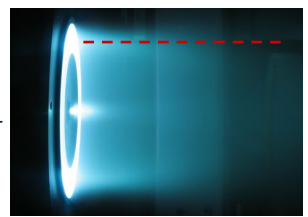


Problem: Current Hall thruster simulations are not predictive due to incomplete understanding of electron transport physics.

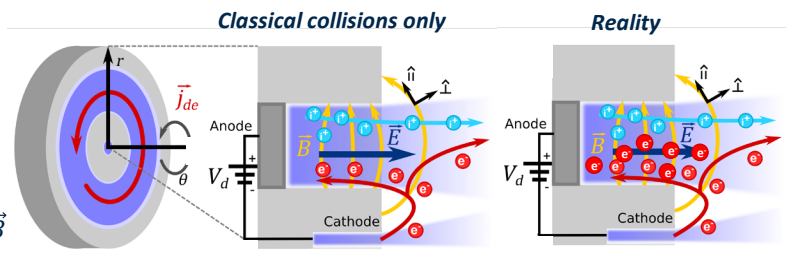
Hall thrusters
Annular $\vec{E} \times \vec{B}$ discharge used to accelerate ions for spacecraft propulsion



H9 Hall thruster, developed by Jet Propulsion Laboratory, Air Force Research Laboratory, and University of Michigan

Anomalous electron transport
Electrons diffuse across magnetic field lines much faster than classical theory predicts, so simulations cannot match experiment without hand-tuning. Model as extra "anomalous collision frequency" (ν_{AN}) in electron momentum equation

Ohm's law: $(\nu_e + \nu_{AN}) \frac{m_e}{q} \vec{j}_e = qn_e \vec{E} + \nabla P_e - \vec{j}_e \times \vec{B}$



Question: How can we develop and test models of anomalous transport while accounting for model uncertainty?

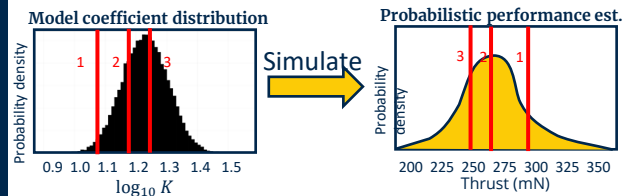
Approach: Use validated simulations as surrogate data to calibrate and test models of anomalous transport

Model (example): $\nu_{AN} = \frac{1}{K} \frac{|\nabla \cdot (\mathbf{u}_i n_e T_e)|}{m_e c_s n_e v_{de}}$

Coefficients: $\{K\}$

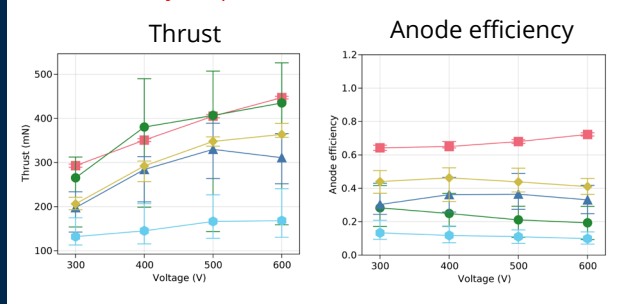
Surrogate data (hand-tuned profiles):

Obtain probability distribution of model coefficients, sample and run simulations of H9 Hall thruster (not in training dataset)



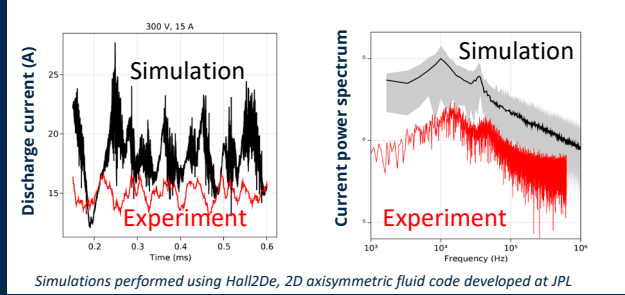
Model	Expression for ν_{AN}	Coefficients	Proposed mechanism
Two-zone Bohm	$\begin{cases} \alpha_0 \omega_{ce} & z < L \\ \alpha_1 \omega_{ce} & z \geq L \end{cases}$	α_0, α_1	Bohm diffusion
Turbulence II	$\frac{1}{K} \frac{ \nabla \cdot (\mathbf{u}_i n_e T_e) }{m_e c_s n_e v_{de}}$	K	Azimuthal instability saturated by ion-wave trapping and wave convection
Turbulence III	$\frac{1}{K} \omega_{ce} \left(\frac{1}{1 + (C \nabla v_{de})^2} \right)^4$	K, C, α	Turbulent transport suppressed by shear stress
Data-driven	$\omega_{ce} \left(c_0 + \frac{c_1 \mathbf{u}_i }{c_2 c_s + v_{de}} \right)^3$	c_0, c_1, c_2	None

Application: Evaluate multiple algebraic models to determine if any are predictive and extensible

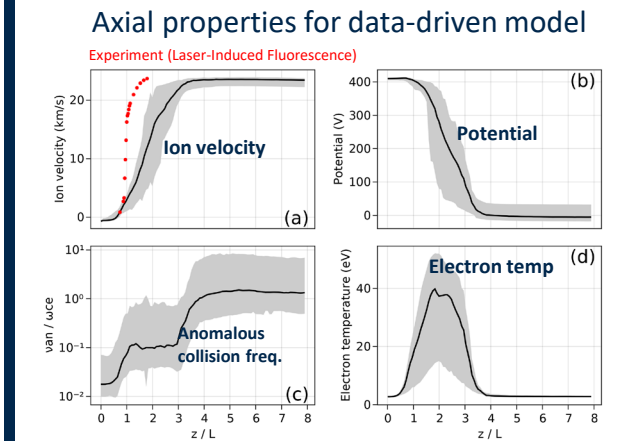


Data-driven model performs almost as well as best first-principles model

Breathing-like oscillations produced by all models (~ 10 kHz)



Discussion: Examine reasons for low performance



Relaxed acceleration profile due to large anomalous transport near exit-plane yields low beam, divergence, mass utilization efficiencies. Algebraic models may not have sufficient feedback to steepen profiles.

Conclusion:

- Algebraic models tend to under-predict performance when calibrated on steady-state data
- Breathing-like oscillations consistently reproduced
- Bayesian techniques can quantify model uncertainty

Nomenclature: ν_{AN} : Anomalous collision freq. m_e : Electron mass P_e : Electron pressure \mathbf{u}_i : Ion velocity
 \vec{B} : Magnetic field ν_e : Classical electron collision freq. n_e : Electron number density \vec{j}_e : Electron current density c_s : Ion acoustic speed
 \vec{E} : Electric field ω_{ce} : Electron cyclotron freq. T_e : Electron temp. v_{de} : Electron drift speed

References: 1T. Lafleur et al. *Physics of Plasmas* 23, 053503 (2016)
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