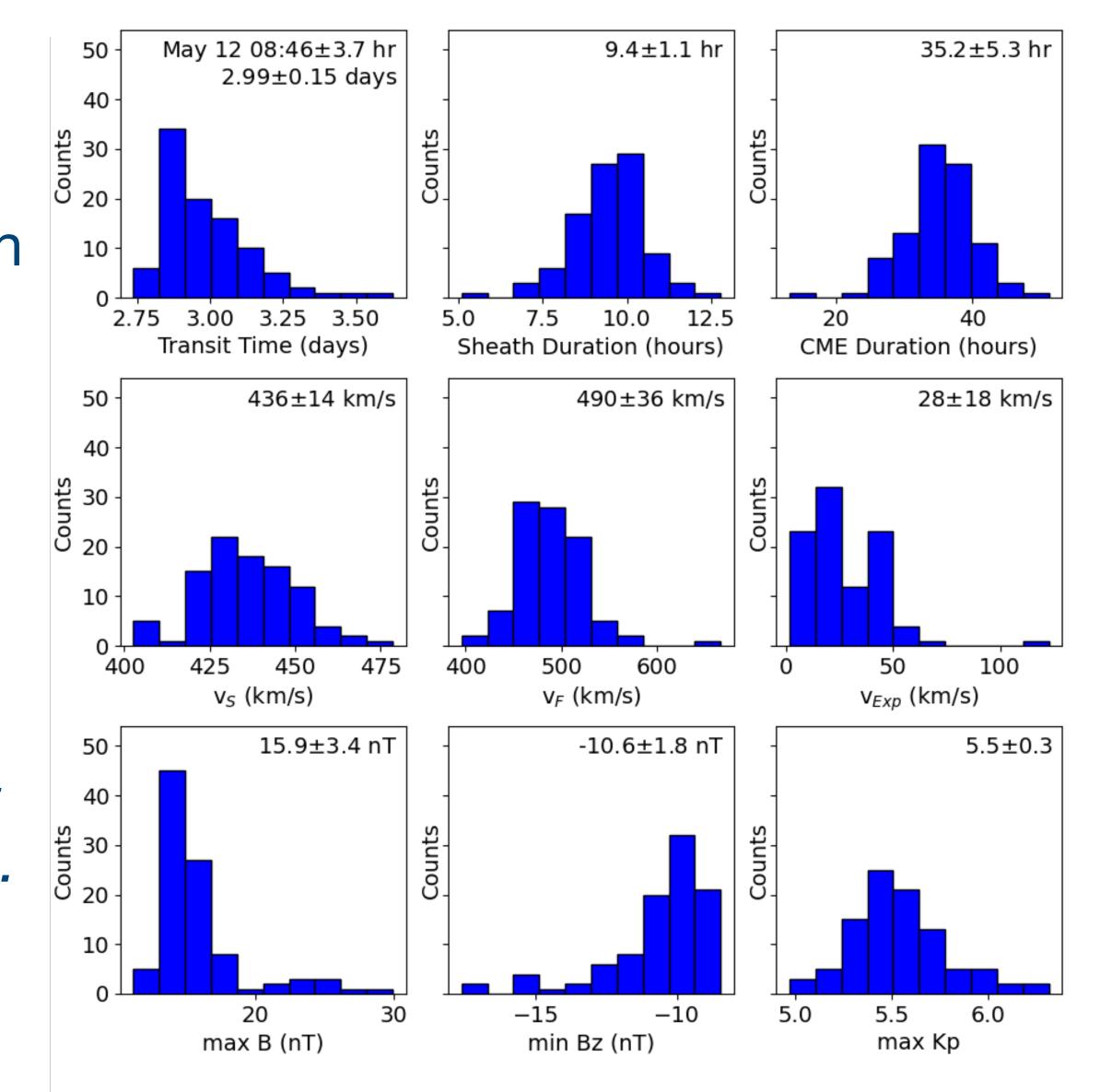
In Situ Results

- In situ model uses modeled arrival time and evolved CME parameters to create profile for CME-driven sheath (dashed) and flux rope (solid)
- Wide range in arrival times, profiles mostly similar but vary in magnitude, some extreme outliers
- Standard/obvious way of visualizing results but somewhat hard to derive meaning from overlapping cases
- Pile of spaghetti rather than useful probabilities



- Histograms for forecasting-relevant outputs
- Some duplicated parameters between in situ and IP histogram
 - IP model makes approximation of the exact geometry of the spacecraft/CME interaction, in situ model does not
- Somewhat useful, but loses all information about where most neg Bz occurs, how long it stays southward...

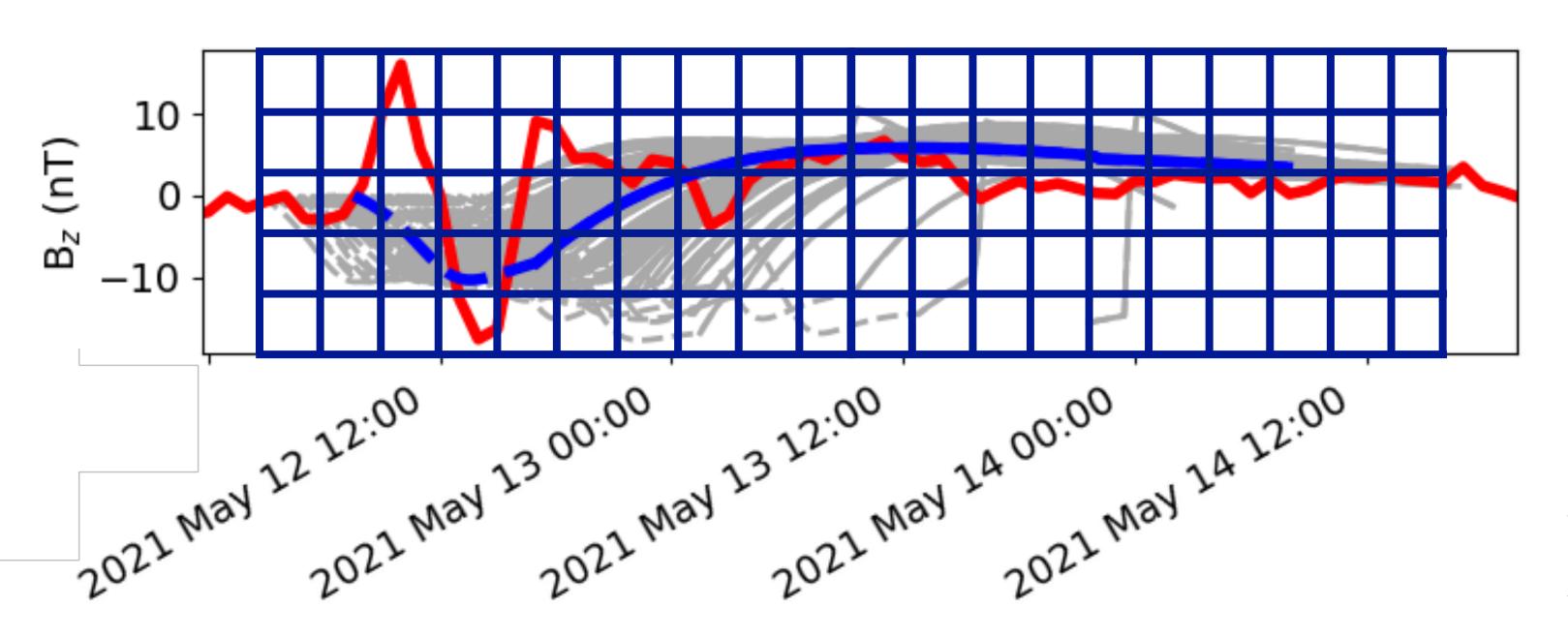
In Situ Results

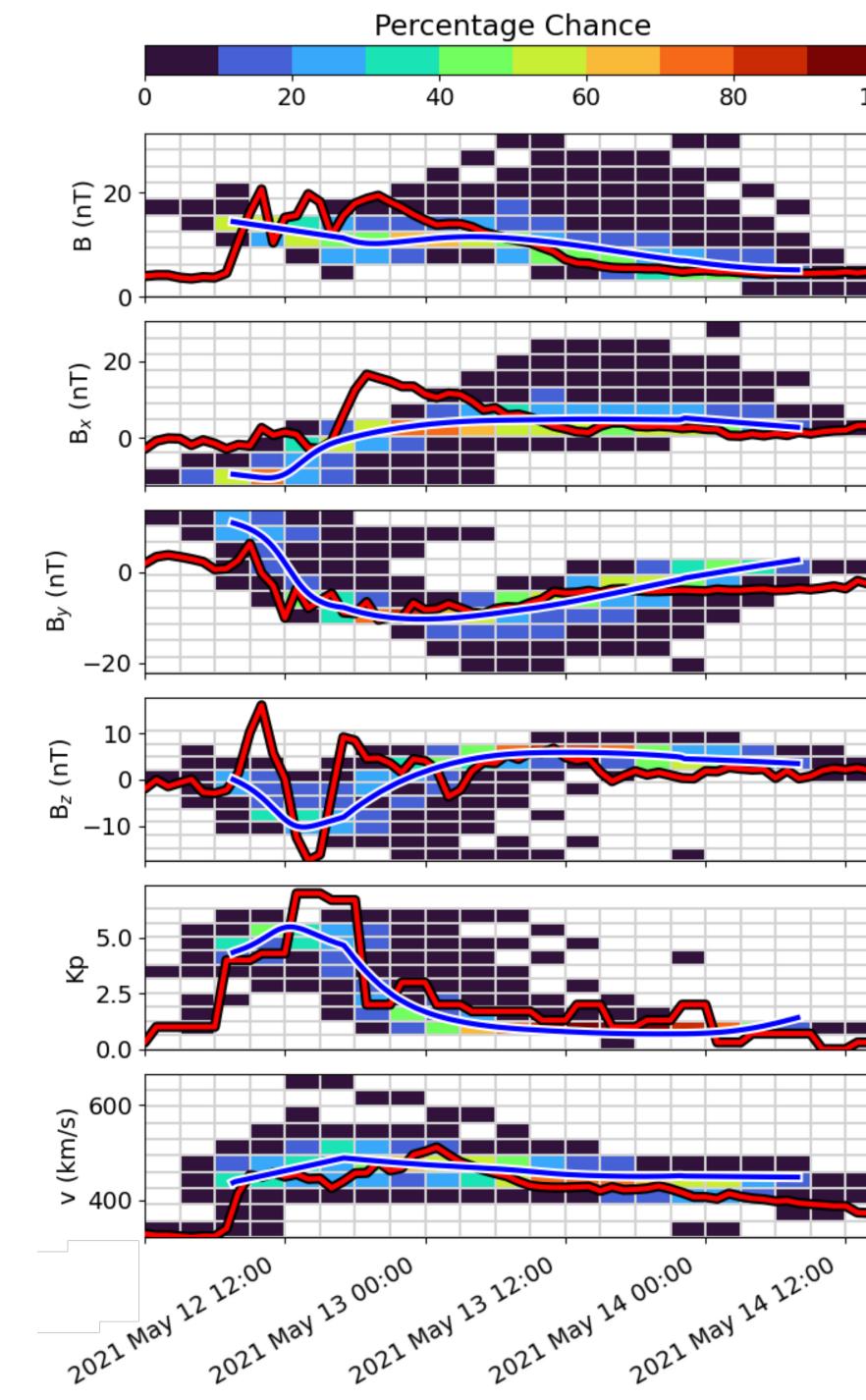




Novel Visualization 1

 Develop new visualization that retains the time dependence of the full in situ profiles, but allows for quick identification of the most probable values and their range





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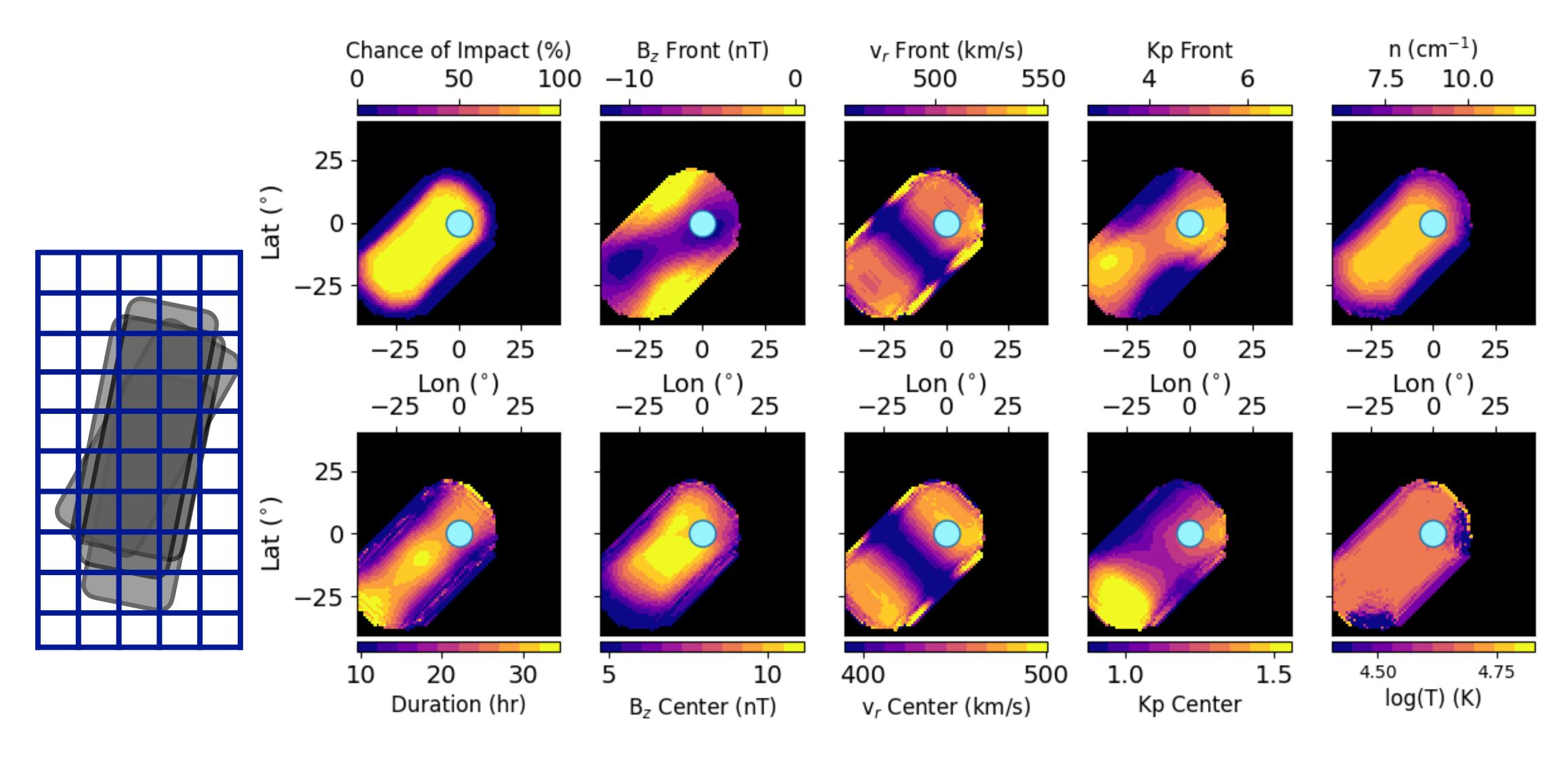
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Novel Visualization 2

Similar approach for spatial variations in critical forecasting outputs



Direct Relations between Inputs and Outputs

- between certain inputs and outputs
- how uncertainty in an input translates into uncertainty in an output
 - e.g. uncertainty in the initial AW
 - Larger size means less dense
 - More deflection and rotation \rightarrow could move toward or away from satellite depending on geometry of situation
 - Stronger interplanetary forces \rightarrow typically more expansion closer to Sun, potentially contraction farther out if it overexpands early on?
 - Cannot say, in general, whether increasing AW leads to a more "direct" hit or changes the CME properties to create a more severe impact
- Need a way of quickly visualizing the relation between inputs and outputs for each case

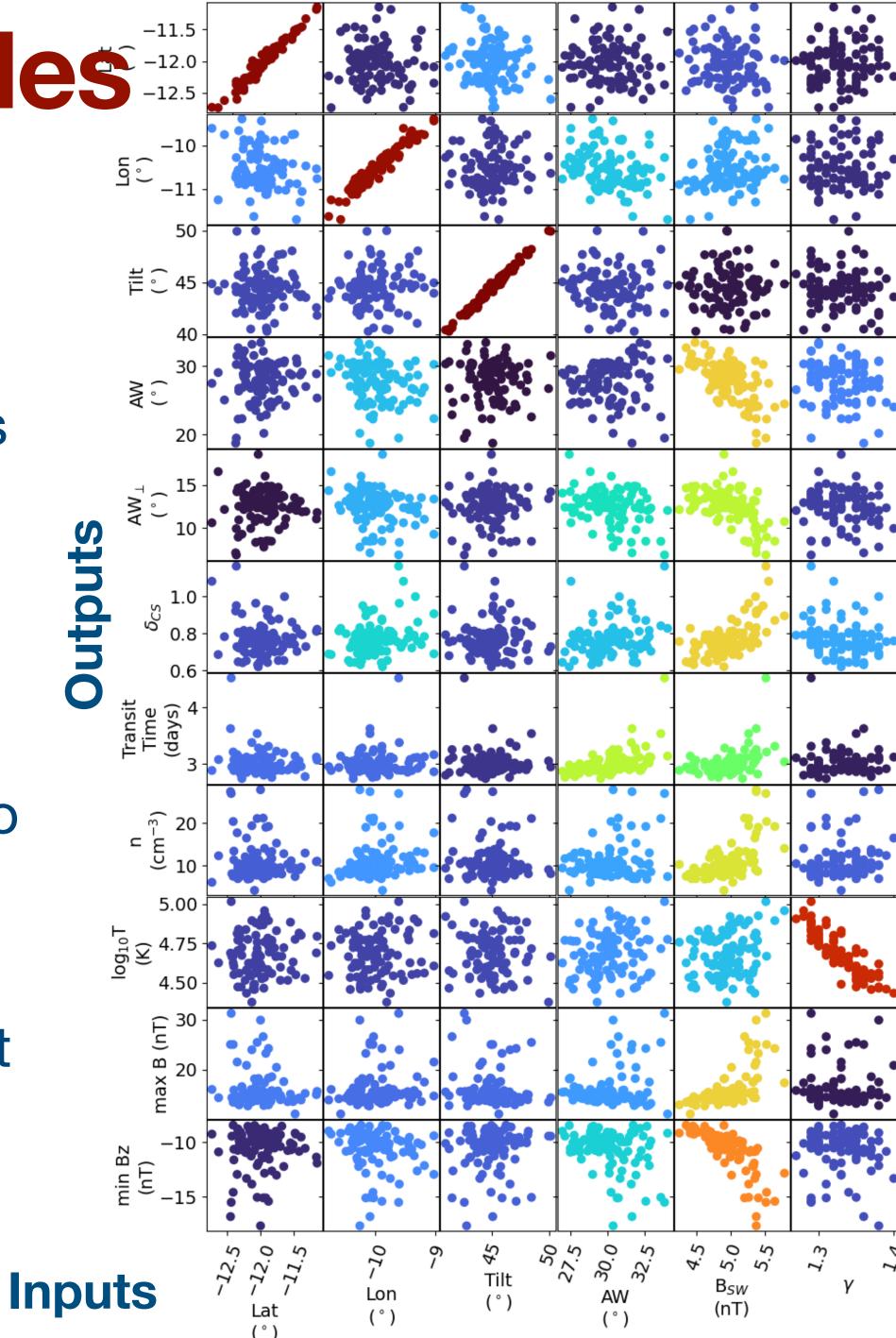
For this case, for the coronal portion we could easily track the correlation

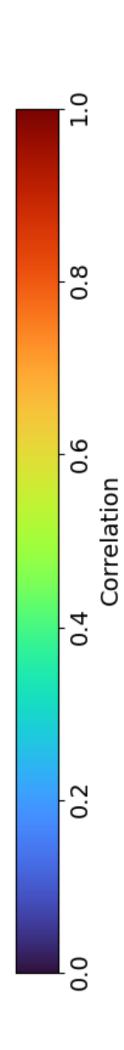
• As we couple models, effects begin to compound and it may not be obvious

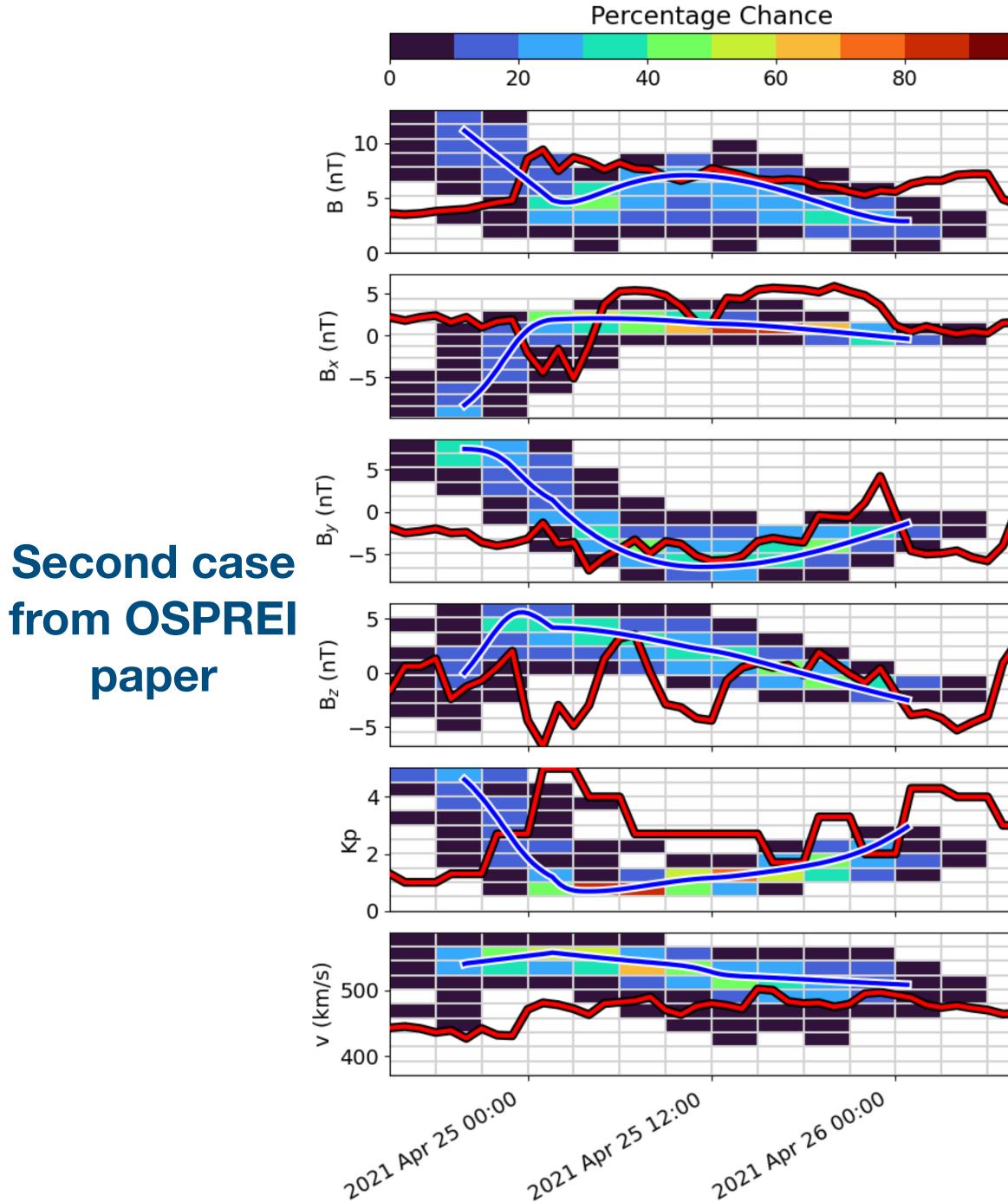


Diving Deeper into Ensembles

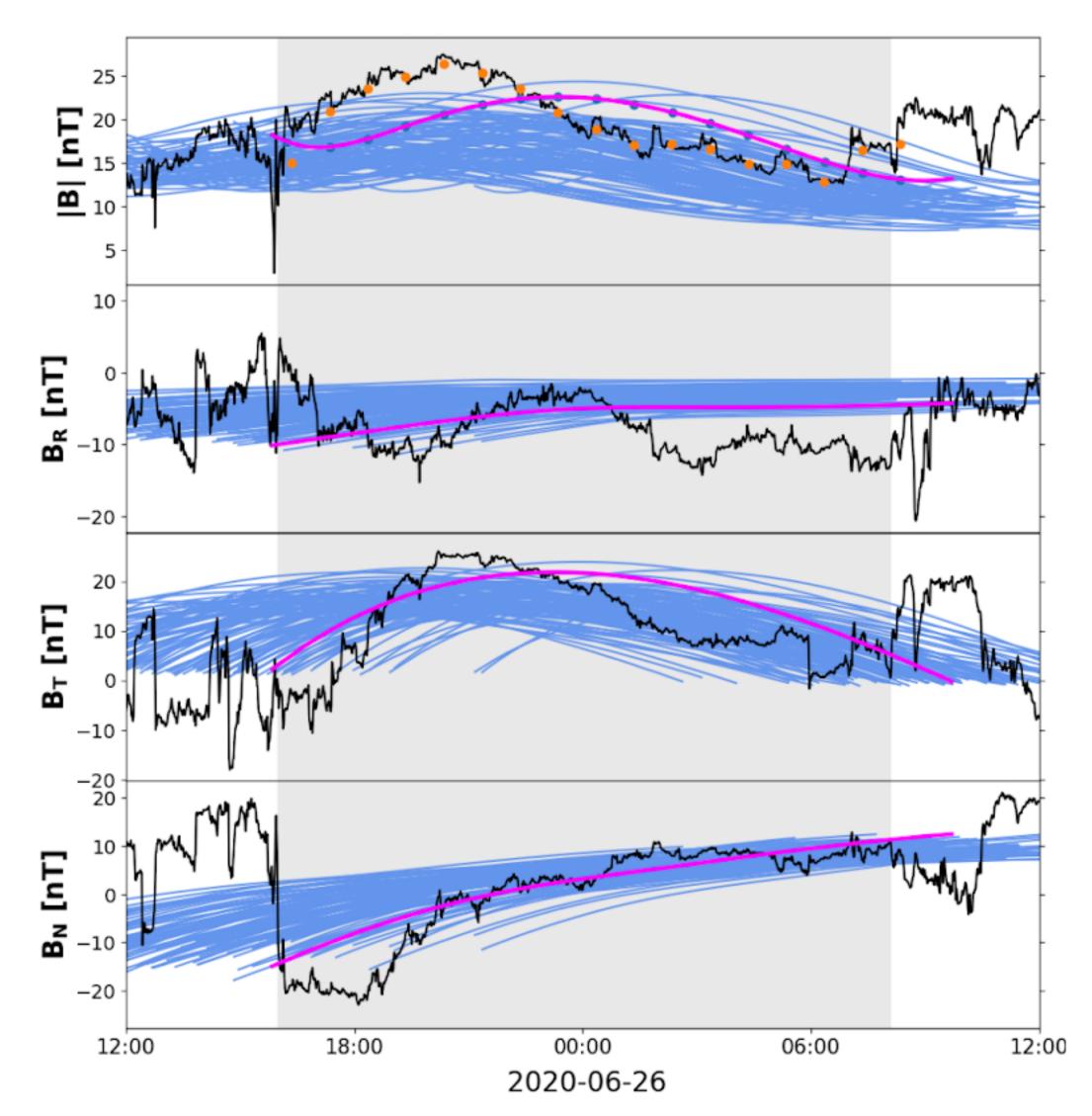
- Algorithm automatically pulls out any combination of input and output that have a "meaningful" combination
- Many of the strongest correlations are the obvious ones
 - Initial/final position, adiabatic index and final temperature
- Less obvious correlations become apparent
 - Solar wind B and final cross section aspect ratio
- AW has slight correlation with transit time (~0.5) but weak correlation with other outputs, highlight the compounding of different effects from different input parameters
- Outlier cases become apparent







OSPREI in Action



CME observed by PSP (Palmerio et al. 2021)

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Summary

- creative visualizations designed to facilitate space weather forecasting.
- and/or multiple models couple together in nonlinear fashions
- to Mars Space Weather Office

Questions? Comments? contact C. Kay at kayc@cua.edu Ask for an OSPREI sticker!

• OSPREI combines existing CME models into a new, fully-coupled, highly efficient suite. It generates systematic outputs that are automatically processed into

• By running ensembles, OSPREI provides information on the most probable Sun-to-Earth behavior, as well as the range of possibilities. Sometimes there is an obvious link between uncertainty in inputs and uncertainties in outputs. Other times there is not a direct relation as the effects from multiple inputs

 We have begun the onboarding process with NASA's Community Coordinated Modeling Center so that OSPREI runs will be available upon request and forecasts can be generated using the real-time CME analysis from the newly formed Moon

