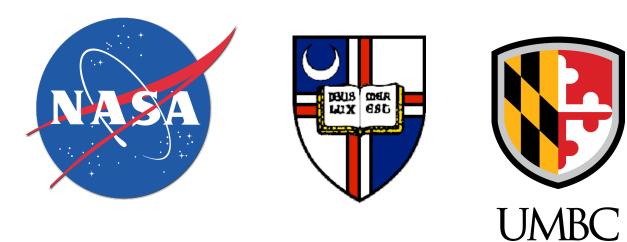
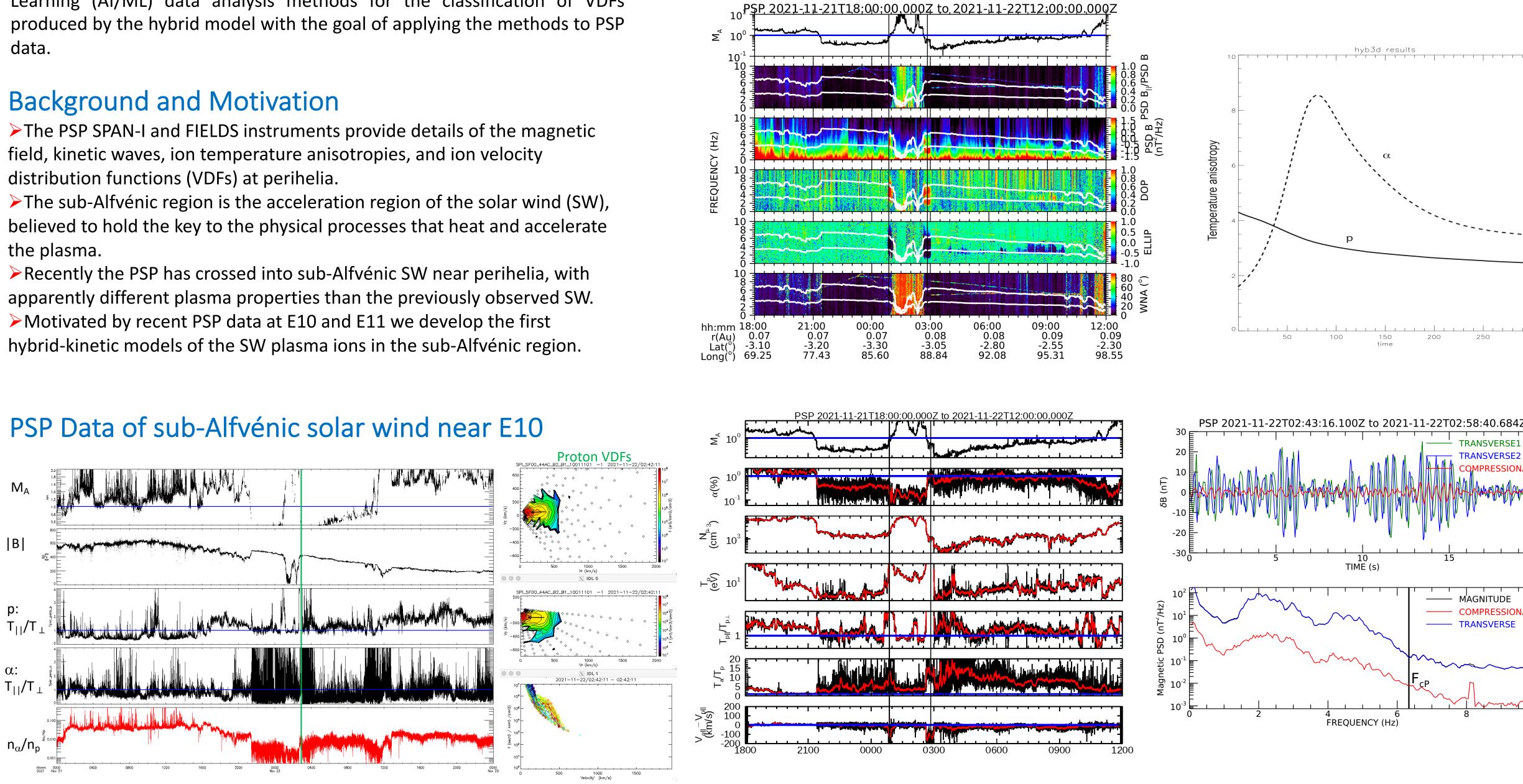
## Solar wind proton and $\alpha$ particle velocity distributions, temperature anisotropies, and heating models guided by Parker Solar Probe perihelia data



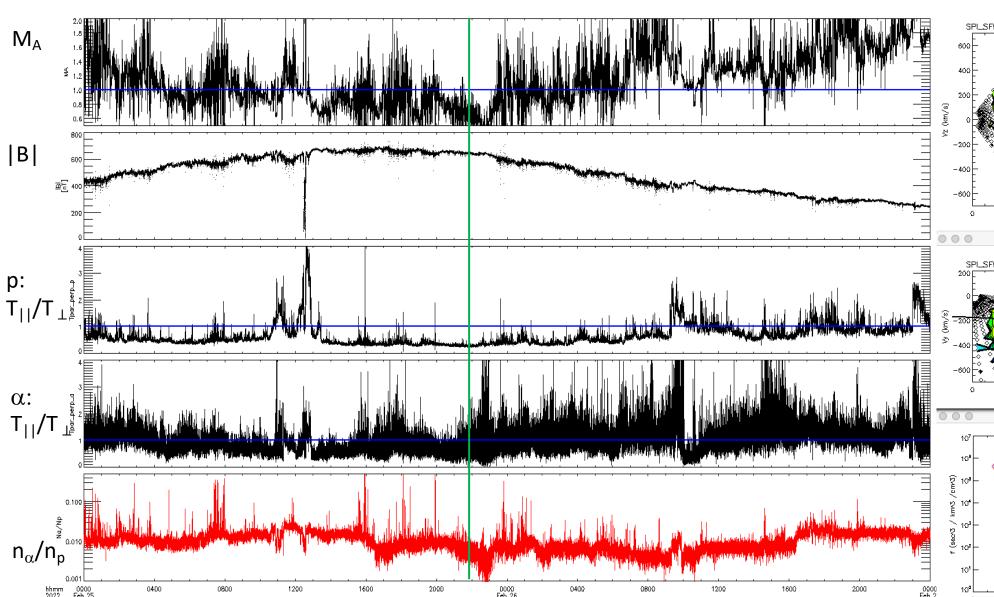
# (SSL/UC Berkeley)

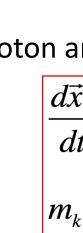
#### Abstract

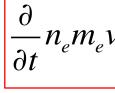
We analyze the PSP/SPAN-I data of the proton VDFs with beams during perihelia encounters, as well as plasma moments such as density, anisotropic temperature, and alpha particle data. The FIELDS instrument provides the corresponding kinetic wave activity magnitude, spectra and polarizations that helps identify the dominant kinetic wave modes. Guided by the observations, we use 2.5D and 3D hybrid-particle-in-cell (hybrid-PIC) models of kinetic protons and alpha particles with background electron fluid in an expanding box model to study the kinetic instabilities driven by unstable VDFs such as super-Alfvénic beams and ion relative drifts in the inner solar wind. The model studies the super-Alfvénic as well as sub-Alfvénic solar wind properties. The proton and  $\alpha$  particle populations physical properties, such as the drift speeds, anisotropic temperatures, magnetic energy and spectra are modeled and compared to observed PSP solar wind data near perihelia. We find the ion kinetic instabilities associated with the plasma properties and investigate in the conversions between the kinetic energy from ion instabilities to magnetic and thermal energies in the solar wind plasma. In particular, the quantification of the partition the couplings between  $\alpha$  particle and proton populations through wave-particle interactions provide insights into the heating and acceleration of the solar wind plasma. We will investigate Artificial Intelligence Machine Learning (AI/ML) data analysis methods for the classification of VDFs



## PSP Data of sub-Alfvénic solar wind near E11



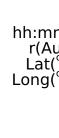




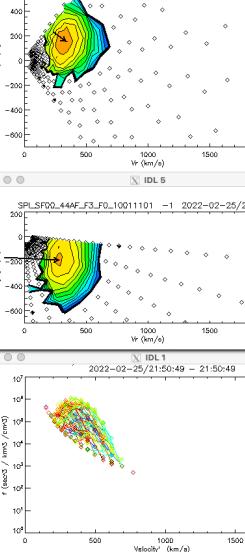
where  $p_e = n_p T_p$  and quasi-neutrality:  $n_e = n_p + Z n_i$ . Periodic boundary conditions (reflecting for shocks).







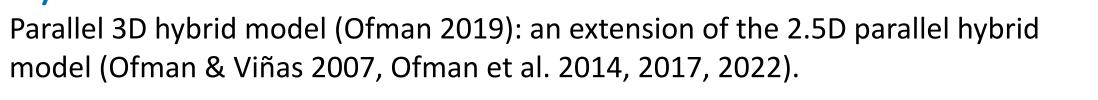
Proton VDFs

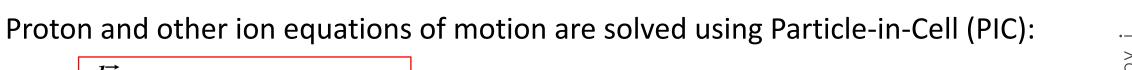


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#### Hybrid Model

#### Temporal Evolution of T anisotropies, energies, and p- $\alpha$ drift





$$\frac{d\vec{v}_k}{dt} = \vec{v}_k$$

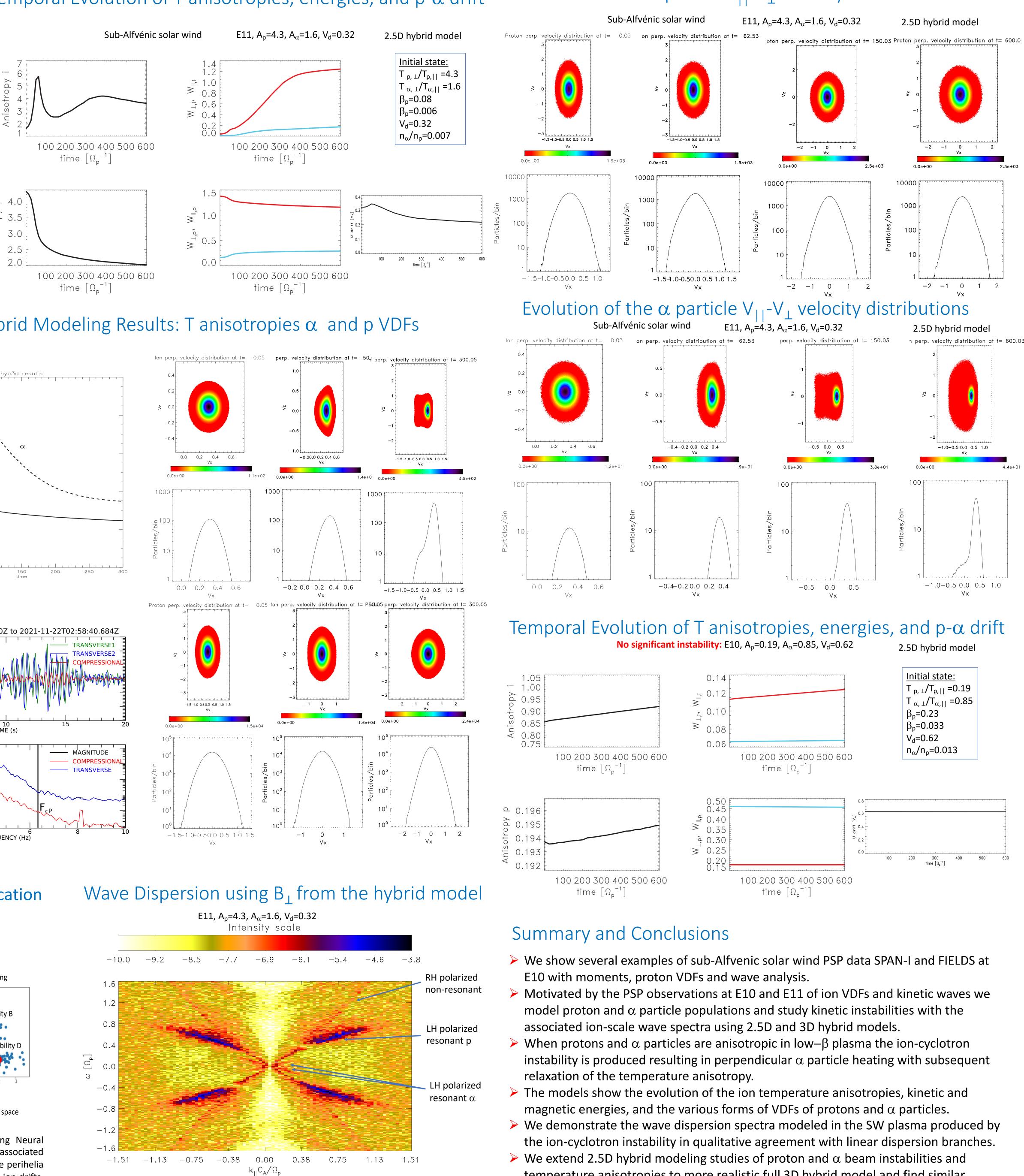
$$\frac{d\vec{v}_k}{dt} = Ze\left(\vec{E} + \frac{\vec{v}_k \times \vec{B}}{c}\right)$$

$$\nabla \times \vec{B} = \frac{4\pi}{c}\vec{J}, \qquad \nabla \times \vec{E} = -\frac{1}{c}\frac{\partial \vec{B}}{\partial t}$$

Electrons as fluid: the electron momentum equation (neglecting electron inertia) is

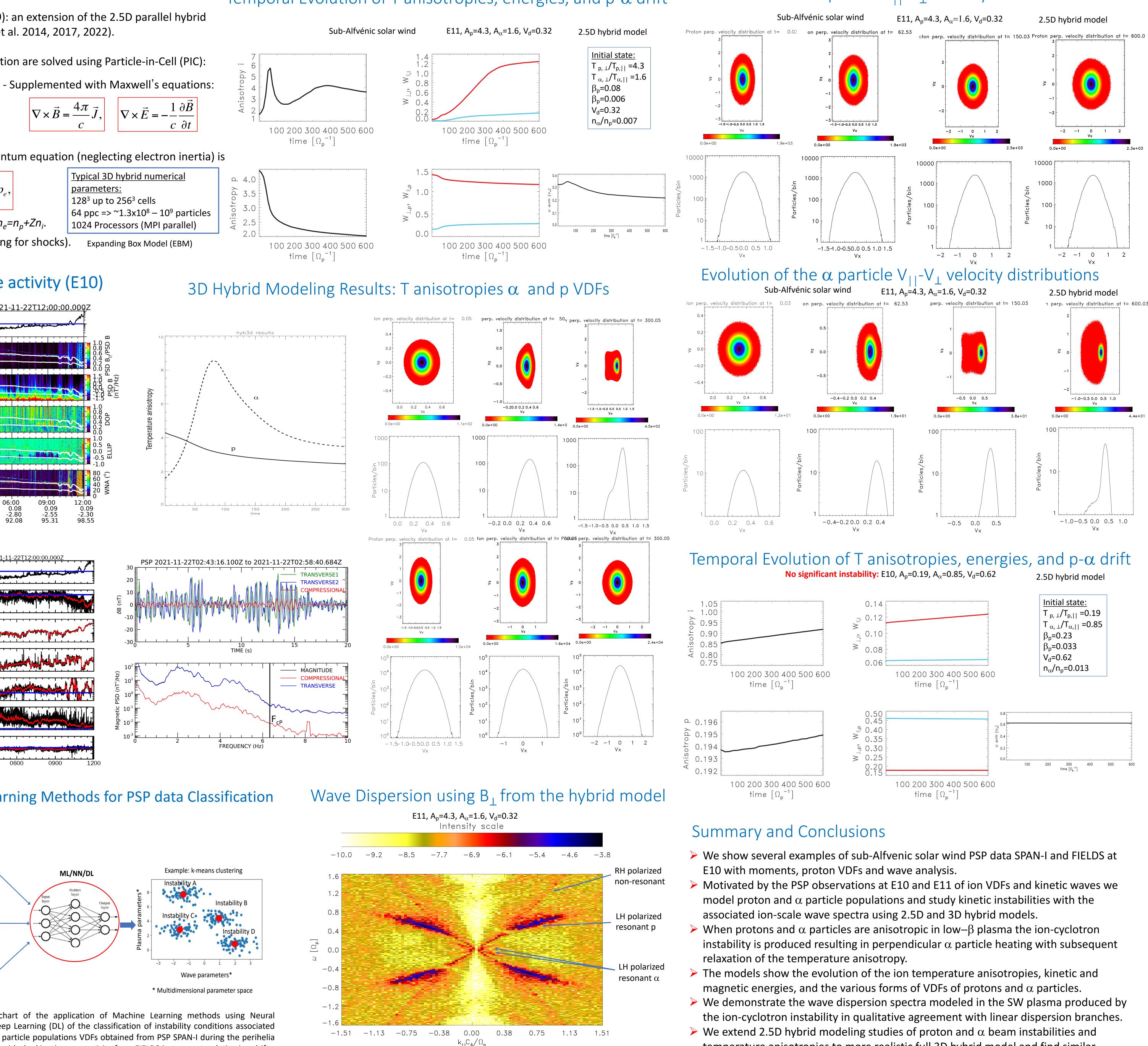
$$V_e = 0 = -en_e \left(\vec{E} + \frac{\vec{v}_e \times \vec{B}}{c}\right) - \vec{\nabla}p_e,$$

Typical 3D hybrid numerical parameters: 128<sup>3</sup> up to 256<sup>3</sup> cells 64 ppc =>  $\sim 1.3 \times 10^8 - 10^9$  particles 1024 Processors (MPI parallel) Expanding Box Model (EBM)

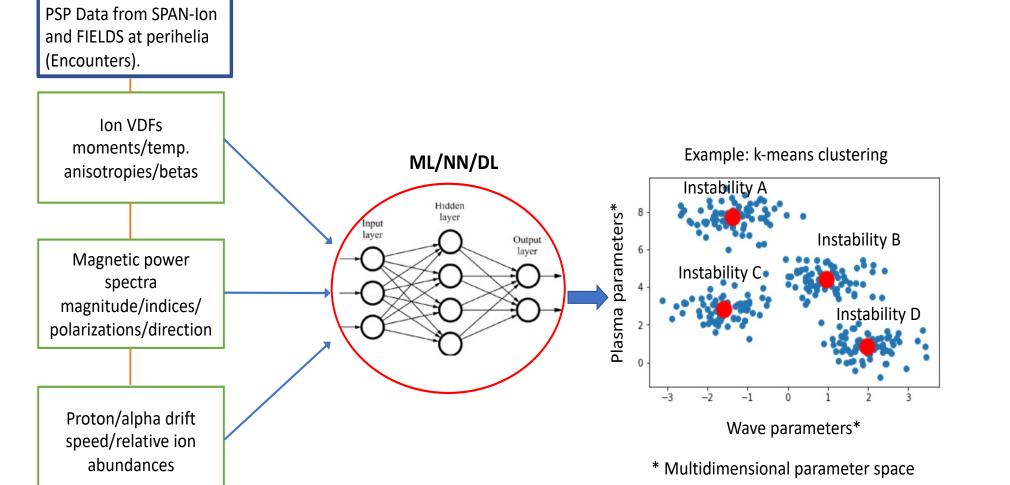


results.

## Analysis of kinetic wave activity (E10)







The conceptual flow-chart of the application of Machine Learning methods using Neural Networks (NN) and Deep Learning (DL) of the classification of instability conditions associated with the proton and  $\alpha$  particle populations VDFs obtained from PSP SPAN-I during the perihelia (encounters), together with the kinetic wave activity from FIELDS instrument, relative ion drifts, and  $\alpha$  to proton relative abundances. The output is the k-means clustering classifications of the various instabilities such as ion-cyclotron, mirror, firehose, magnetosonic ion drift, represented by letters A-D.

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## Evolution of the proton $V_{11}$ - $V_1$ velocity distributions

temperature anisotropies to more realistic full 3D hybrid model and find similar

> We plan to implement ML/AI methods for automated classification VDFs, and instabilities in PSP data.