



Non-classical electron transport in Hall effect thrusters

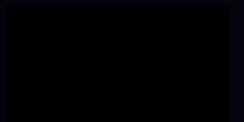
Benjamin Jorns

Assistant Professor
Department of Aerospace Engineering
University of Michigan

Co-Director
Plasmadynamics and Electric Propulsion Laboratory

Launch cost in
\$1000/kg

Why electric (plasma) propulsion?



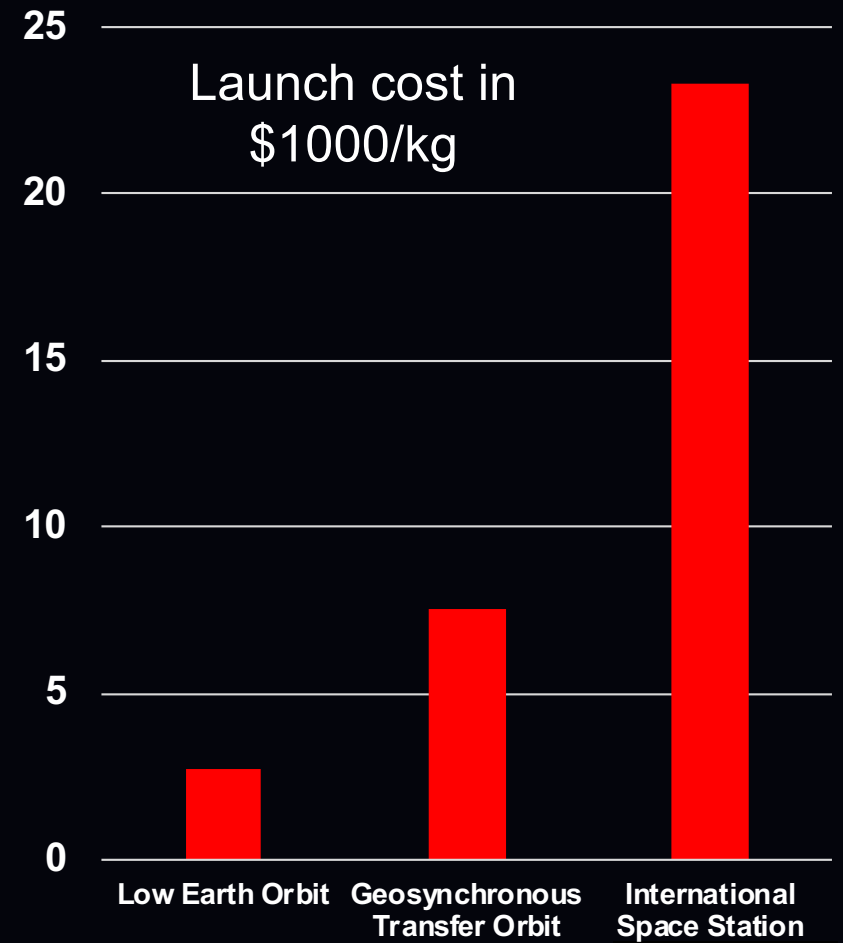
Mass is at a premium for space travel

Launch vehicles have physical limits on volume and mass



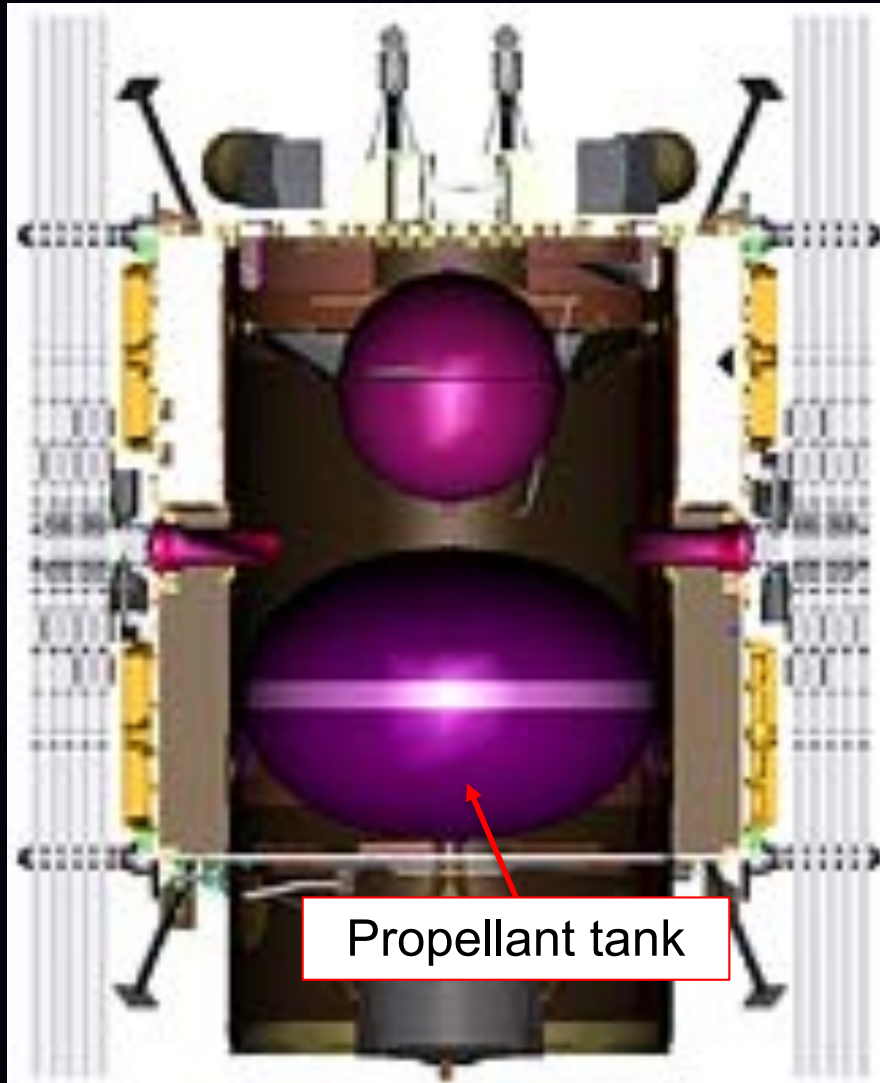
Credit: SpaceX

Cost scales with spacecraft mass



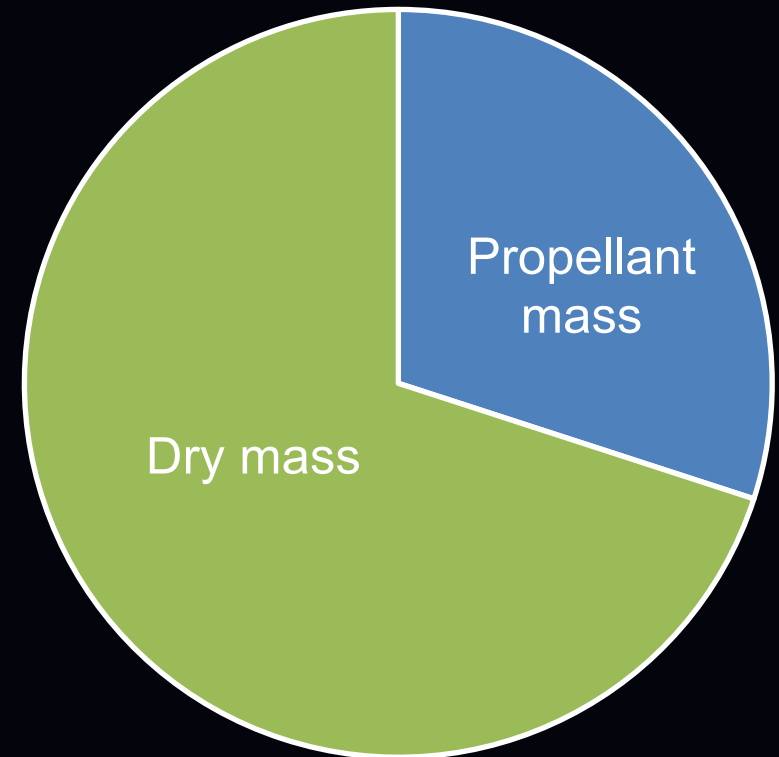
Propellant mass is a dominant fraction of overall spacecraft mass

Spacecraft cross-section



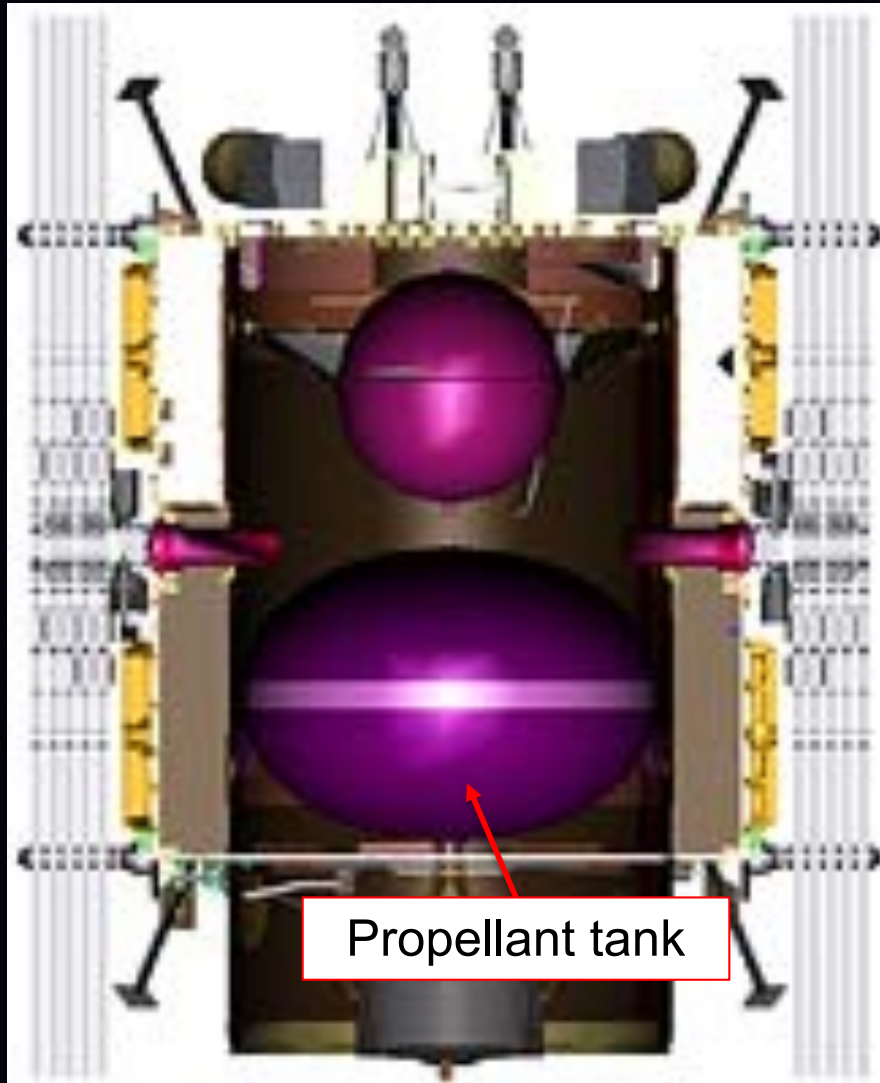
Credit: JPL

Mass budget



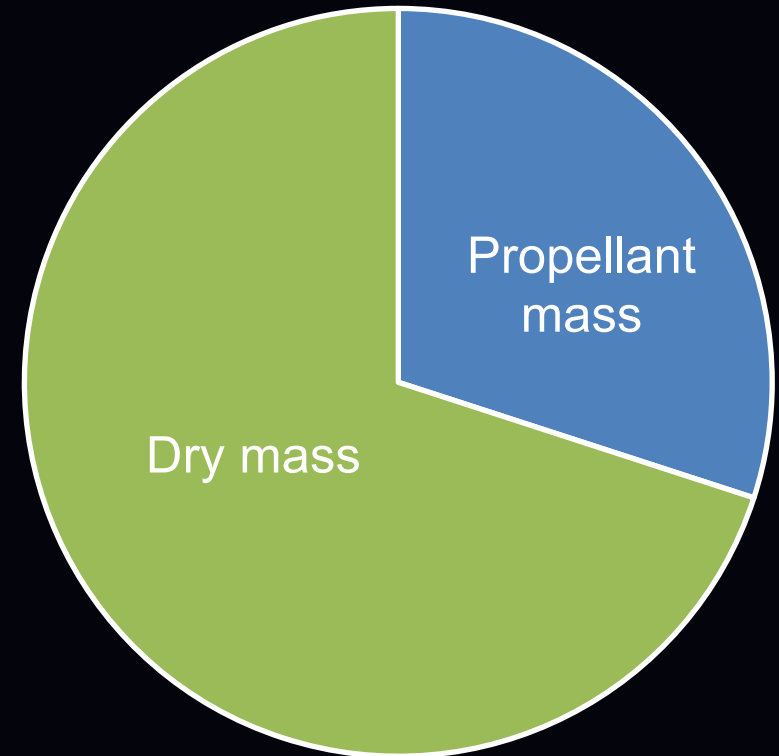
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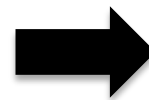


There is a driving need to maximize propellant efficiency of spacecraft



Analogy from the ground

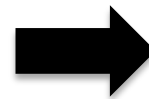
Gas guzzling car



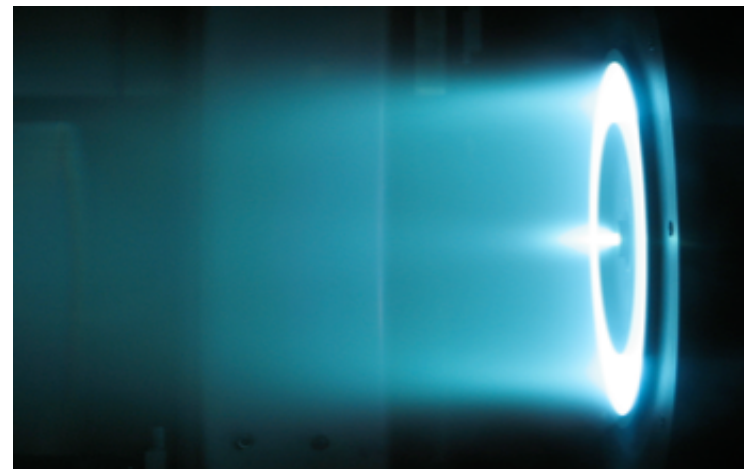
Electric car with great fuel economy



Fuel guzzling chemical rockets



Electric rockets with great propellant efficiency





Analogy from the ground

Gas guzzling car



Electric car with great fuel economy



The low “gas mileage” of “electric propulsion” makes it an enabling technology for cheaper space exploration

Fuel guzzling chemical rockets



Electric rockets with great propellant efficiency



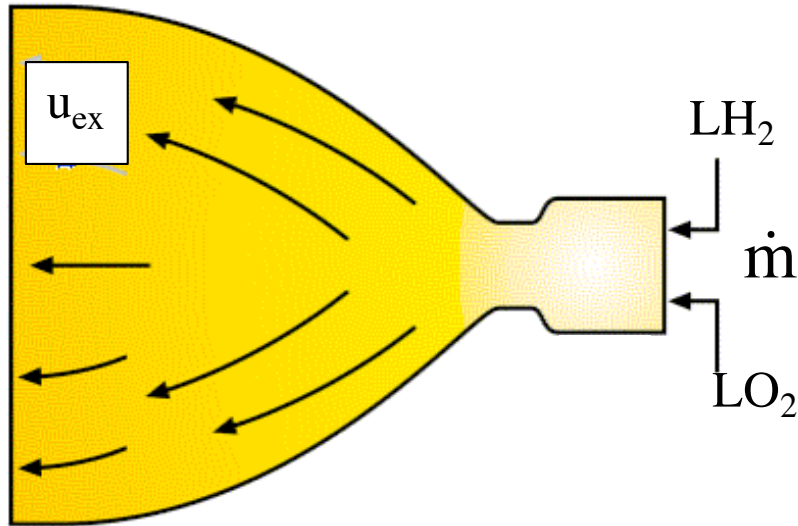


How does electric (plasma) propulsion achieve higher propellant efficiency?



Electric propulsion vs. chemical propulsion

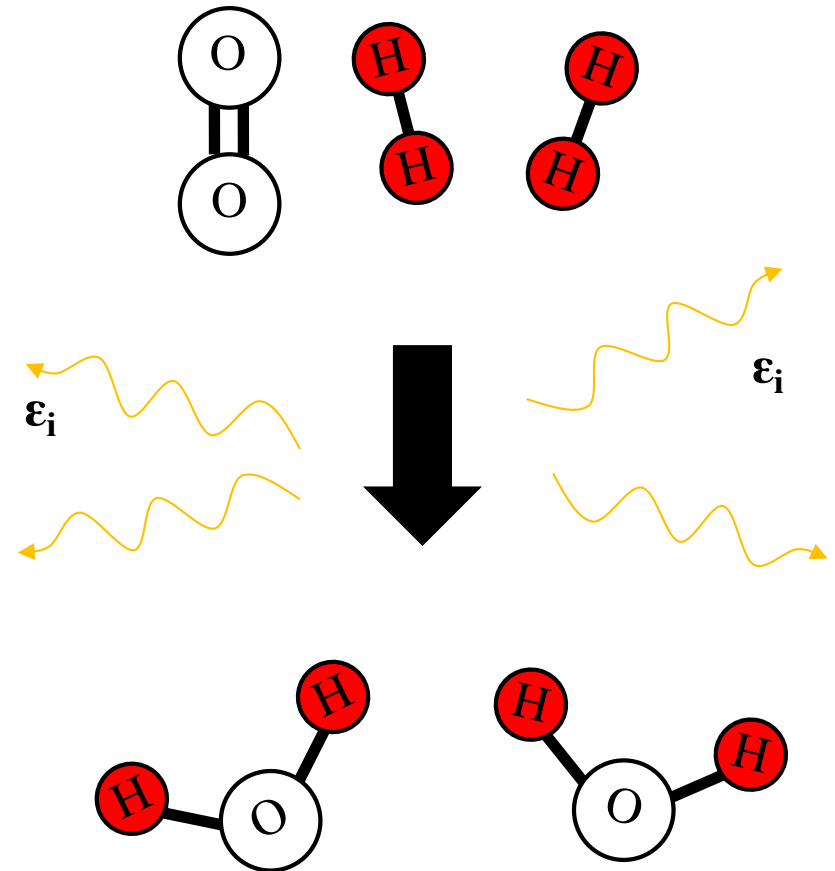
Chemical rocket



Specific internal energy ϵ_i in molecular bonds converted to exhaust energy

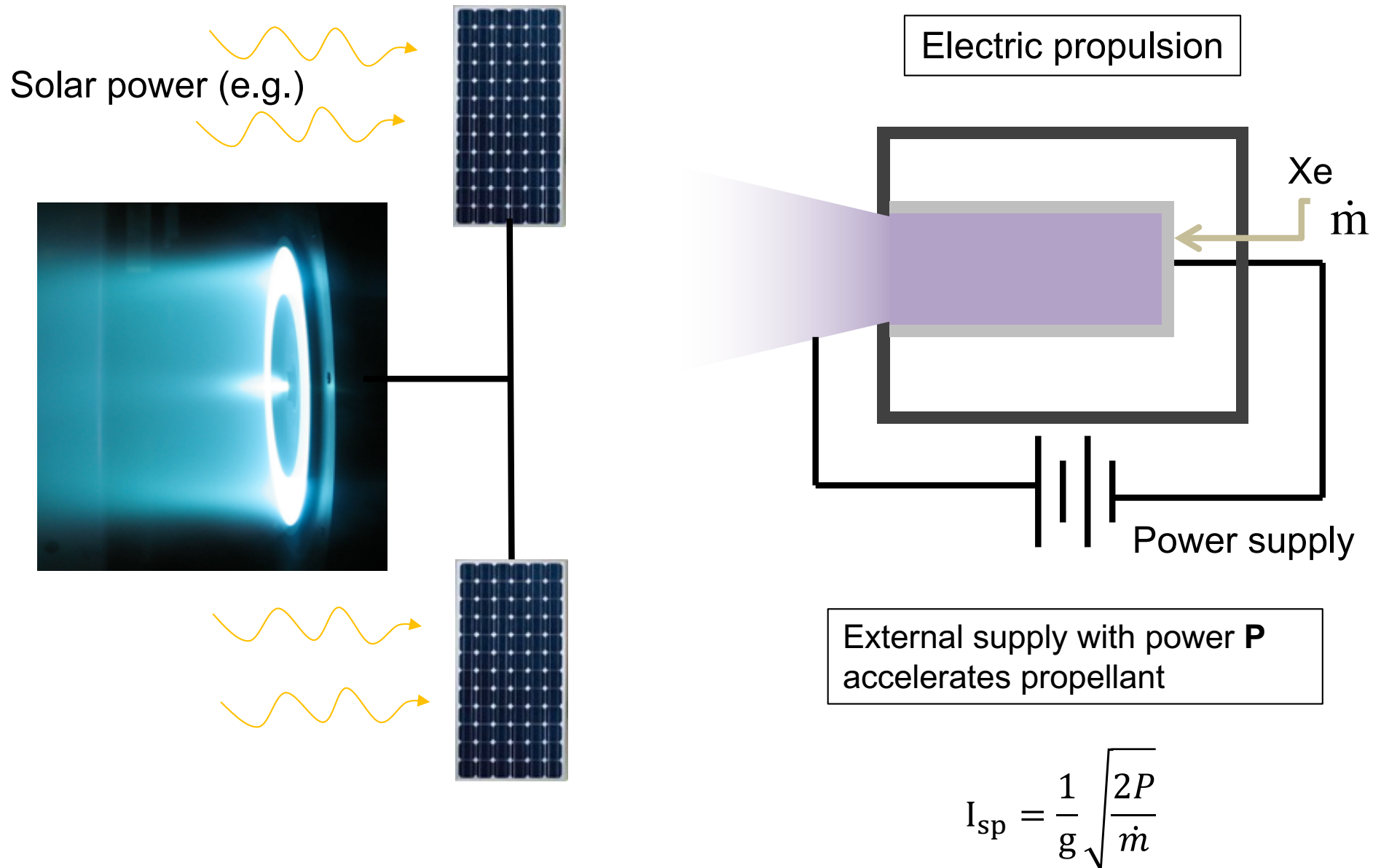
$$I_{sp} = \frac{1}{g} \sqrt{2\epsilon_i}$$

Release of internal energy in propellant





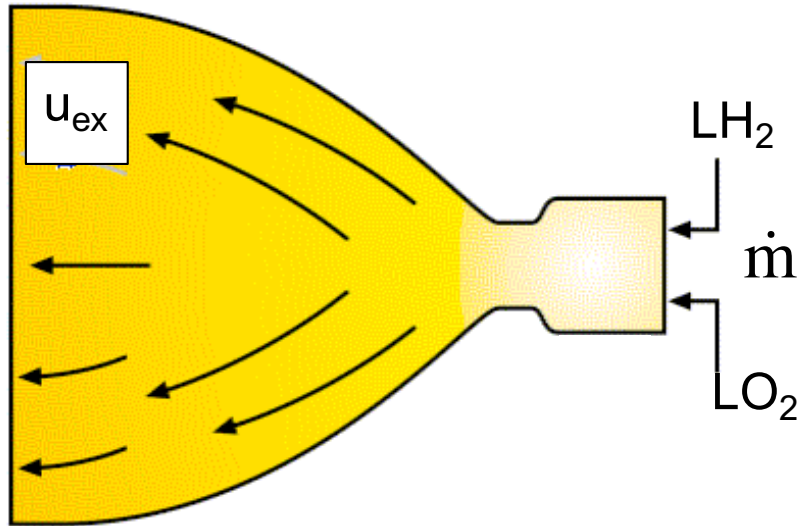
Electric propulsion vs. chemical propulsion





Electric propulsion vs. chemical propulsion

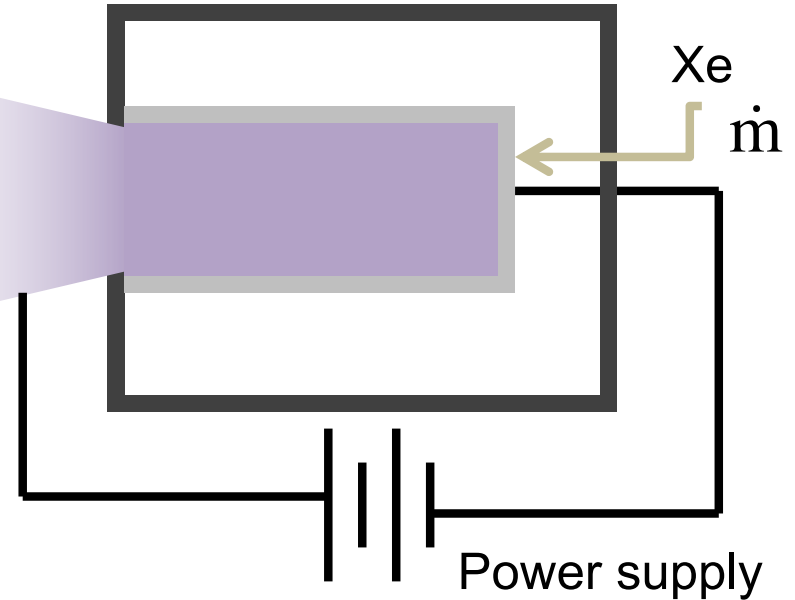
Chemical rocket



Specific internal energy ϵ_i in molecular bonds converted to exhaust energy

$$I_{sp} = \frac{1}{g} \sqrt{2\epsilon_i}$$

Electric propulsion



External supply with power P accelerates propellant

$$I_{sp} = \frac{1}{g} \sqrt{\frac{2P}{\dot{m}}}$$

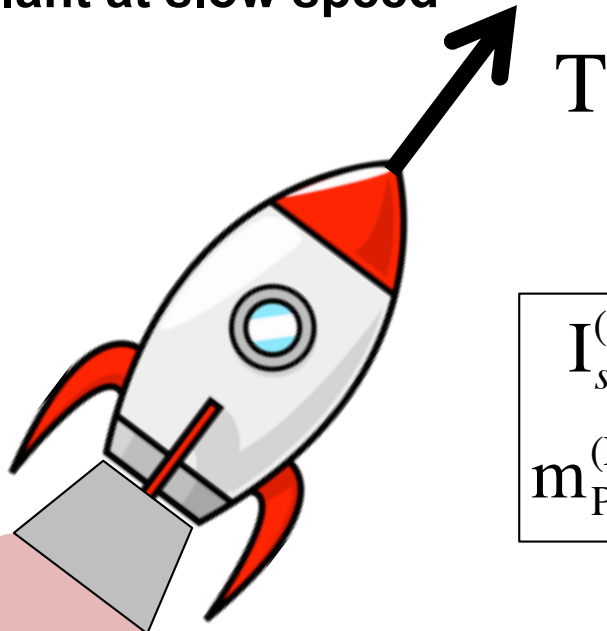
Electric thrusters accelerate propellant to high velocity



Electric propulsion vs. chemical propulsion

Chemical rocket

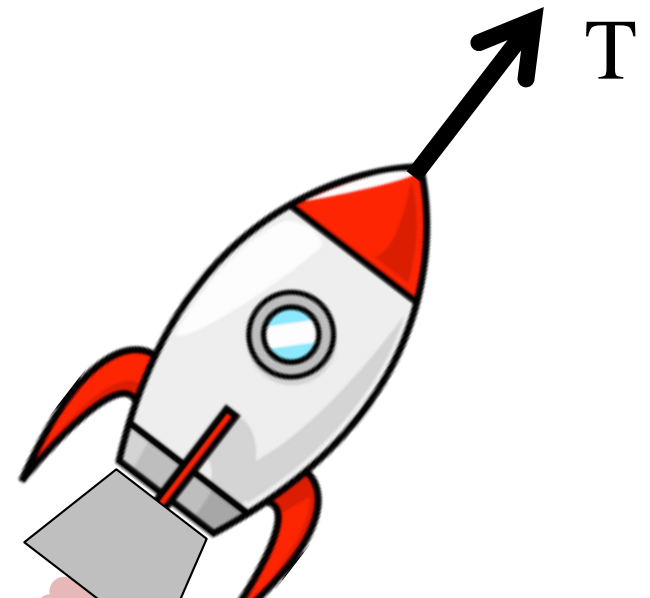
Expels large quantity of propellant at slow speed



$$I_{sp}^{(EP)} \gg I_{sp}^{(c)}$$
$$m_p^{(EP)} \ll m_p^{(c)}$$

Electric propulsion

Expels small quantity of propellant at very fast speed



Electric thrusters require less propellant to reach a given destination

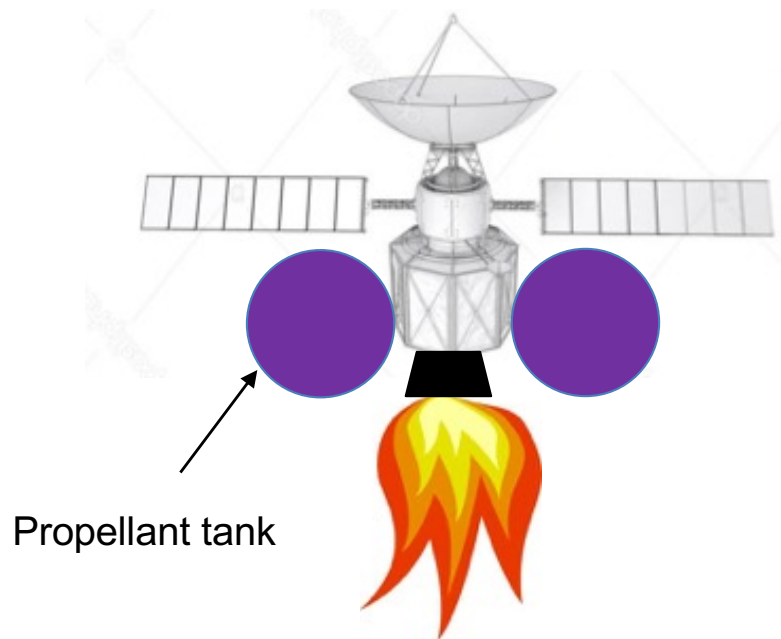
$I_{sp}^{(c)}$

$I_{sp}^{(EP)}$

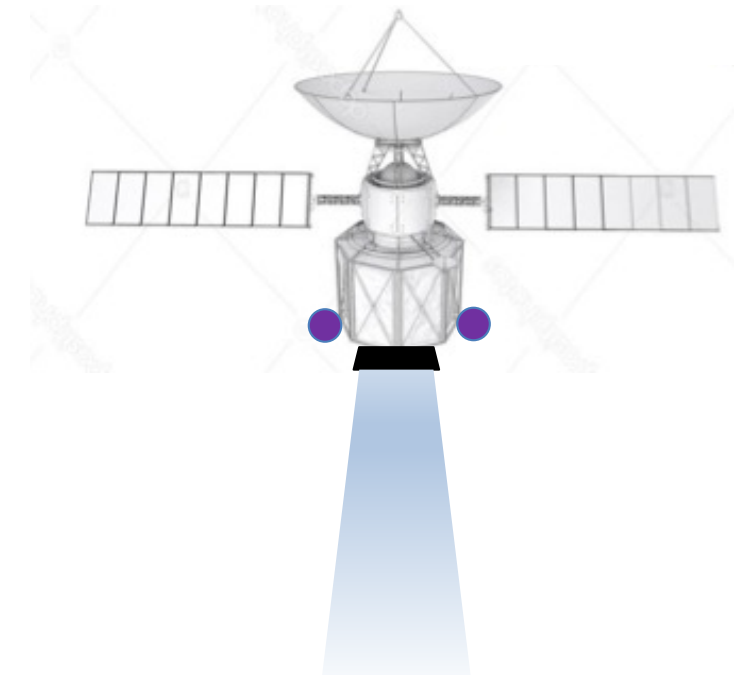


Electric propulsion systems have better “gas mileage” in space

Traditional chemical system



Electric propulsion system



Spacecraft mass savings with EP stems from savings in propellant tank requirements



Mass savings from EP enables new and cheaper missions

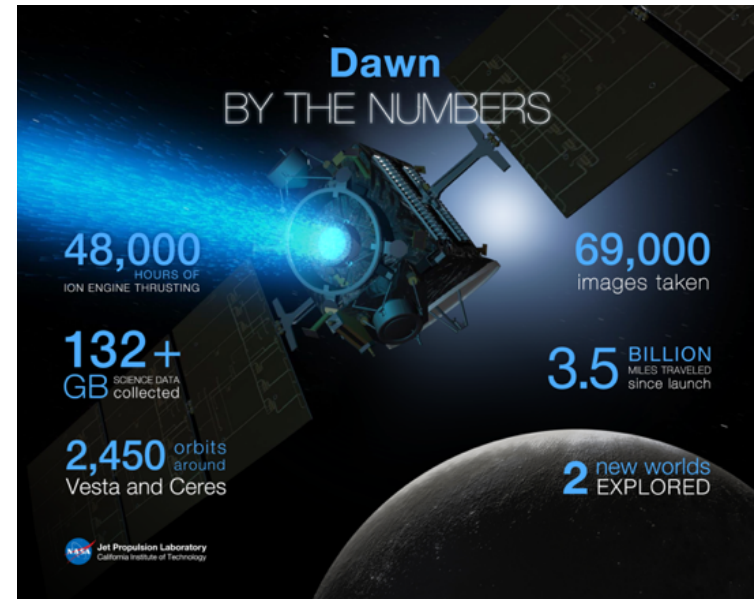
Stacked payloads to GEO



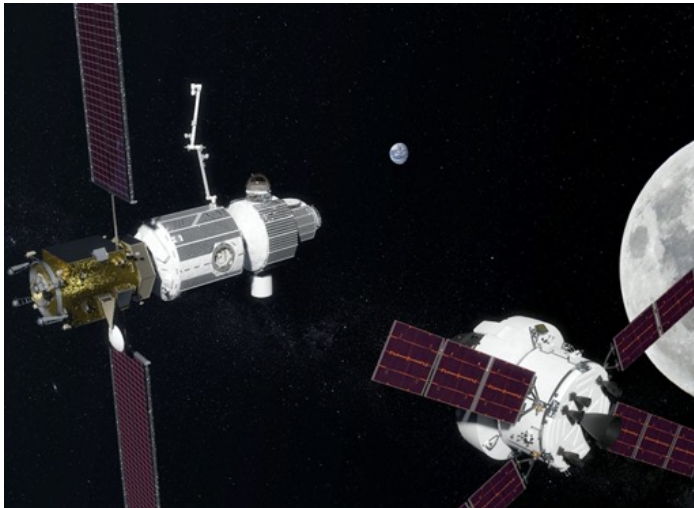
Credit: Boeing Company



Deep space exploration



Crewed Exploration (Deep Space Gateway)



Megaconstellations (SpaceX)

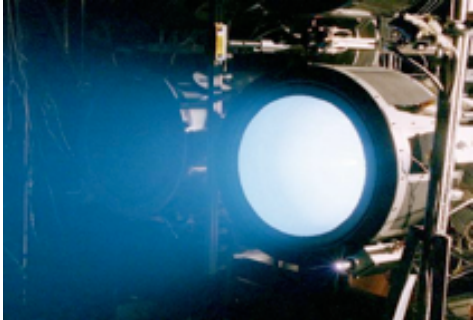
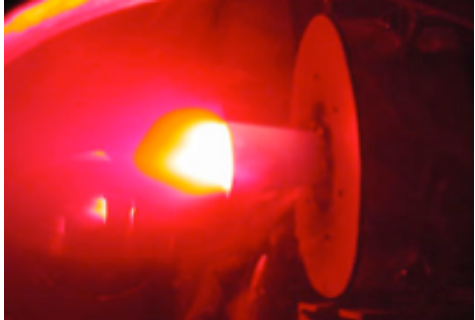
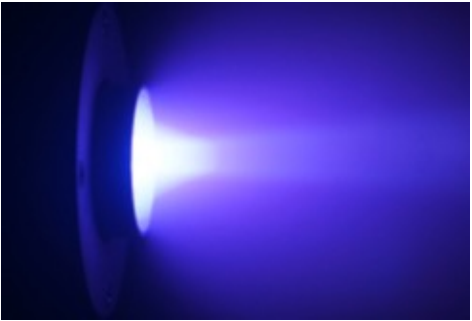
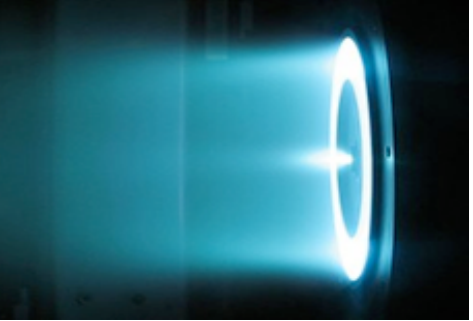
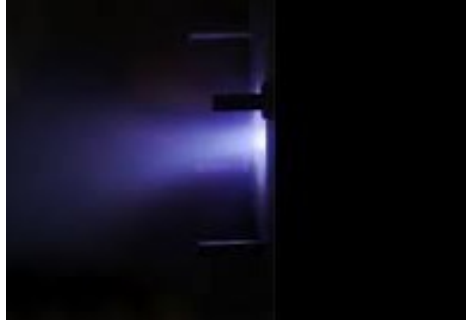
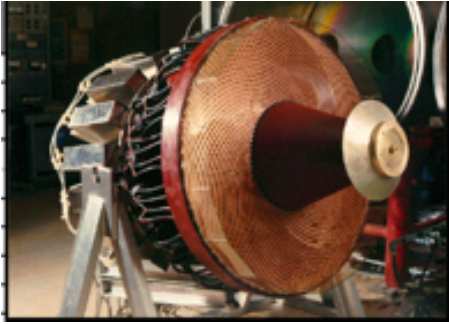




What methods are employed to convert external power into thrust for electric propulsion systems?

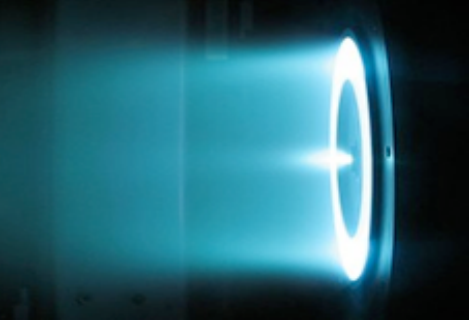
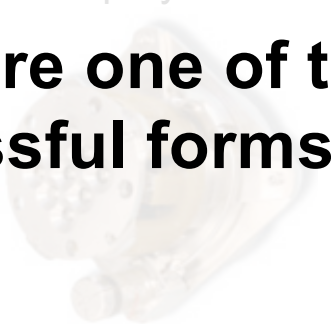
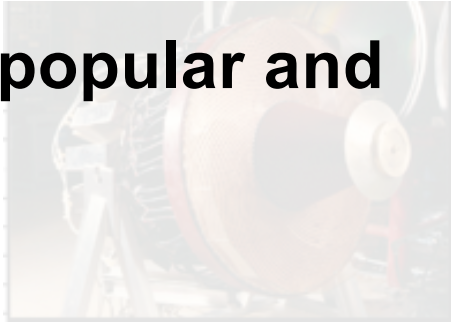


Pantheon of Electric Propulsion Systems

Thermal expansion of plasma heated gas	Electrostatic acceleration of heavier species in a LTP	Electromagnetic acceleration through Lorentz force
Arcjets/resistojets 	Gridded ion thrusters 	Magnetoplasmadynamic thrusters 
Magnetic nozzles 	Hall effect thrusters 	Pulsed ablative thrusters 
	Electrospray thrusters 	Pulsed inductive thrusters 



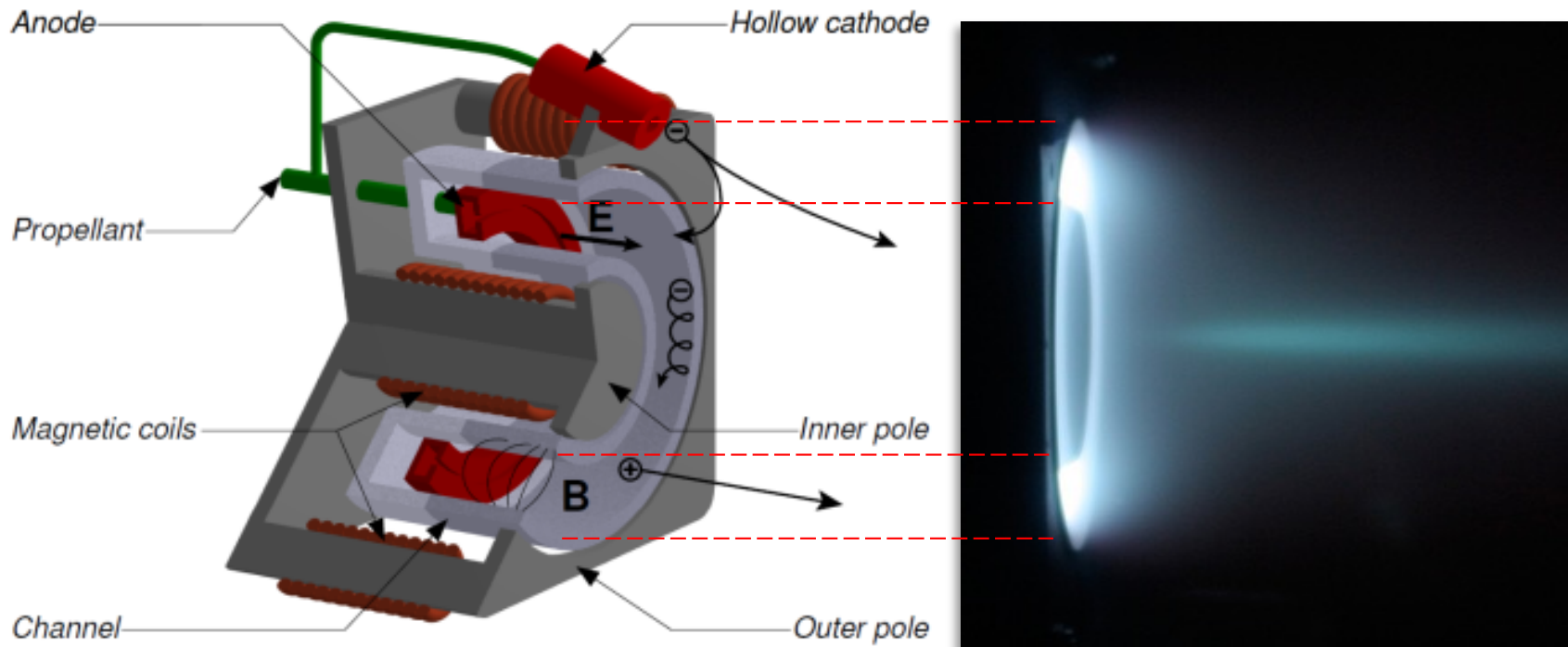
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	Electrospray thrusters 	Pulsed inductive thrusters 

Hall effect thrusters are one of the most popular and successful forms of EP

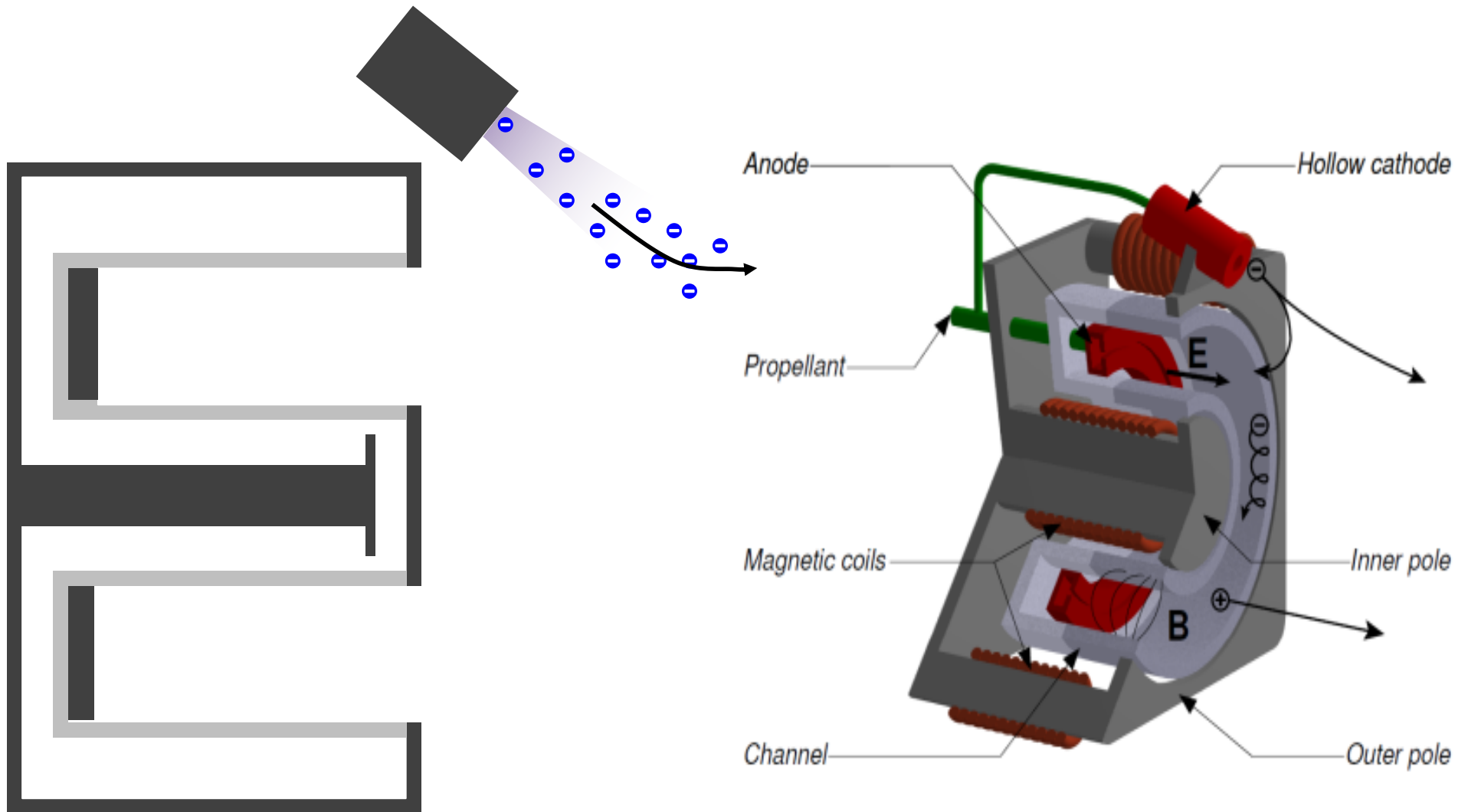


Hall thruster principle of operation





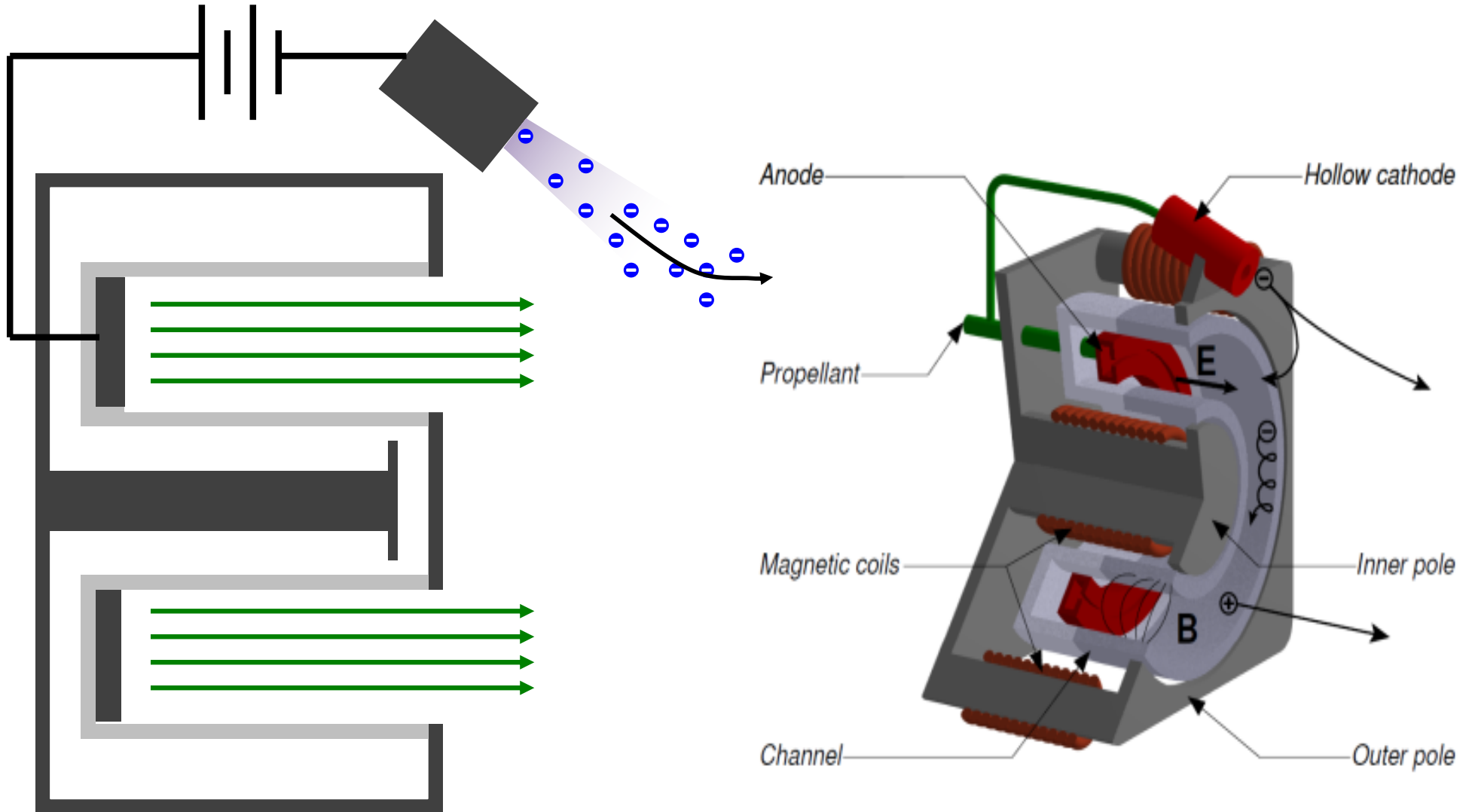
Hall thruster principle of operation



Hollow cathode heated until thermionically emitting electrons



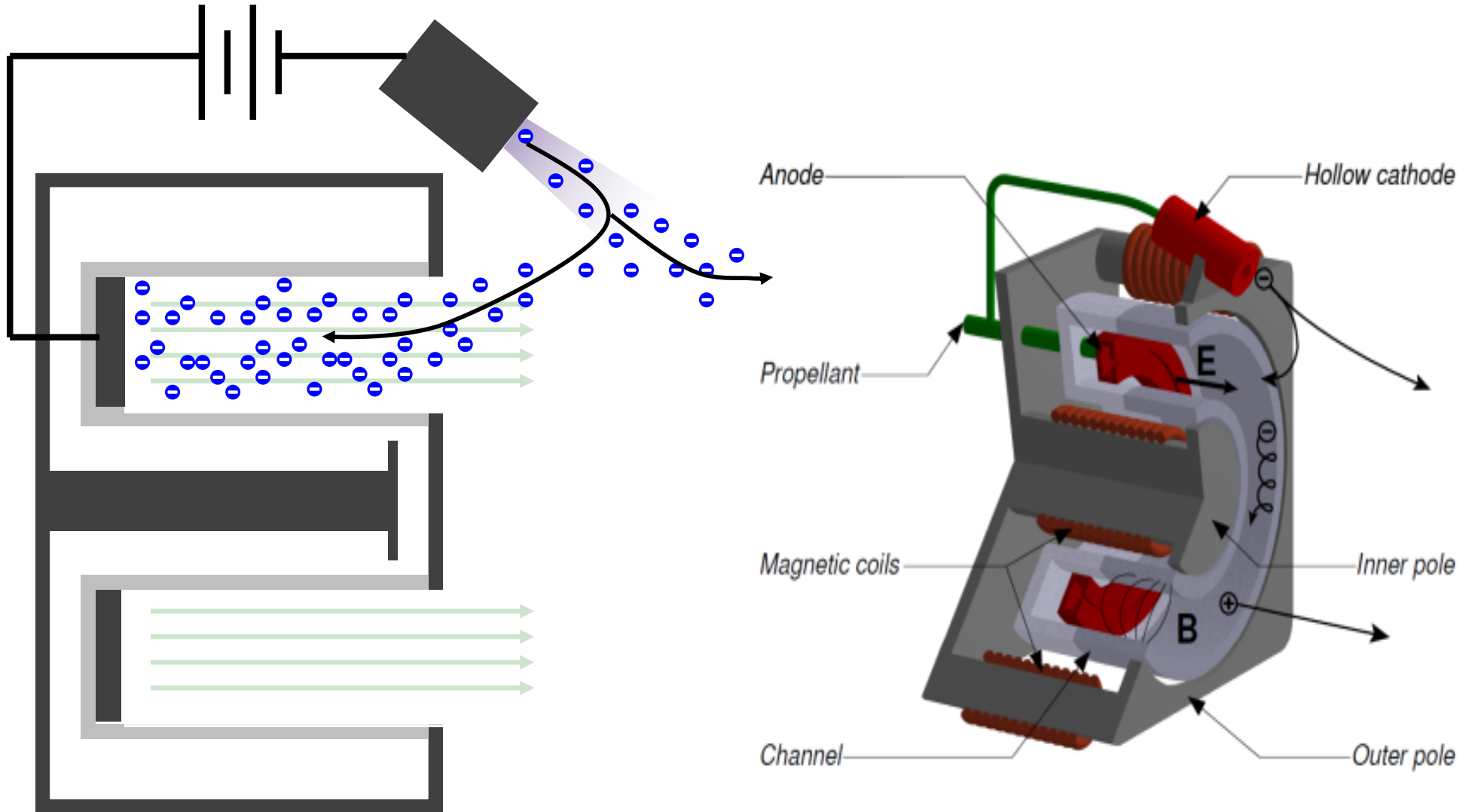
Hall thruster principle of operation



Electric field applied between anode and cathode



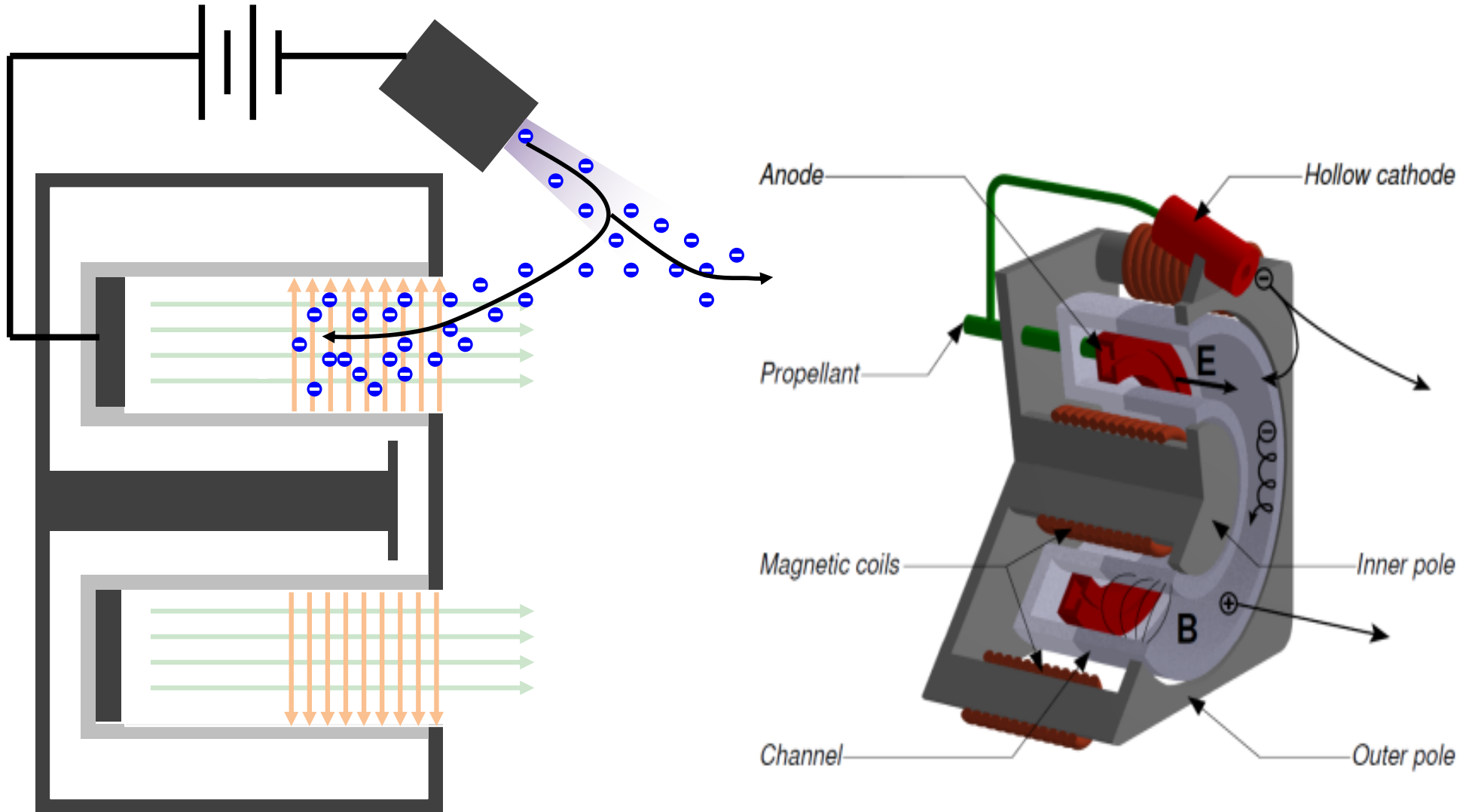
Hall thruster principle of operation



Electrons follow electric field and current flows between cathode and anode



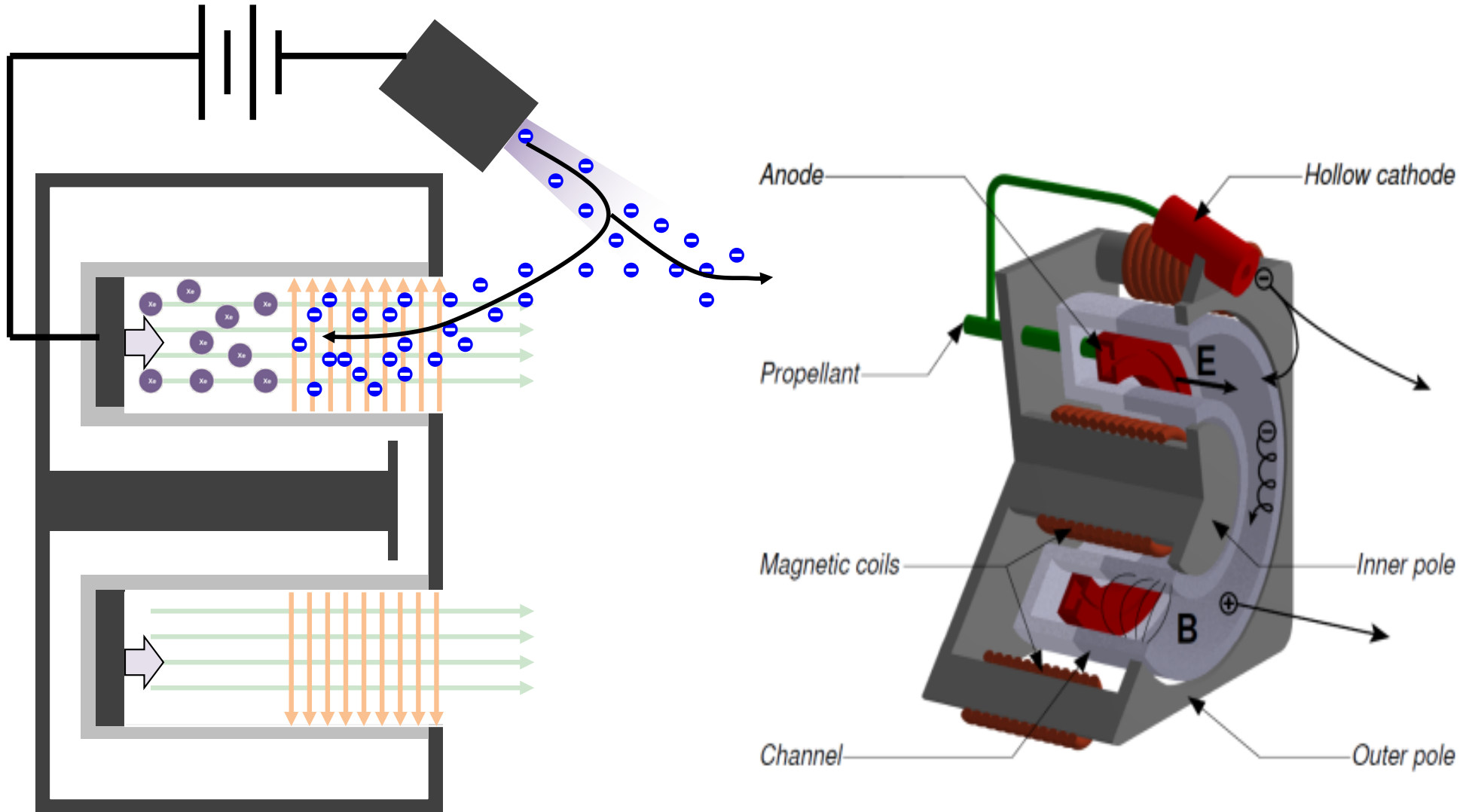
Hall thruster principle of operation



Magnetic field is applied in the radial direction. Electrons are trapped in $\mathbf{E} \times \mathbf{B}$ azimuthal drift: *Hall effect*



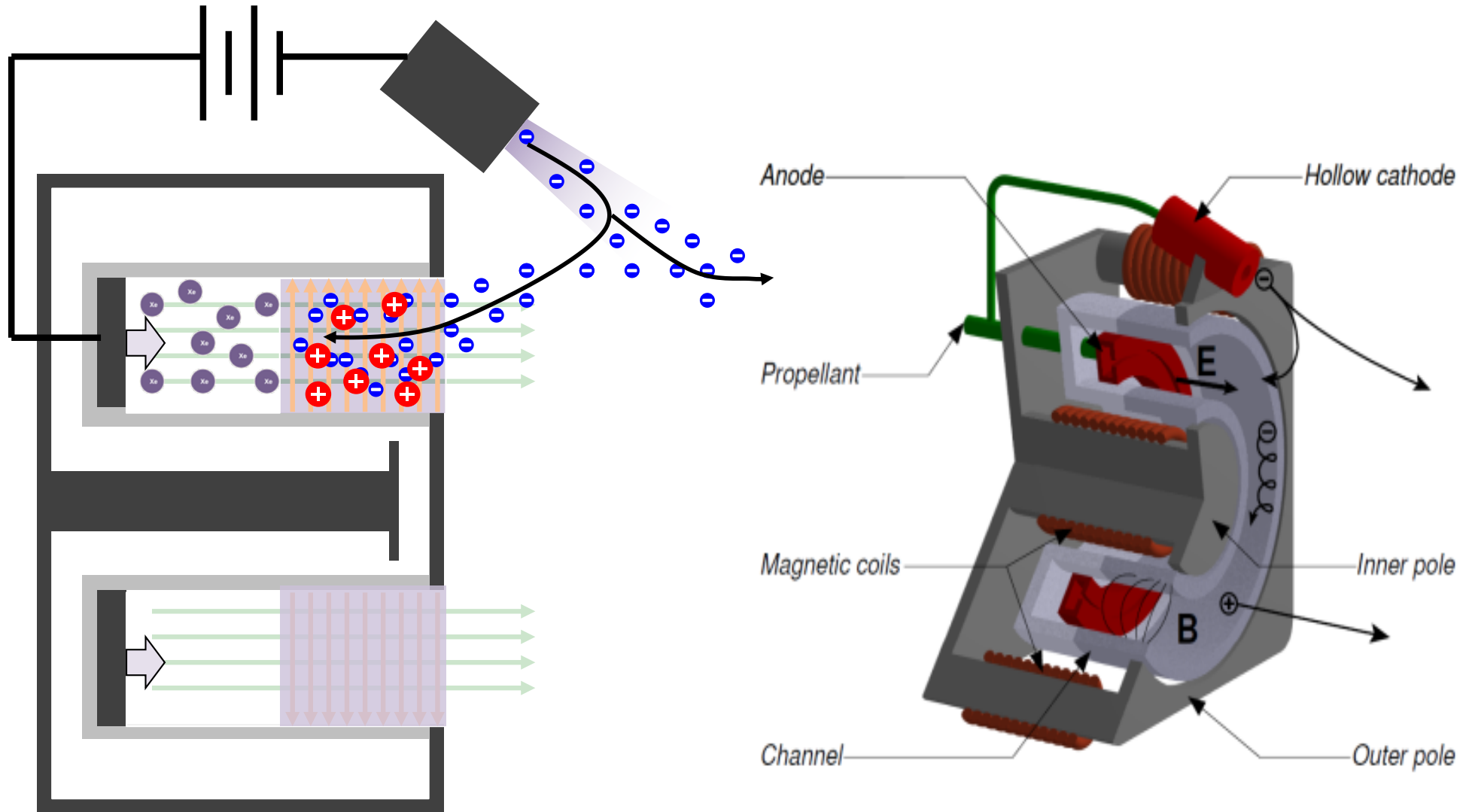
Hall thruster principle of operation



Neutral gas (xenon) flows through thruster anode.



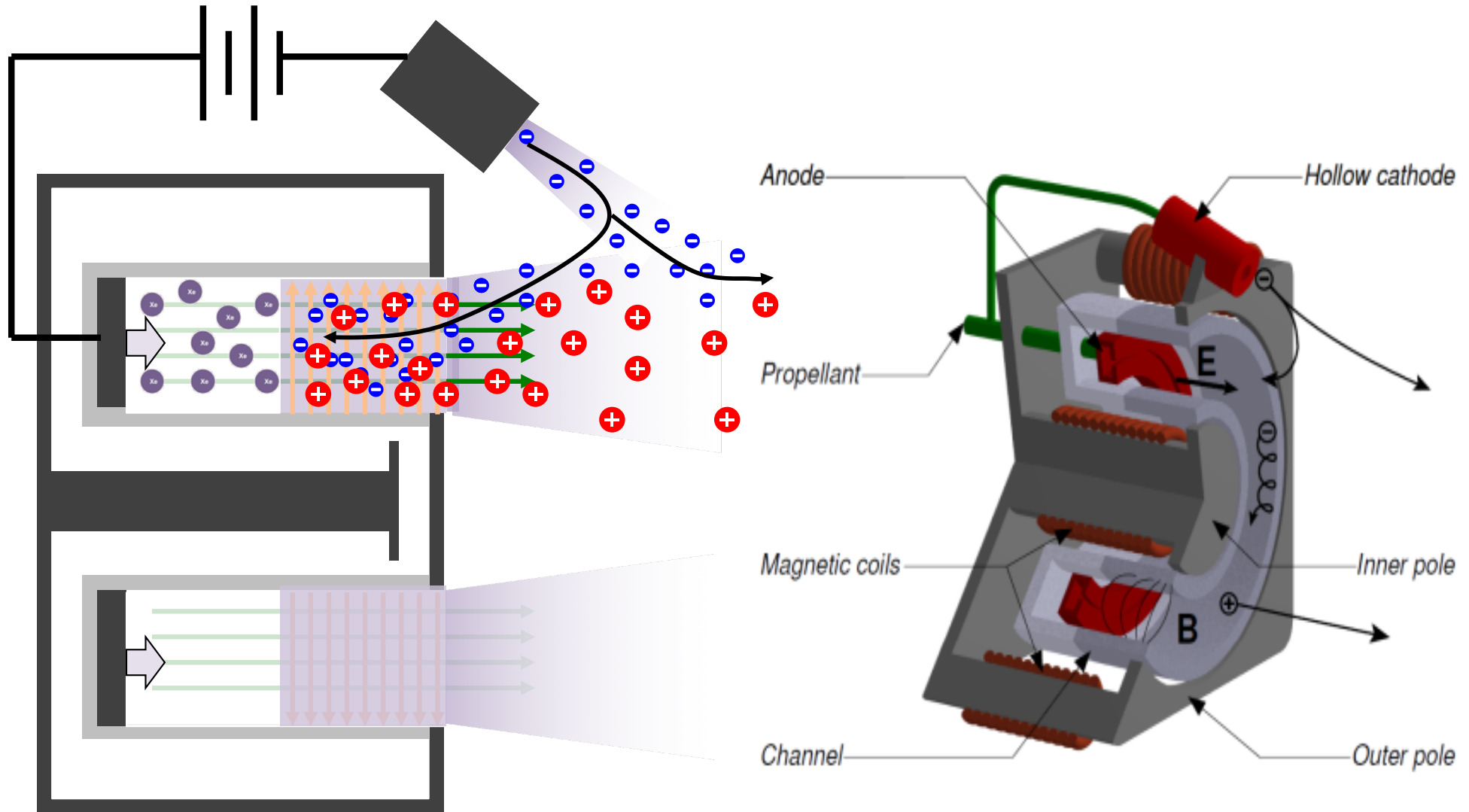
Hall thruster principle of operation



Electron azimuthal drift “buzz saw” ionizes neutral xenon. Plasma is created.



Hall thruster principle of operation

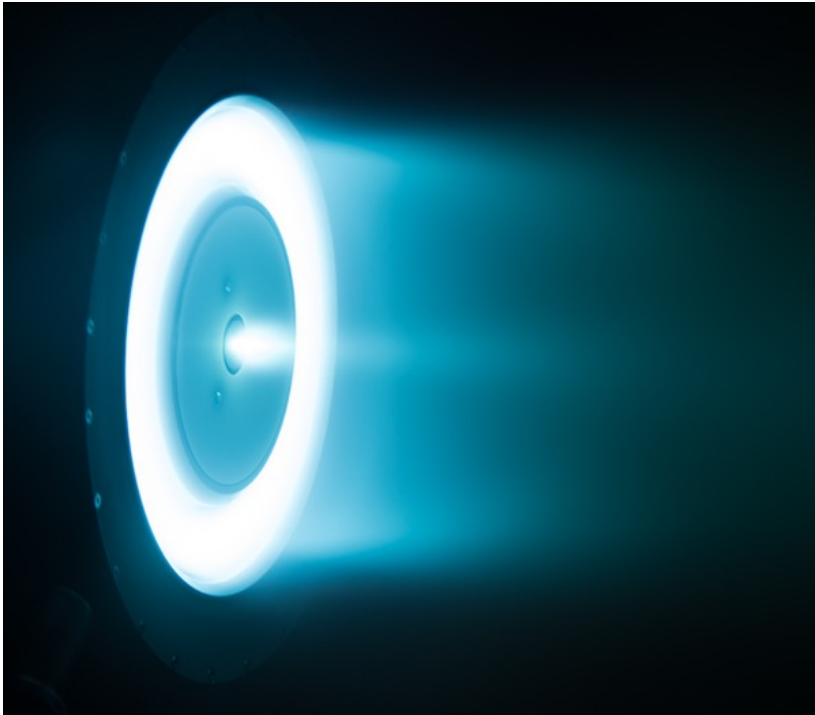


Ions are unmagnetized and therefore follow electric field lines directly.
Accelerated ions are neutralized by electrons in plume



Hall Effect Thruster

6-kW thruster at JPL



- **1970s:** > 240 flown since first launch by Soviet Union
- **2004:** First Western use of Hall thrusters (Space Systems Loral)
- **2011:** American manufactured Hall thrusters flown (Aerojet BPT-4000)
- **Present:** 12.5 kW thruster baselined for NASA return to moon

- Moderate thrust density (smaller mass for thrust)
- High specific impulse (1000-3000 s)
- High electrical efficiency (> 60%)
- **100s currently flown commercially and DoD spacecraft**



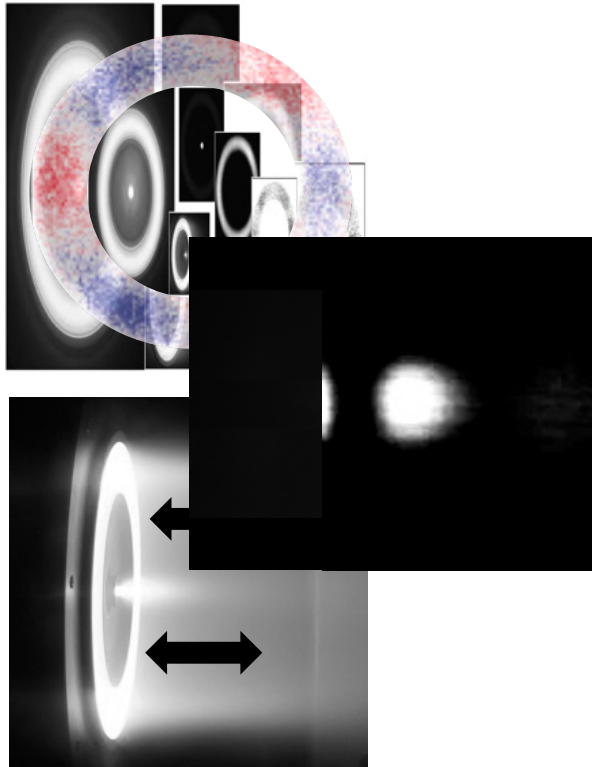
Challenges with Hall thrusters

Facility effects



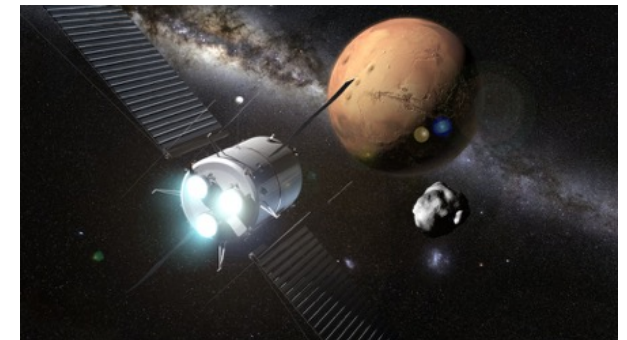
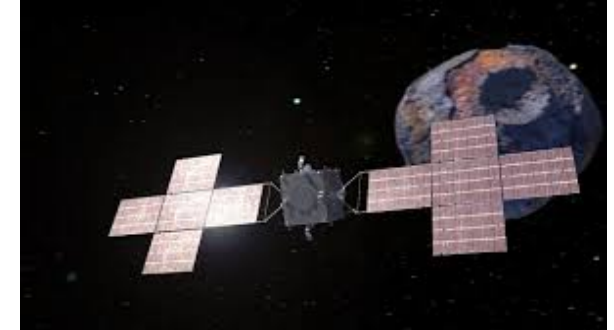
- Ground based test facilities are not representative of on orbit environment.
- This poses a challenge for qualifying new thruster designs for operational use

Stability



- Hall thrusters are dynamical systems that can transition into instability. Transition not well understood
- Transition in stability can adversely impact performance/lifetime

Lifetime validation



- Hall thrusters are low thrust and require years of continuous operation
- Demonstrating lifetime through testing for next generation missions is impractical

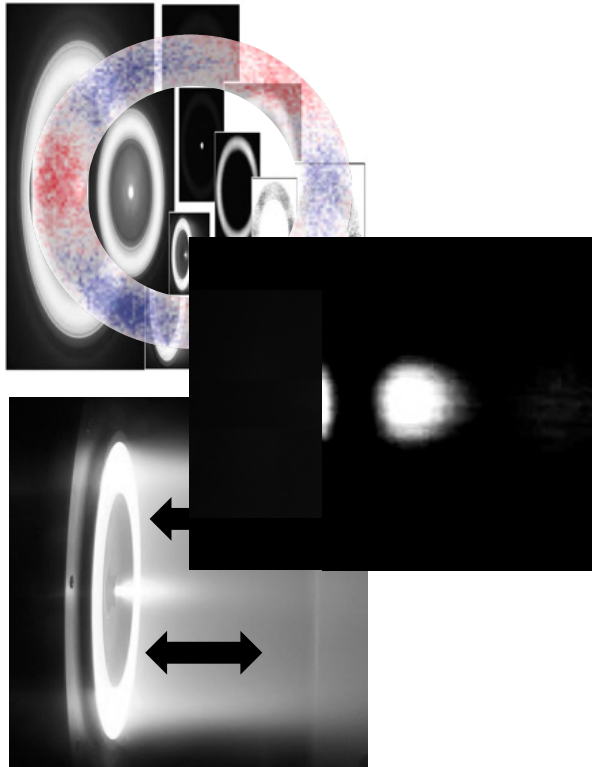


Challenges with Hall thrusters

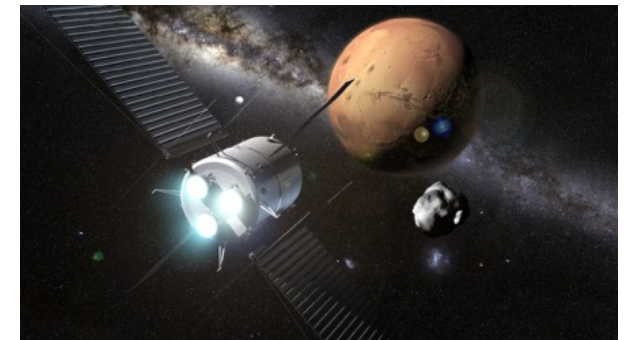
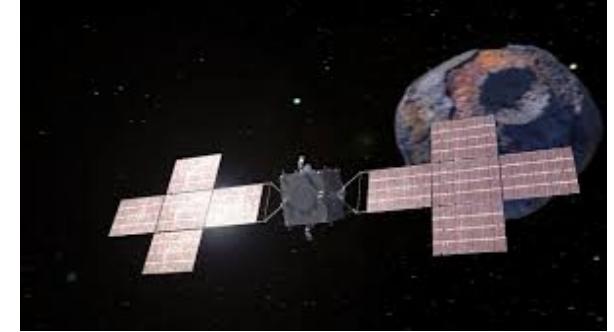
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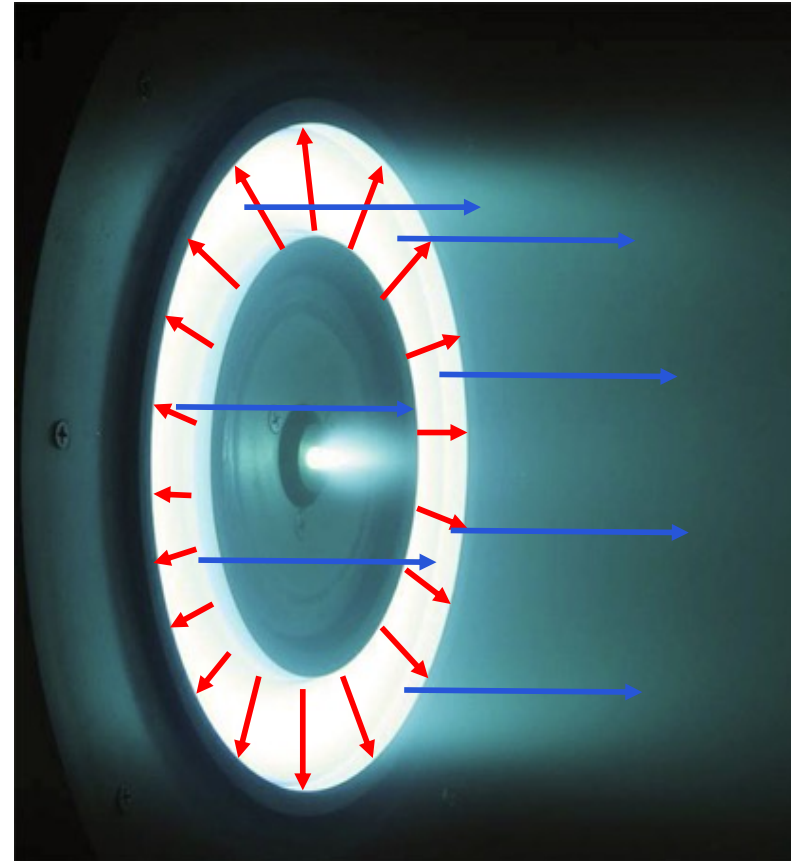
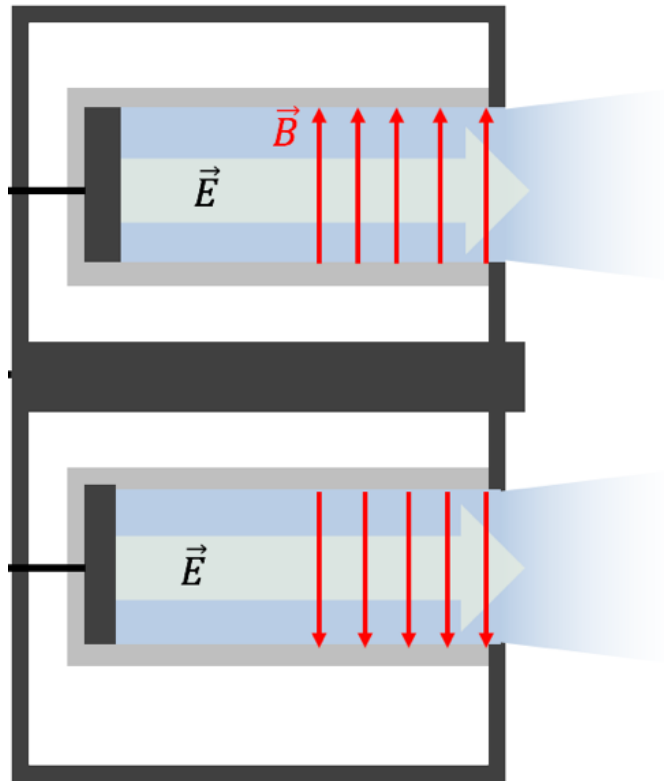
- Many of these challenges *could* be addressed with predictive modeling, but there are currently no fully predictive models for Hall thruster operation
- Lack of predictive models is largely related to problem of non-classical electron transport



The problem of non-classical (anomalous) electron transport in Hall thruster modeling

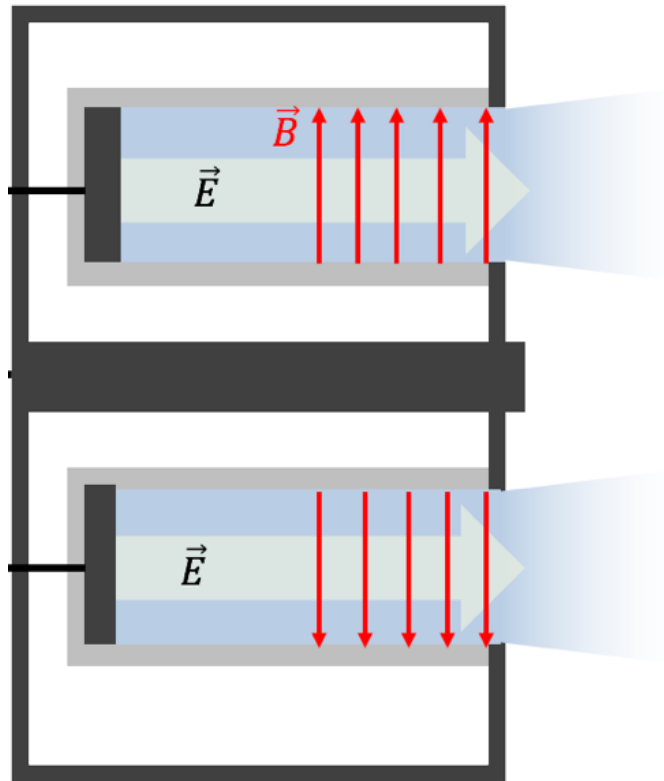


Problem of non-classical (anomalous) electron transport in Hall thruster modeling





Problem of non-classical (anomalous) electron transport in Hall thruster modeling



Closed set of classical equations that can be evaluated with standard techniques

Ion continuity

$$\frac{\partial n_i}{\partial t} + \nabla \cdot (n_i \mathbf{u}_i) = 0$$

Ion momentum

$$\frac{\partial (m_i n_i \mathbf{u}_i)}{\partial t} + \nabla \cdot (m_i n_i \mathbf{u}_i \mathbf{u}_i) = q n_i \mathbf{E} - \nu_i m_i (\mathbf{u}_i - \mathbf{u}_e)$$

Ohm's Law

$$\nu_e m_e n_e \mathbf{u}_e = -q n_e \mathbf{E} - \nabla P_e - q n_e \mathbf{u}_e \times \mathbf{B}$$

Electron Energy

$$\frac{3}{2} n_e \frac{\partial T_e}{\partial t} = -q n_e \mathbf{E} \cdot \mathbf{u}_e - \nabla \cdot \left(\frac{5}{2} n_e T_e \mathbf{u}_e + \mathbf{Q}_e \right) + \frac{3}{2} T_e \nabla \cdot (n_e \mathbf{u}_e)$$

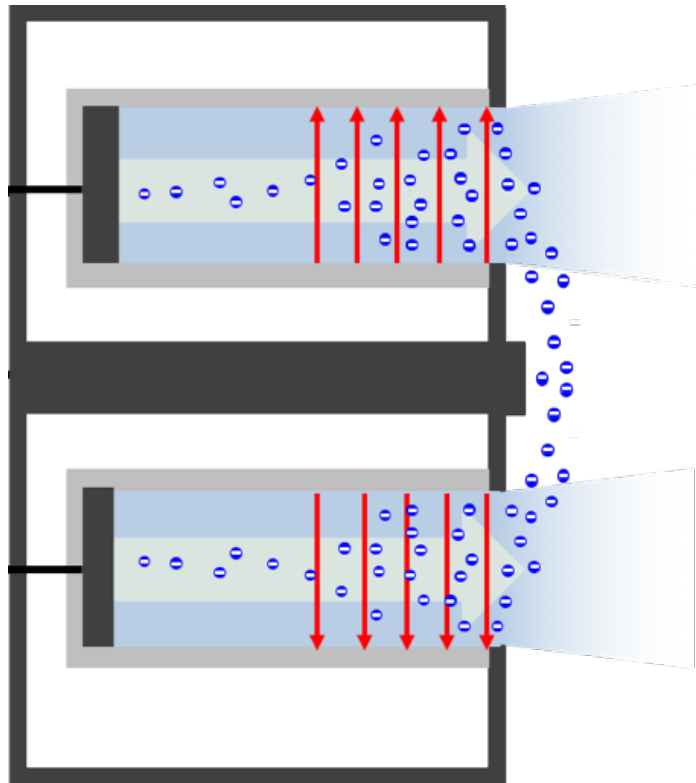
Current conservation

$$0 = \nabla \cdot (q n_e [\mathbf{u}_e - \mathbf{u}_i])$$



Problem of non-classical electron transport in Hall thruster modeling

$$I_e / I_d \sim 0.1\%$$



Electron cross-field current from evaluating classical equations

Ion continuity

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Ion momentum

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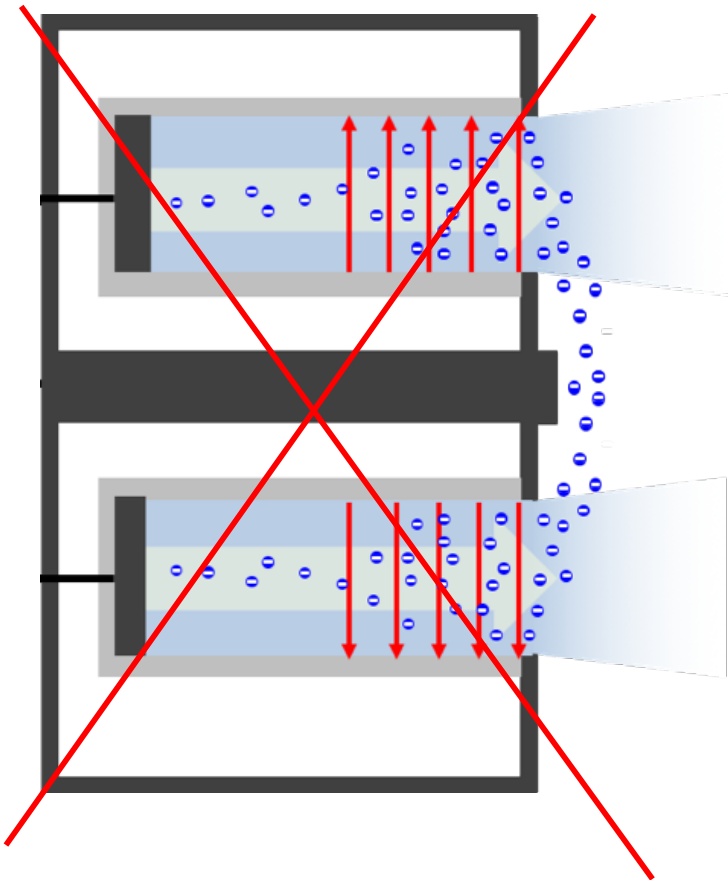
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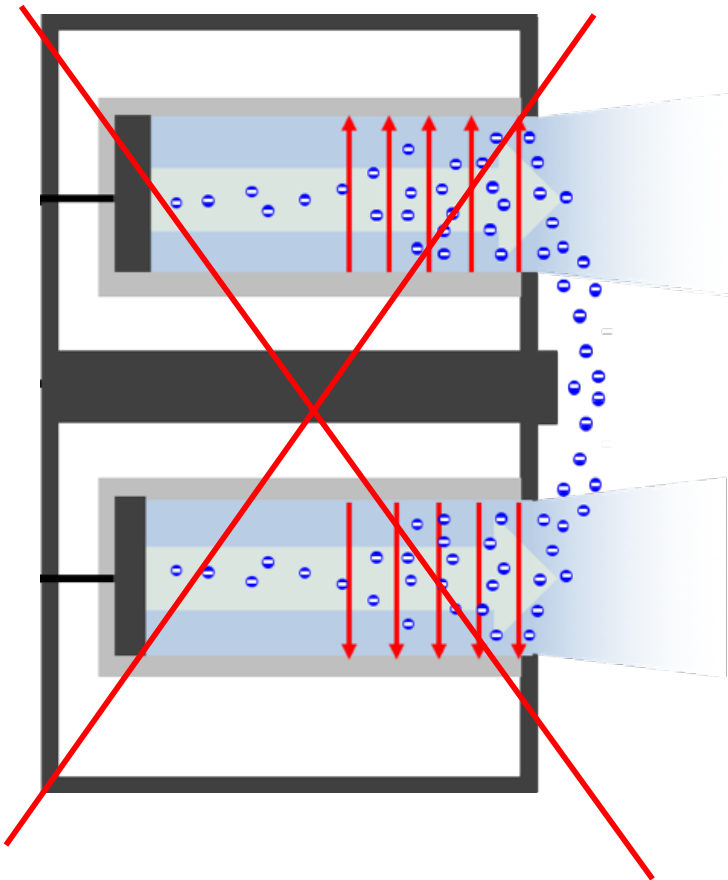
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Actual cross-field current from evaluating equations 1000 x higher



Problem of non-classical electron transport in Hall thruster modeling

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Actual cross-field current from evaluating equations 1000 x higher

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Electron Energy

Need to introduce ad hoc factor

$$\frac{3}{2} n_e \frac{\partial T_e}{\partial t} = -q \frac{\rho_i}{m_i} \mathbf{E} \cdot \mathbf{u}_e - \nabla \cdot \left(\frac{5}{2} n_e T_e \mathbf{u}_e + \mathbf{Q}_e \right) + \frac{3}{2} T_e \nabla \cdot (n_e \mathbf{u}_e)$$

“Anomalous collision frequency”

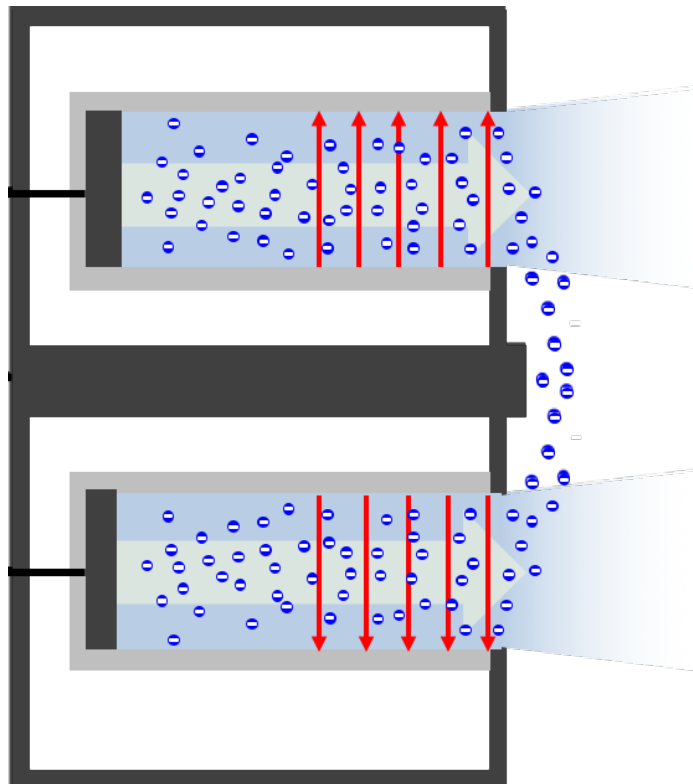
Current conservation

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Problem of non-classical electron transport in Hall thruster modeling

$$I_e / I_d \sim 10\%$$



Anomalous friction term promotes additional cross-field current

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Ion momentum

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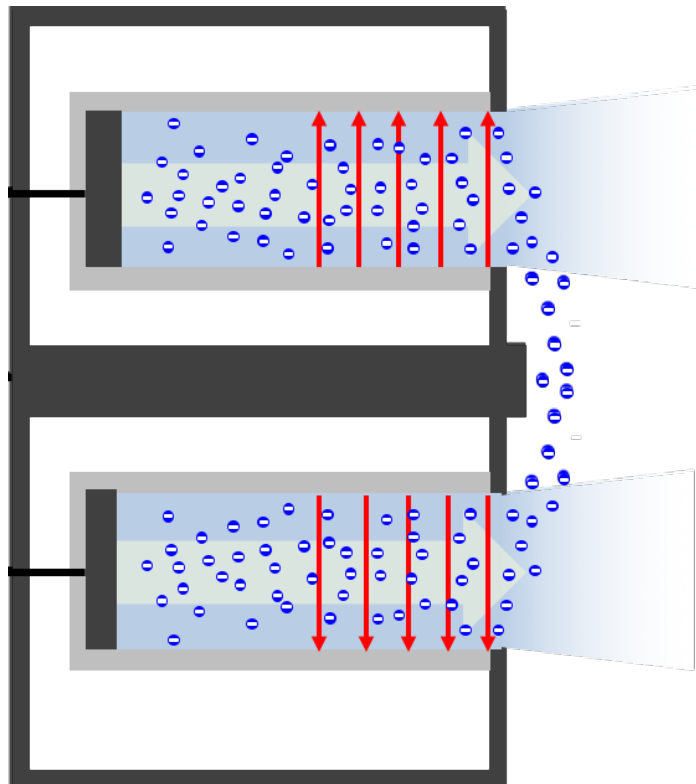
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$$\frac{\partial (m_i n_i \mathbf{u}_i)}{\partial t} + \nabla \cdot (m_i n_i \mathbf{u}_i \mathbf{u}_i) = q n_i \mathbf{E} - \nu_i m_i (\mathbf{u}_i - \mathbf{u}_e)$$

Ohm's Law

$$\nu_e m_e n_e \mathbf{u}_e = -q n_e \vec{E} - \nabla P_e - q n_e \mathbf{u}_e \times \vec{B} - n_e m_e \nu_{AN} \mathbf{u}_e,$$

Electron Energy

Need to introduce ad hoc factor

$$\frac{3}{2} n_e \frac{\partial T_e}{\partial t} = -q \frac{\rho_i}{m_i} \mathbf{E} \cdot \mathbf{u}_e - \nabla \cdot \left(\frac{5}{2} n_e T_e \mathbf{u}_e + \mathbf{Q}_e \right) + \frac{3}{2} T_e \nabla \cdot (n_e \mathbf{u}_e)$$

“Anomalous collision frequency”

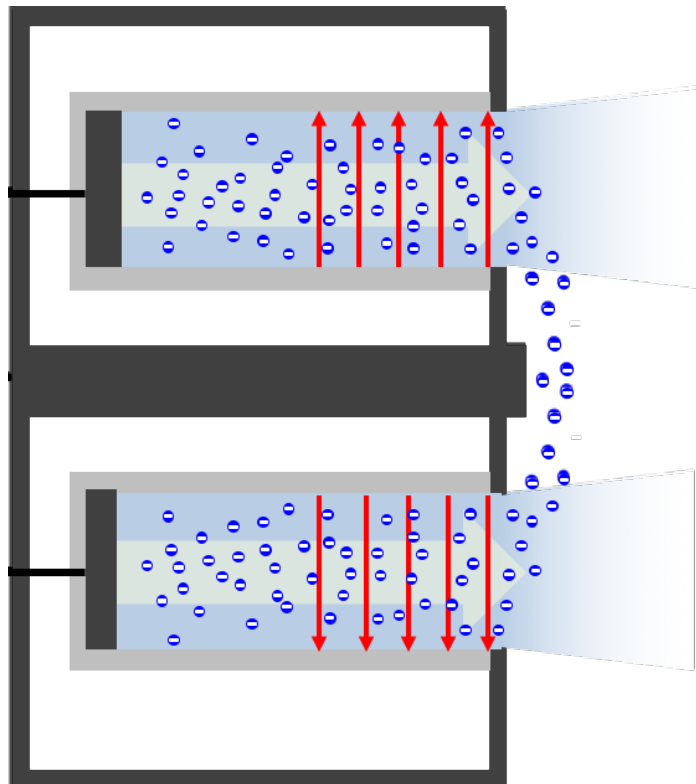
Current conservation

Problem of closure: introducing ad-hoc term opens set of equations (too many unknowns).



Problem of non-classical electron transport in Hall thruster modeling

$$I_e / I_d \sim 10\%$$



Anomalous friction term promotes additional cross-field current

Ion continuity

$$\frac{\partial n_i}{\partial t} + \nabla \cdot (n_i \mathbf{u}_i) = 0$$

We need a functional form for $v_{AN}(T_e, n_e, \dots)$ that depends on classical fluid parameters

$$\frac{\partial (m_i n_i \mathbf{u}_i)}{\partial t} + \nabla \cdot (m_i n_i \mathbf{u}_i \mathbf{u}_i) = q n_i \mathbf{E} - \nu_i m_i (\mathbf{u}_i - \mathbf{u}_e)$$

Ohm's Law

$$v_e m_e n_e \mathbf{u}_e = -q n_e \vec{E} - \nabla P_e - q n_e \mathbf{u}_e \times \vec{B} - n_e m_e v_{AN} \mathbf{u}_e,$$

Electron Energy

Need to introduce ad hoc factor

$$\frac{3}{2} n_e \frac{\partial T_e}{\partial t} = -q \frac{\rho_i}{m_i} \mathbf{E} \cdot \mathbf{u}_e - \nabla \cdot \left(\frac{5}{2} n_e T_e \mathbf{u}_e + \mathbf{Q}_e \right) + \frac{3}{2} T_e \nabla \cdot (n_e \mathbf{u}_e)$$

“Anomalous collision frequency”

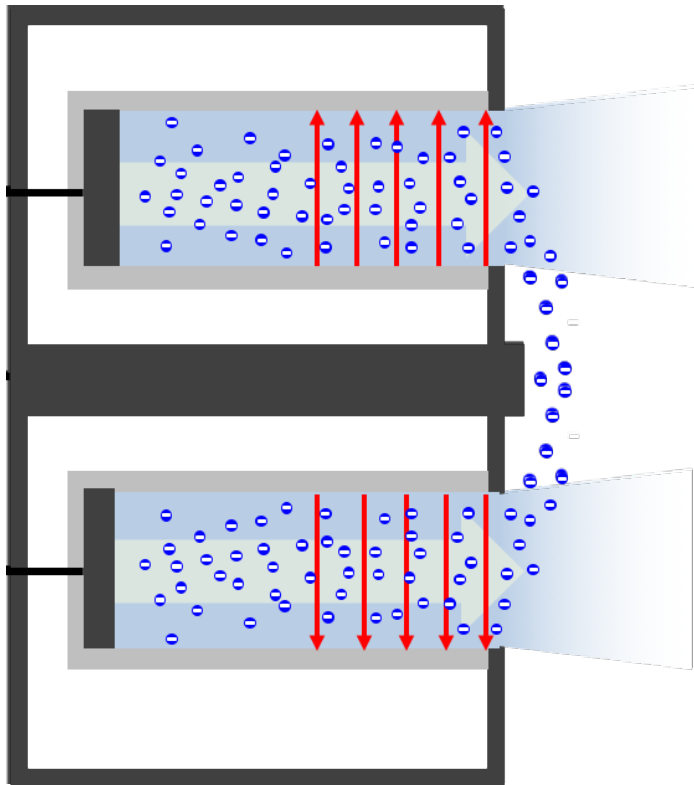
Current conservation

Problem of closure: introducing ad-hoc term opens set of equations (too many unknowns).



Problem of non-classical electron transport in Hall thruster modeling

$$I_e / I_d \sim 10\%$$



Aside: why not use a fully kinetic model?

In principle, this should capture all processes including non-classical one

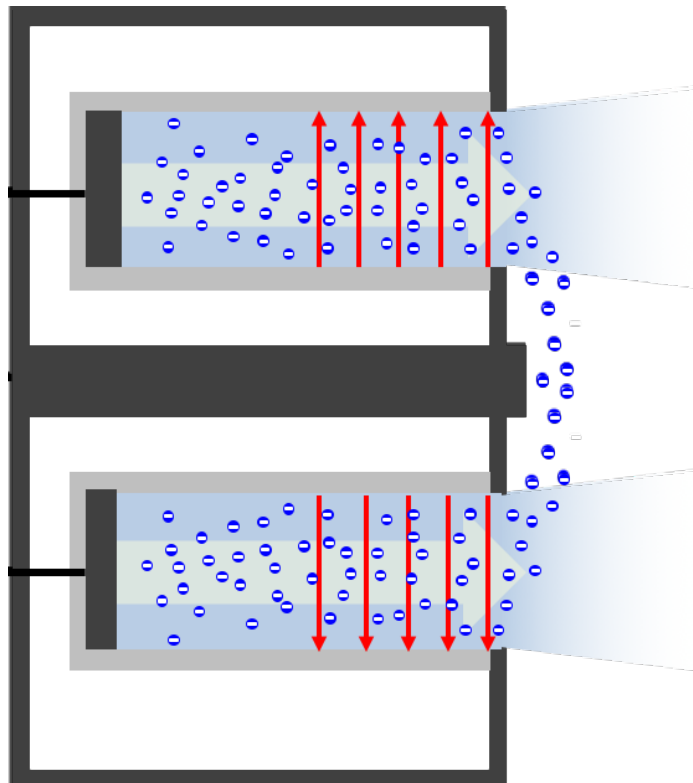
$$\frac{3}{2} n_e \frac{\partial T_e}{\partial t} = -q \frac{\rho_i}{m_i} \mathbf{E} \cdot \mathbf{u}_e - \nabla \cdot \left(\frac{5}{2} n_e T_e \mathbf{u}_e + \mathbf{Q}_e \right) + \frac{3}{2} T_e \nabla \cdot (n_e \mathbf{u}_e)$$

Anomalous friction term promotes additional cross-field current



Problem of non-classical electron transport in Hall thruster modeling

$$I_e / I_d \sim 10\%$$



Ion continuity

Assuming we use a fluid model, we need a functional form for $\nu_{AN}(T_e, n_e, \dots)$ that depends on classical fluid parameters

$$\frac{\partial(m_i n_i \mathbf{u}_i)}{\partial t} + \nabla \cdot (m_i n_i \mathbf{u}_i \mathbf{u}_i) = q n_i \mathbf{E} - \nu_i m_i (\mathbf{u}_i - \mathbf{u}_e)$$

Ohm's Law

$$v_e m_e n_e \mathbf{u}_e = -q n_e \vec{E} - \nabla P_e - q n_e \mathbf{u}_e \times \vec{B} - n_e m_e \nu_{AN} \mathbf{u}_e,$$

Electron Energy

Need to introduce ad hoc factor

$$\frac{3}{2} n_e \frac{\partial T_e}{\partial t} = -q \frac{\rho_i}{m_i} \mathbf{E} \cdot \mathbf{u}_e - \nabla \cdot \left(\frac{5}{2} n_e T_e \mathbf{u}_e + \mathbf{Q}_e \right) + \frac{3}{2} T_e \nabla \cdot (n_e \mathbf{u}_e)$$

“Anomalous collision frequency”

Current conservation

Anomalous friction term promotes additional cross-field current

Problem of closure: introducing ad-hoc term opens set of equations (too many unknowns).



Closing the Hall thruster fluid model

We need a functional form for $\nu_{AN}(T_e, n_e, \dots)$ that depends on classical fluid parameters

There have been many attempts. . .

Mikellides, I. G. and Katz, I., "Numerical Simulations of Hall-effect Plasma Accelerators on a Magnetic-Field-Aligned Mesh," Physical Review E, Vol. 86, No. 4, 2012, pp. 1–17.

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Mikellides, I., Ortega, A., Katz, I., and Jorns, B., "Hall2De simulations with a first-principles electron transport model based on the electron cyclotron drift instability," , No. AIAA-2016-4618.

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14Scharfe, M. K., Thomas, C. A., Scharfe, D. B., Gascon, N., Cappelli, M. A., and Fernandez, E., "Shear-Based Model for Electron Transport in 2D Hybrid Hall Thruster Simulations," IEEE Transactions on Plasma Science, Vol. 36, No. July, 2007, pp. 1–10.

15Katz, I., Lopez Ortega, A., Jorns, B., and Mikellides, I., "Growth and saturation of ion acoustic waves in hall thrusters," , No. AIAA-2016-4534.

16Jorns, B., "Predictive , Data-Driven Model for the Anomalous Electron Collision Frequency in a Hall Effect Thruster," Plasma Sources Science and Technology, Vol. 27, No. 104007, 2018.

17Lopez Ortega, A., Katz, I., and Chaplin, V., "A First-Principles Model Based on Saturation of the Electron Cyclotron Drift Instability for Electron Transport in Hydrodynamics Simulations of Hall Thruster Plasmas," 35th International Electric Propulsion Conference Georgia Institute of Technology, Atlanta, Georgia * USA, IEPC-2017-178

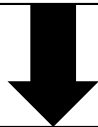


Closing the Hall thruster fluid model

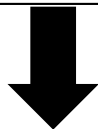
We need a functional form for $v_{AN}(T_e, n_e, \dots)$ that depends on classical fluid parameters

Physics-based approach

Propose mechanism for what drives transport



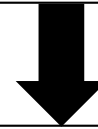
Verify experimentally if mechanism dominates transport



Formulate expression for $v_{AN}(T_e, n_e, \dots)$ based on validated process

Data-driven approach

Use experimental data to measure $v_{AN}(T_e, n_e, \dots)$ over several operating conditions



Regress data to build empirical closure model

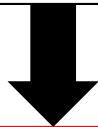


Closing the Hall thruster fluid model

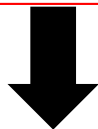
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Physics-based approach

Propose mechanism for what drives transport



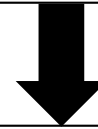
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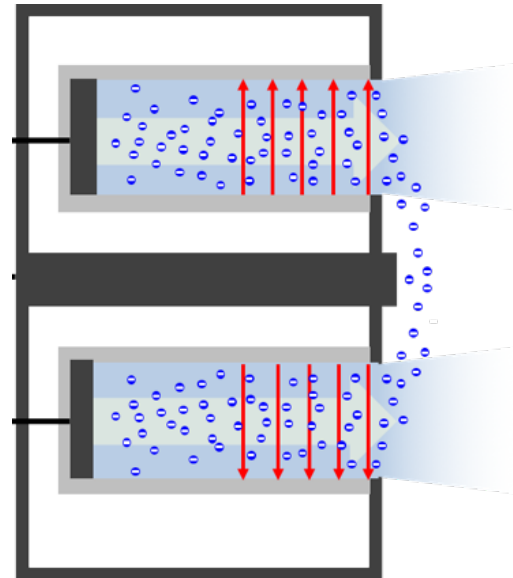
Regress data to build empirical closure model



Proposed mechanisms for enhanced cross-field transport in Hall thrusters

Low-frequency, coherent modes

Wall Interactions

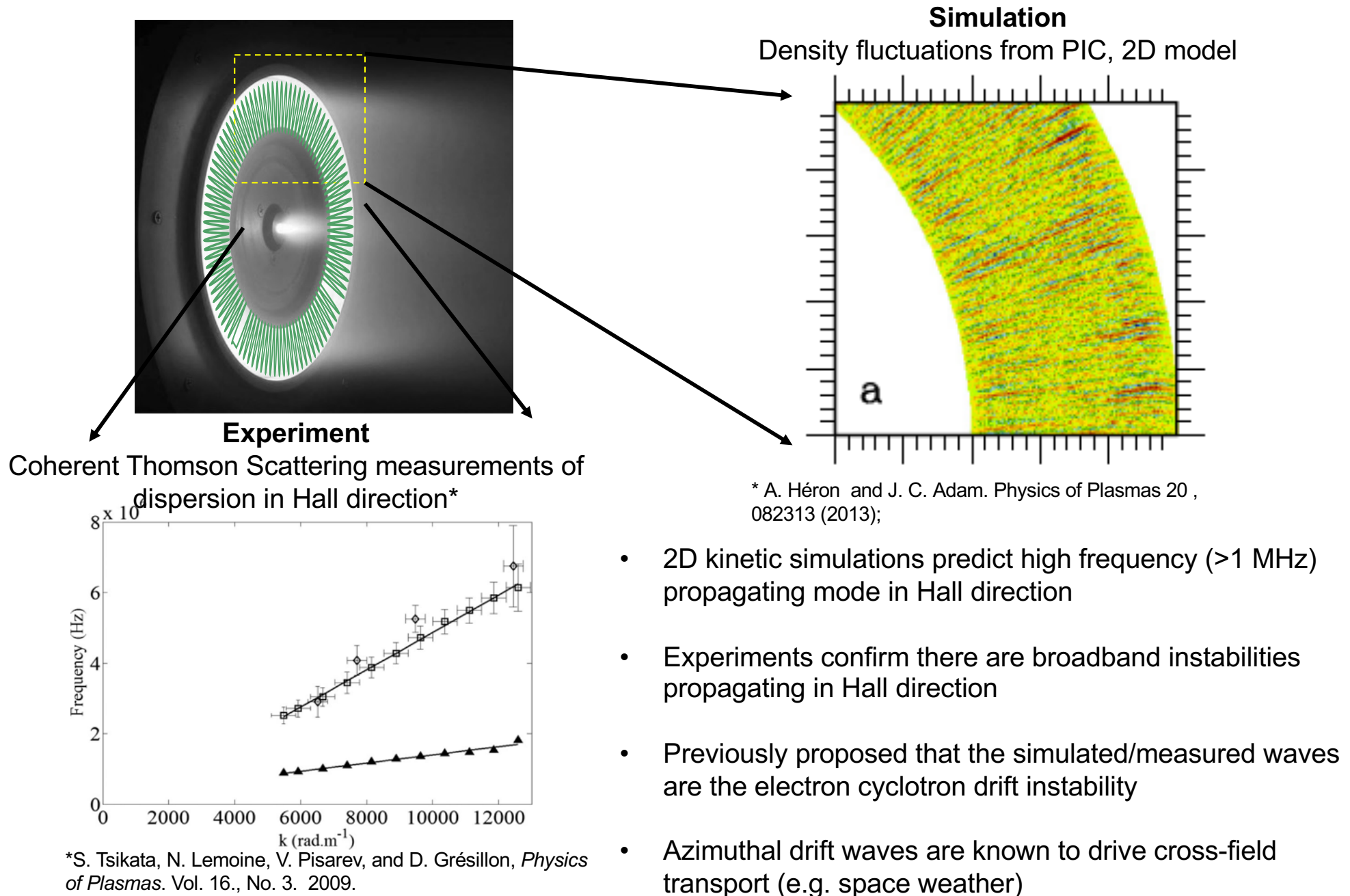


High-frequency, low amplitude Instabilities

Bohm Diffusion



Numerical and experimental evidence of turbulent fluctuations





Closing the Hall thruster fluid model

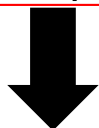
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Formulate expression for $v_{AN}(T_e, n_e, \dots)$ based on validated process

Data-driven approach

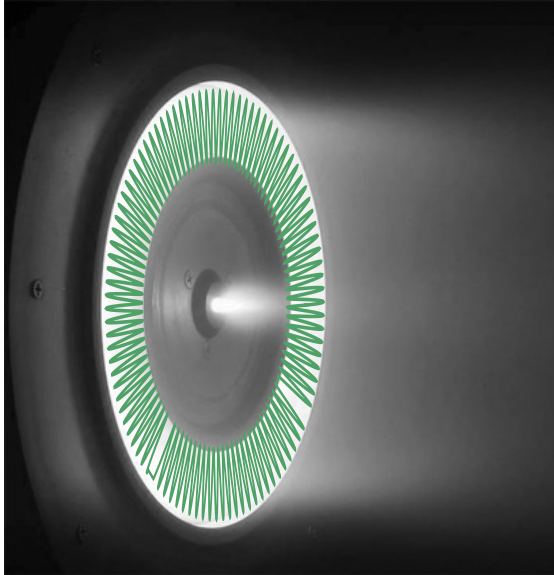
Use experimental data to measure $v_{AN}(T_e, n_e, \dots)$ over several operating conditions



Regress data to build empirical closure model



Relating experimentally measured wave properties to transport



The first moment of the second order Boltzmann equation yields

$$v_{AN} \approx \frac{\langle q \delta n_e \delta E_{(E \times B)} \rangle}{|m_e n_e u_{e(E \times B)}|}$$

δn_e

Wave density fluctuation amplitude

$\delta E_{(E \times B)}$

Wave electric field amplitude e

$u_{e(E \times B)}$

Electron drift in Hall direction

$\langle \rangle$

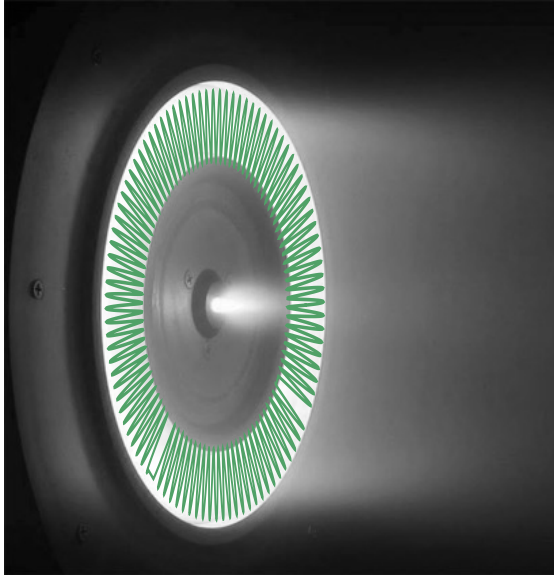
Average over wave spectrum

Practical problem: While it straightforward to measure density fluctuations, it has not been possible to perform simultaneous electric field measurements

Solution: Employ quasilinear theory to relate density and electric field amplitudes



Relating experimentally measured wave properties to transport



The first moment of the second order Boltzmann equation yields

$$v_{AN} \approx \frac{T_e}{|m_e u_{e(E \times B)}|} \left\langle \left(\frac{\delta n_e}{n_e} \right)^2 k_i \right\rangle$$

δn_e	Wave density fluctuation amplitude
k_i	Linear wave growth rate
$u_{e(E \times B)}$	Electron drift in Hall direction
$\langle \rangle$	Average over wave spectrum

Practical problem: While it is straightforward to measure density fluctuations, it has not been possible to perform simultaneous electric field measurements

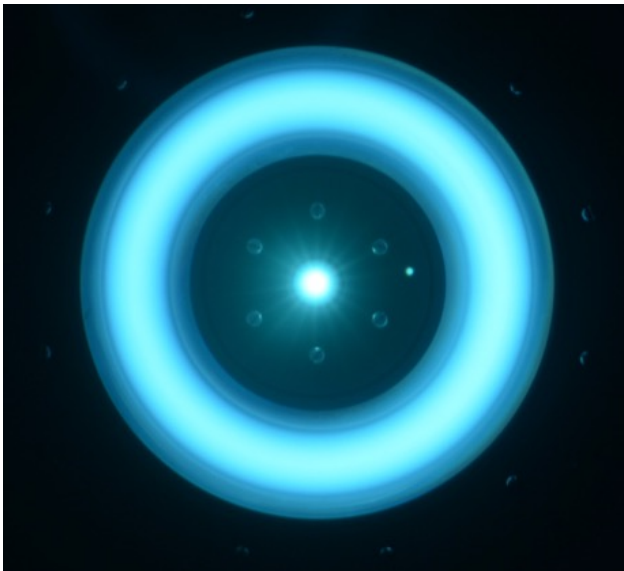
Solution: Employ quasilinear theory to relate density and electric field amplitudes



Experimental Setup at UM

Large Vacuum Test Facility at UM

H9: 9-kW magnetically shielded Hall effect thruster at 300 V and 4.5 kW

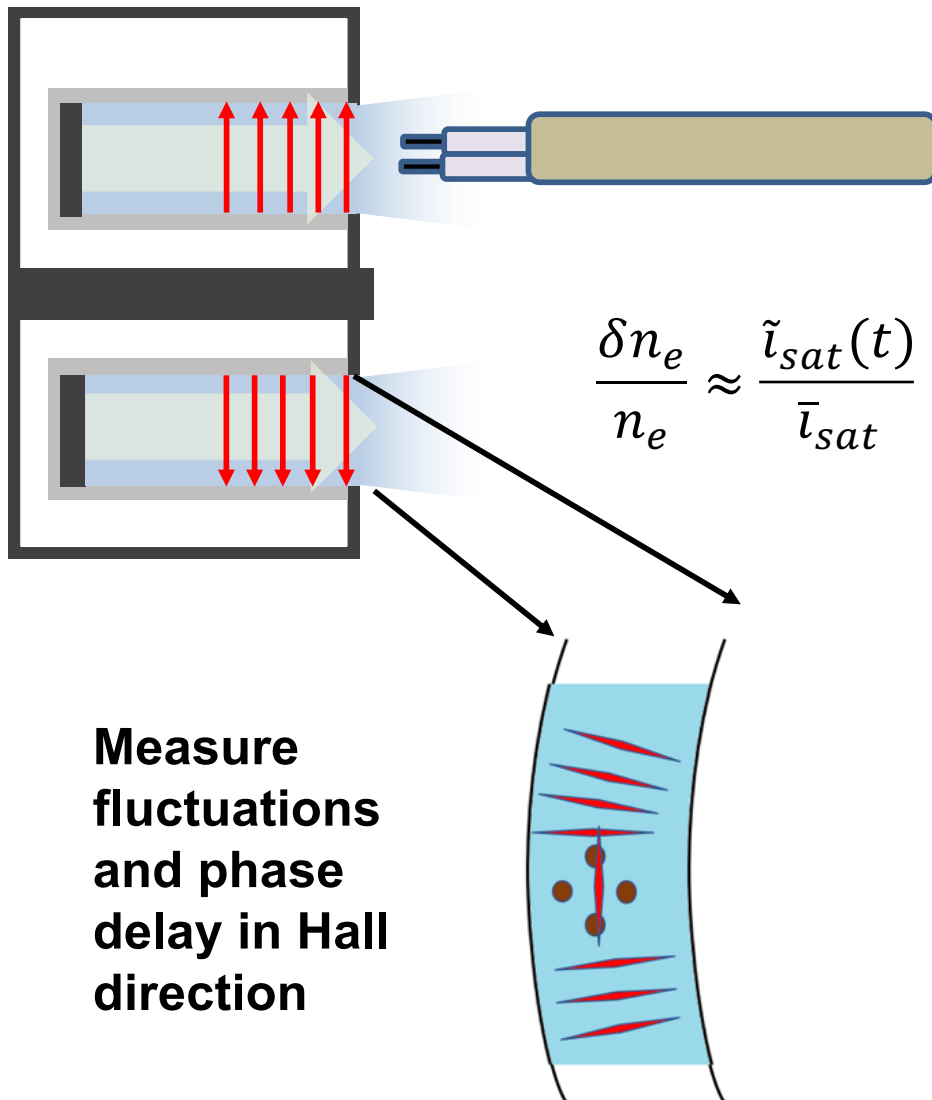


550 kl/s pumping speed on xenon



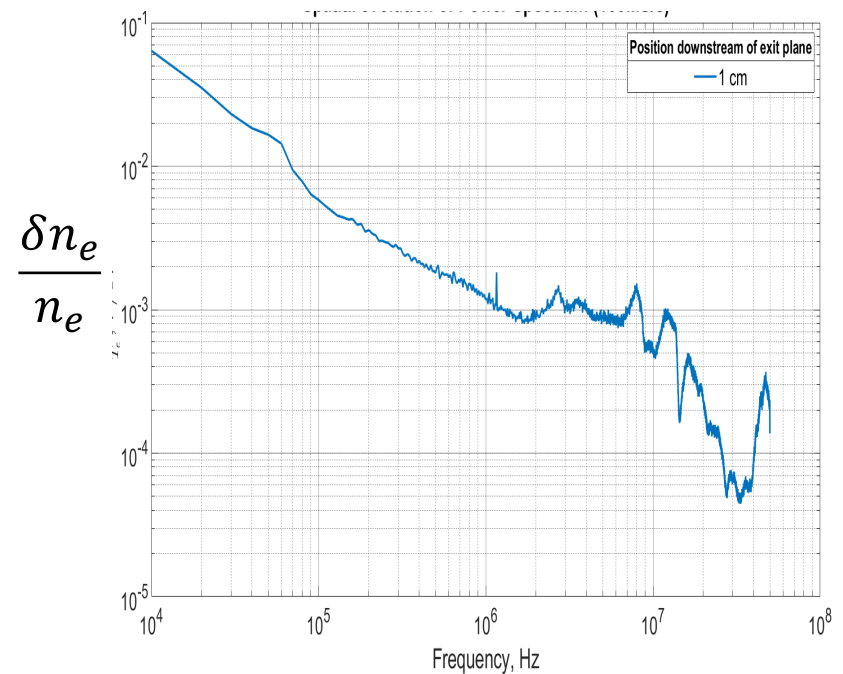
Experimental Setup at UM

Ion saturation probes



Analysis

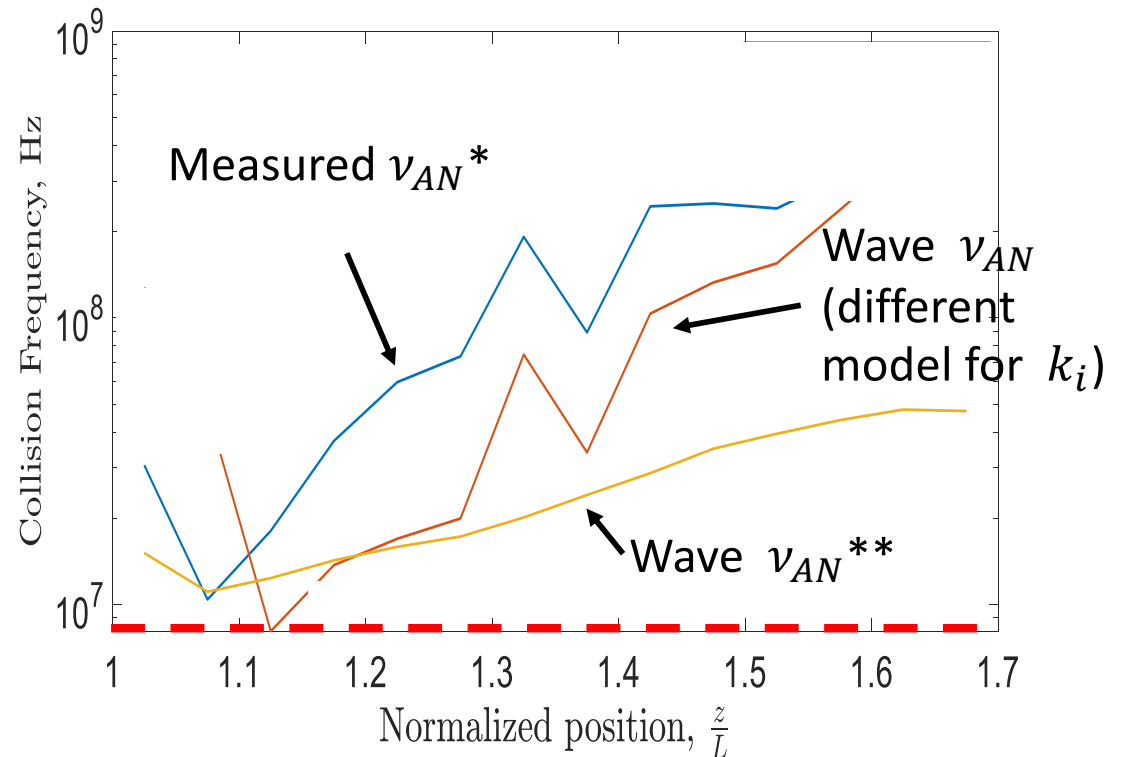
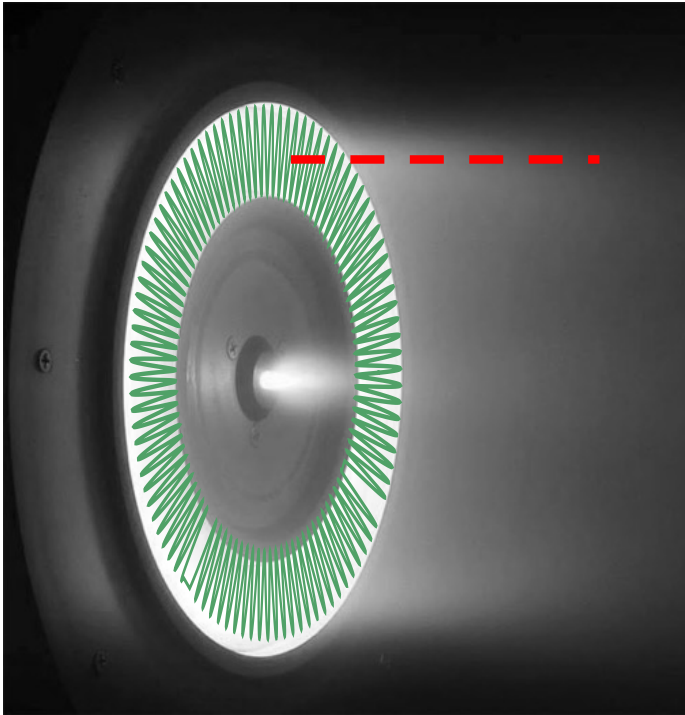
- Fourier analysis to find
 - Power spectrum $\phi(\omega)$
 - Cross-correlation $\omega(k)$
- Averaging yields statistical dispersion relation $\phi(\omega, k)$





Measured collision frequency from instabilities compared to actual non-classical collision frequency

$$\nu_{AN} \approx \frac{T_e}{|m_e u_{e(E \times B)}|} \left\langle \left(\frac{\delta n_e}{n_e} \right)^2 k_i \right\rangle$$



- Depending on model for k_i , the wave-driven collision frequency is within a factor of 2-3 of the measured collision frequency. Captures the right shape
- There are also multiple potential reasons for this discrepancy (measurement techniques, imperfect model for k_i , etc.)
- Continuing to refine these results, but they at least show waves might be dominant factor**



Closing the Hall thruster fluid model

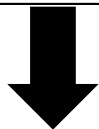
We need a functional form for $v_{AN}(T_e, n_e, \dots)$ that depends on classical fluid parameters

Physics-based approach

Propose mechanism for what drives transport



Verify experimentally if mechanism dominates transport



Formulate expression for $v_{AN}(T_e, n_e, \dots)$ based on validated process

Data-driven approach

Use experimental data to measure $v_{AN}(T_e, n_e, \dots)$ over several operating conditions



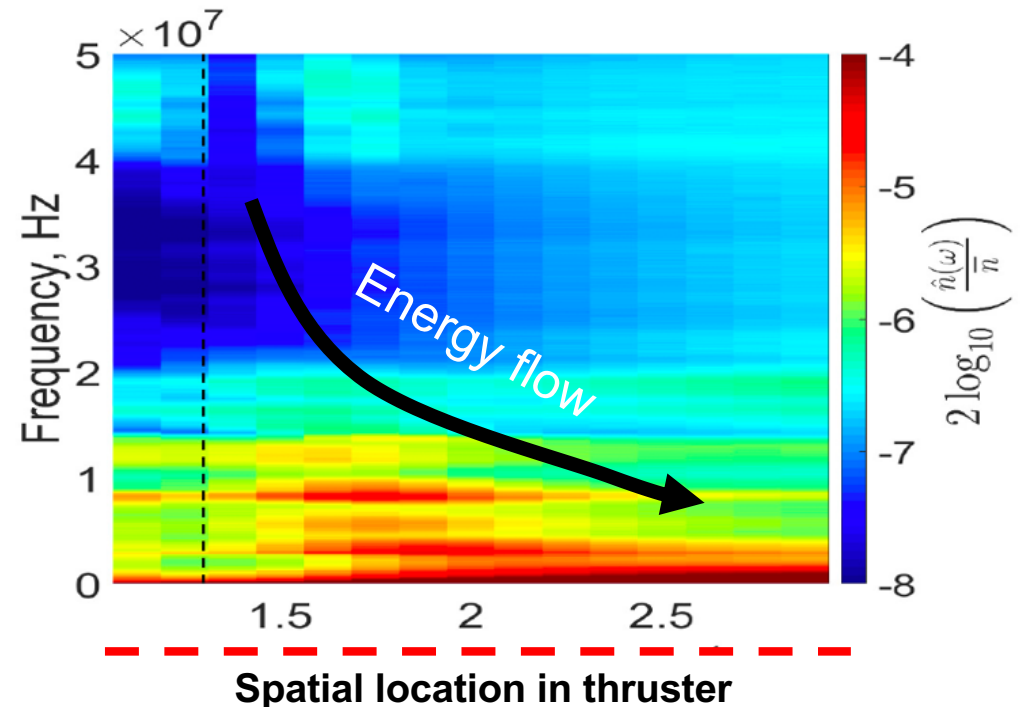
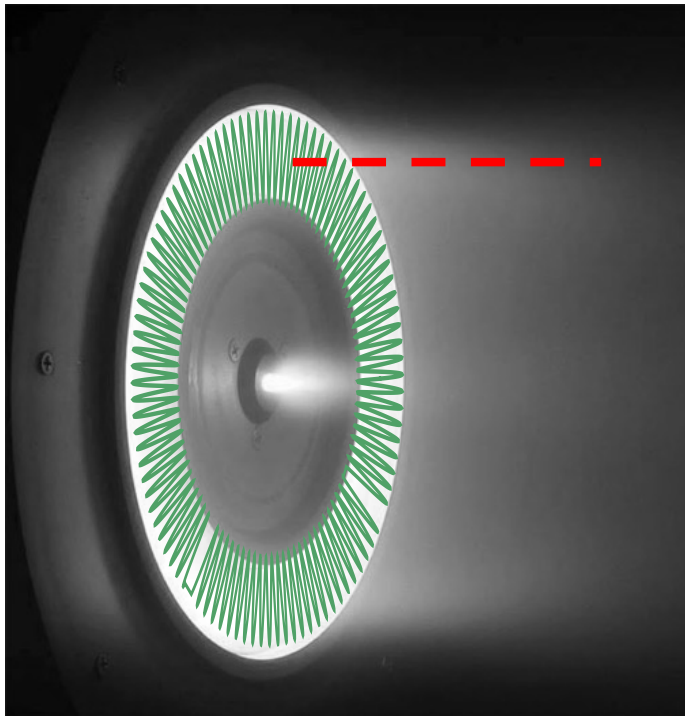
Regress data to build empirical closure model



Formulating closure model for collision frequency

Governing hypothesis: anomalous collision frequency in Hall thruster is result of wave-particle interaction with low-level electrostatic waves

Challenge: how do we model the evolution of the wave energy and the rate at which these waves exchange energy with the electrons?



There is experimental evidence of nonlinear energy cascade as waves propagate. This suggests evolution of wave properties is nonlinear. This complicates the formulation for how the energy convects in plasma



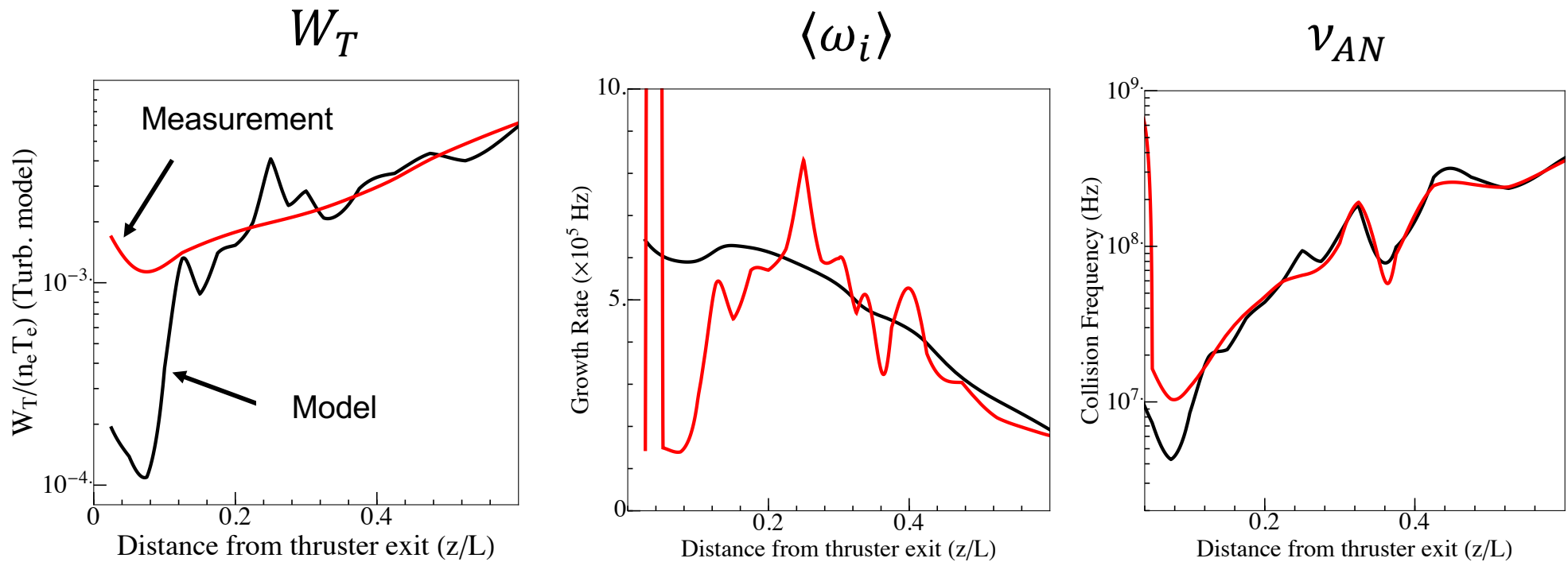
Formulating closure model for collision frequency

Approach: Two equation closure model based on moments of nonlinear plasma wave kinetic equation

$$\nu_{AN} \propto \langle \omega_i \rangle W_T$$

Average rate at which wave extracts energy from electrons

Total energy density of waves

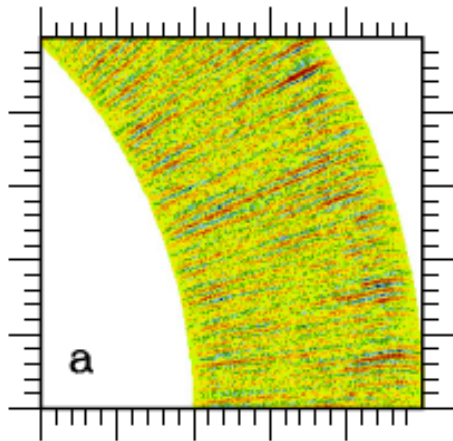


Preliminary formulation has yielded promising results, though model is still not predictive (needs to be calibrated against data)



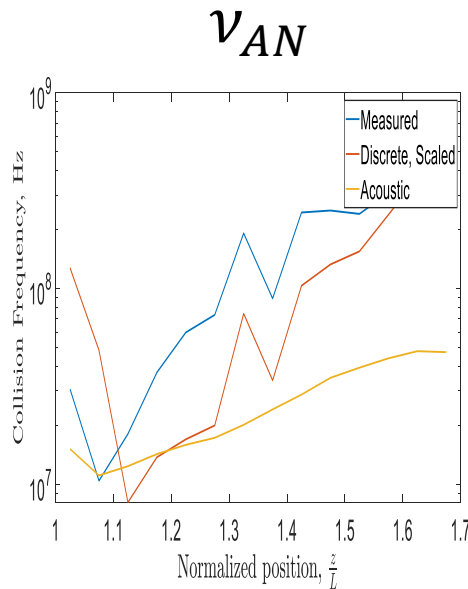
Summary of physics-based approach to closure for Hall thruster models

Propose mechanism for what drives transport

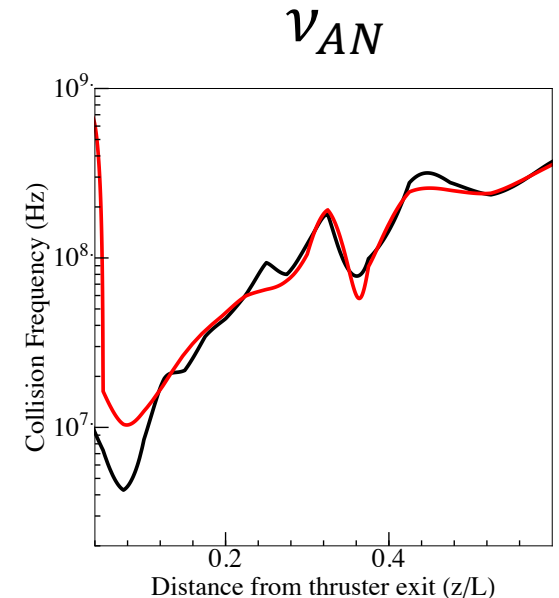


* A. Héron and J. C. Adam. Physics of Plasmas 20, 082313 (2013);

Verify experimentally if mechanism dominates transport



Formulate expression for $\nu_{AN}(T_e, n_e, \dots)$ based on validated process



- There may be other mechanisms impacting transport (boundary effects or lower frequency modes)
- The formulation relating wave properties to transport is oversimplified
- We have derived one closure model, though there are other approaches* based on zero and single equation formulations. **Predictive models remain elusive**



Closing the Hall thruster fluid model

We need a functional form for $v_{AN}(T_e, n_e, \dots)$ that depends on classical fluid parameters

Physics-based approach

Propose mechanism for what drives transport



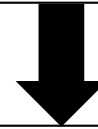
Verify experimentally if mechanism dominates transport



Formulate expression for $v_{AN}(T_e, n_e, \dots)$ based on validated process

Data-driven approach

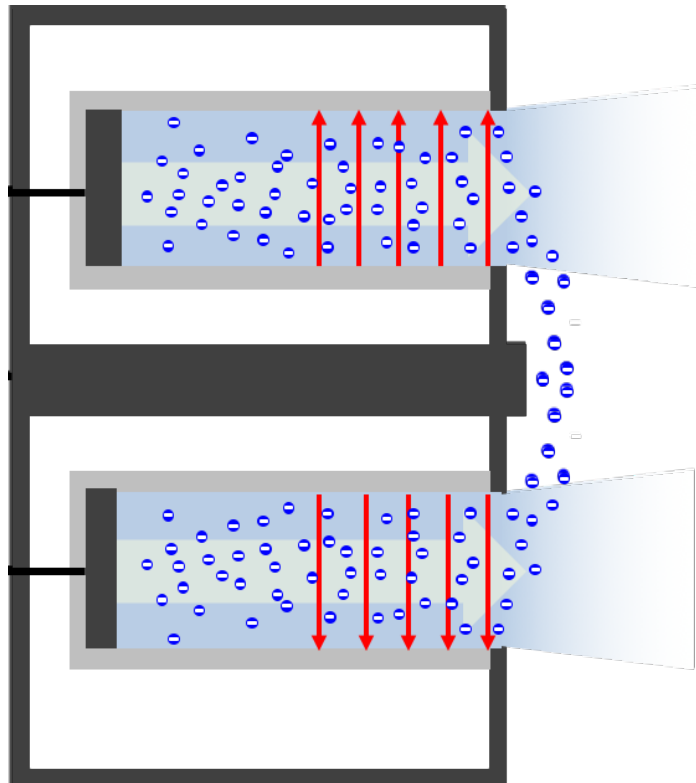
Use experimental data to measure $v_{AN}(T_e, n_e, \dots)$ over several operating conditions



Regress data to build empirical closure model



Current practice for engineering models: data calibration



Ion continuity

$$\frac{\partial n_i}{\partial t} + \nabla \cdot (n_i \mathbf{u}_i) = 0$$

Ion momentum

$$\frac{\partial (m_i n_i \mathbf{u}_i)}{\partial t} + \nabla \cdot (m_i n_i \mathbf{u}_i \mathbf{u}_i) = q n_i \mathbf{E} - \nu_i m_i (\mathbf{u}_i - \mathbf{u}_e)$$

Ohm's Law

$$v_e m_e n_e \mathbf{u}_e = -q n_e \vec{E} - \nabla P_e - q n_e \mathbf{u}_e \times \vec{B} - n_e m_e \nu_{AN} \mathbf{u}_e,$$

Electron Energy

$$\frac{3}{2} n_e \frac{\partial T_e}{\partial t} = -q \frac{\rho_i}{m_i} \mathbf{E} \cdot \mathbf{u}_e - \nabla \cdot \left(\frac{5}{2} n_e T_e \mathbf{u}_e + \mathbf{Q}_e \right) + \frac{3}{2} T_e \nabla \cdot (n_e \mathbf{u}_e)$$

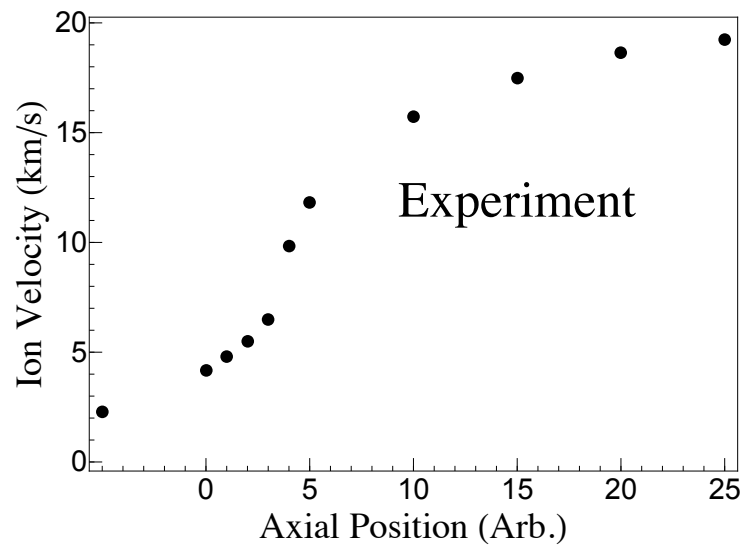
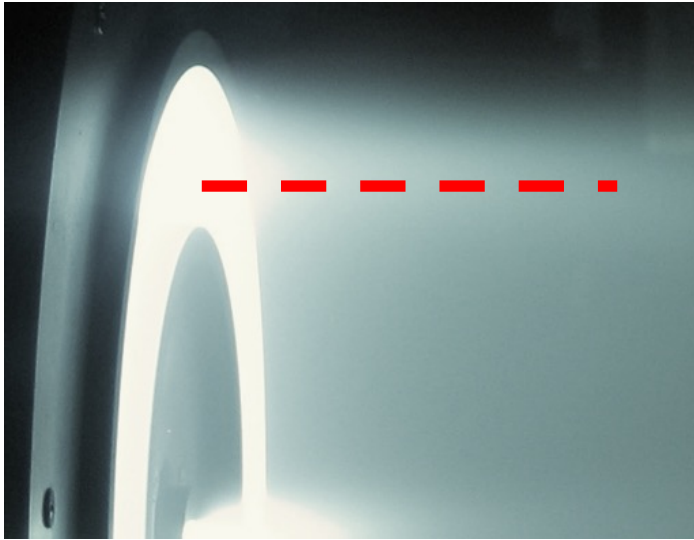
Current conservation

$$0 = \nabla \cdot (q n_e [\mathbf{u}_e - \mathbf{u}_i])$$

SOA Hall thruster fluid models use data to calibrate collision frequency term

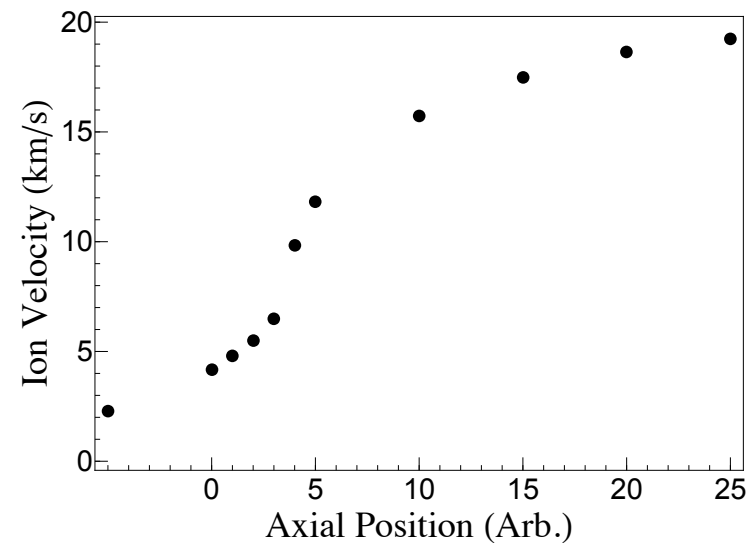
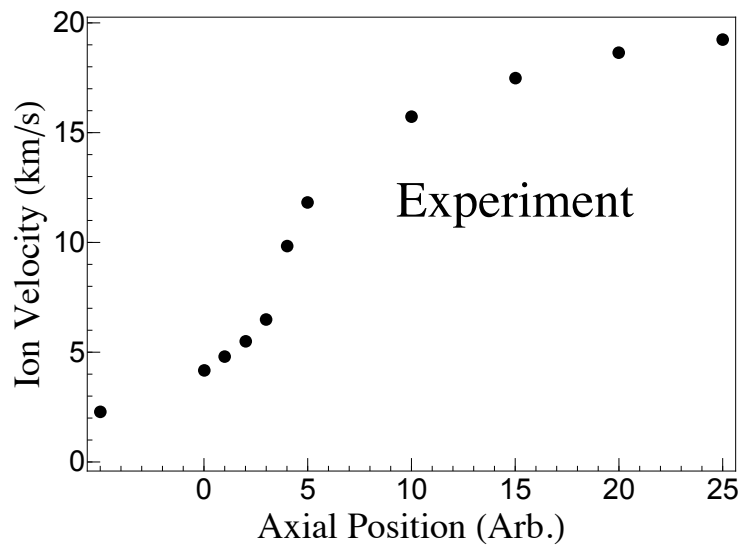
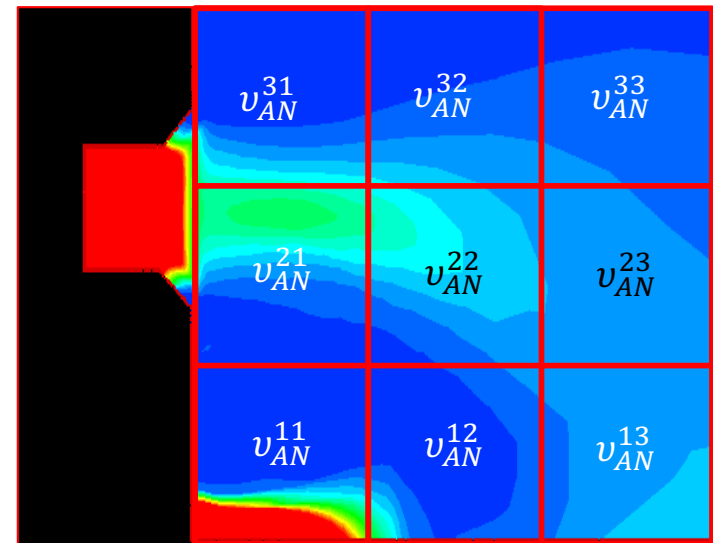
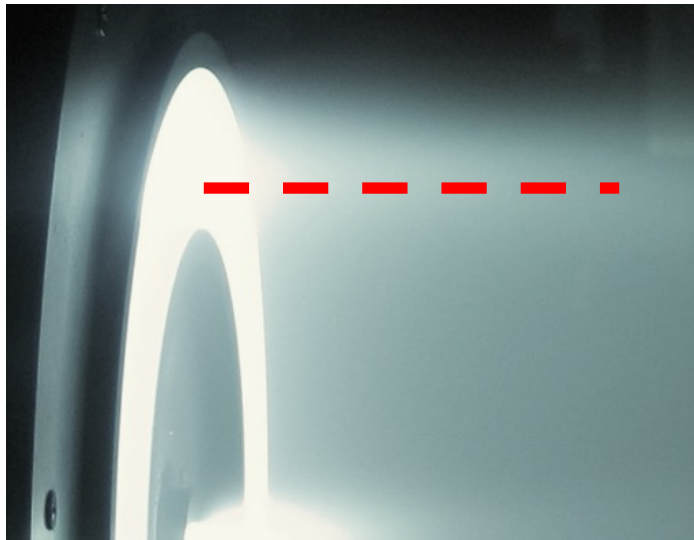


Closures for anomalous collision frequency: empirical estimate



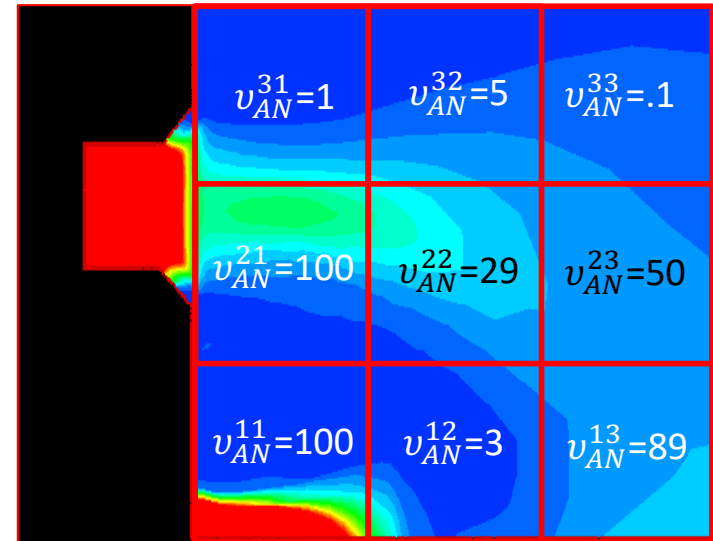
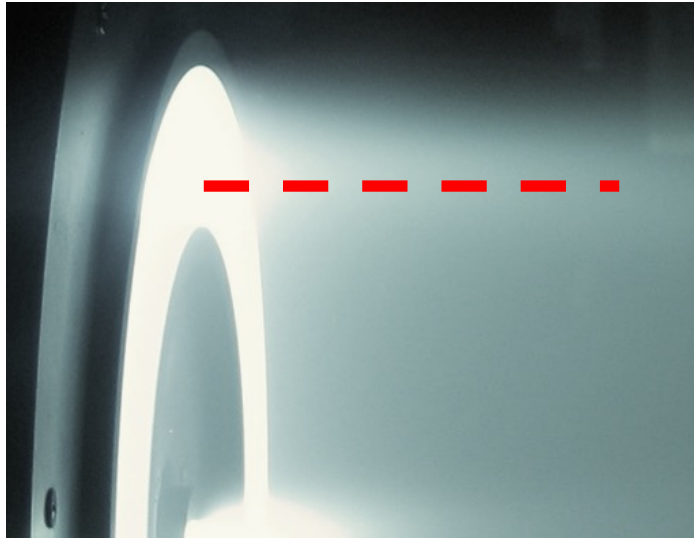


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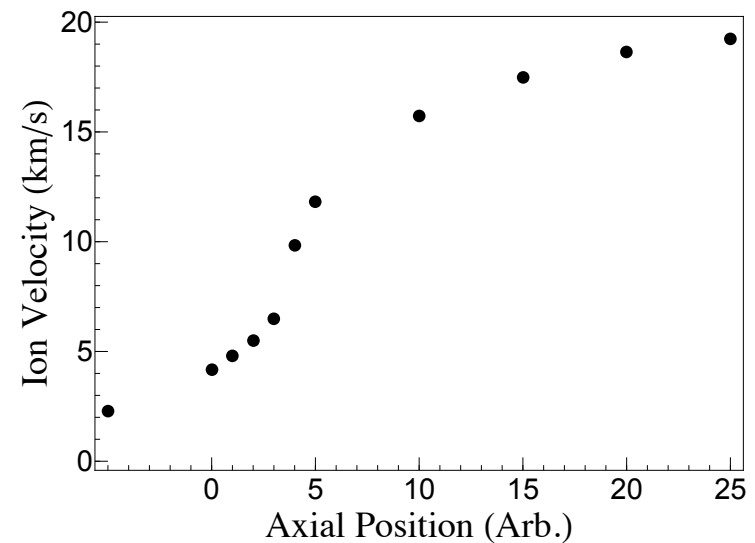
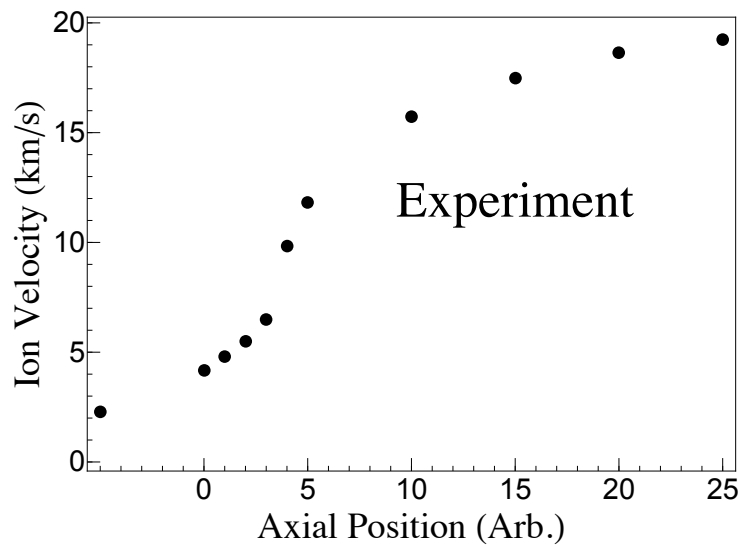




Closures for anomalous collision frequency: empirical estimate

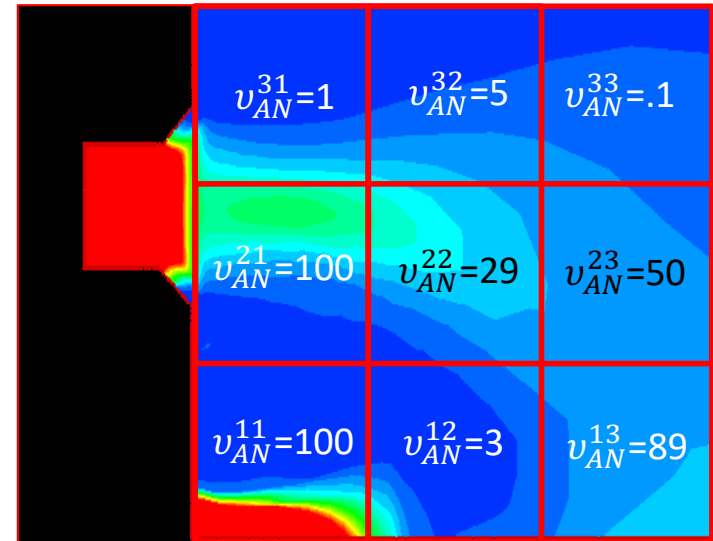
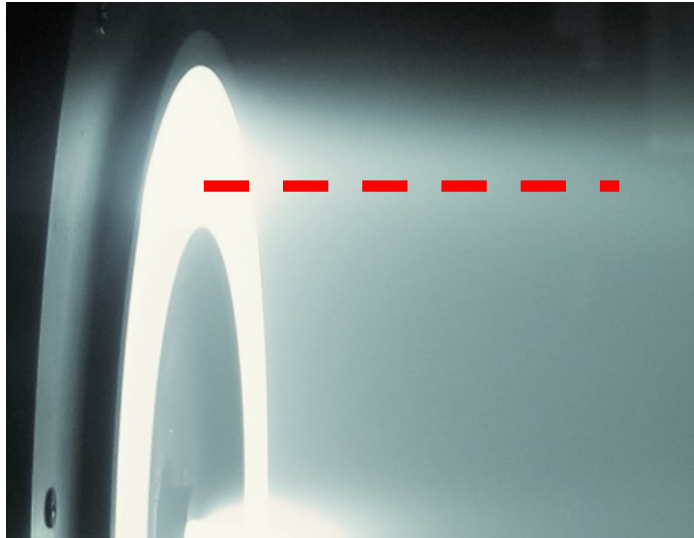


Iteration #1

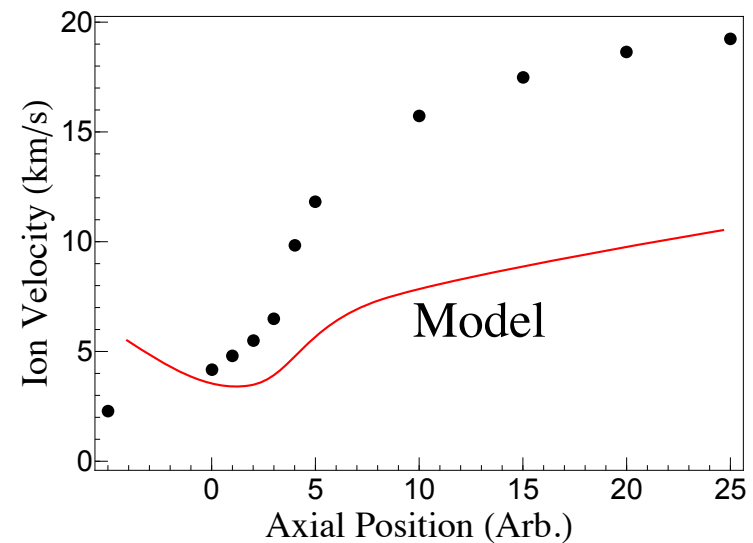
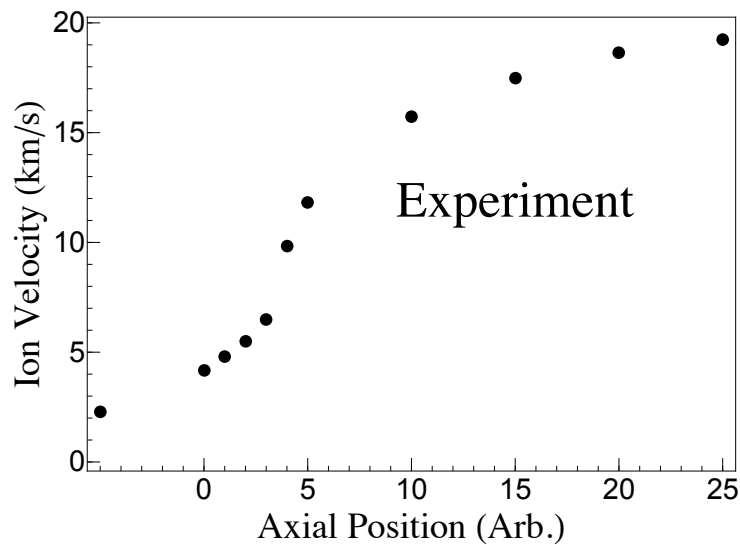




Closures for anomalous collision frequency: empirical estimate

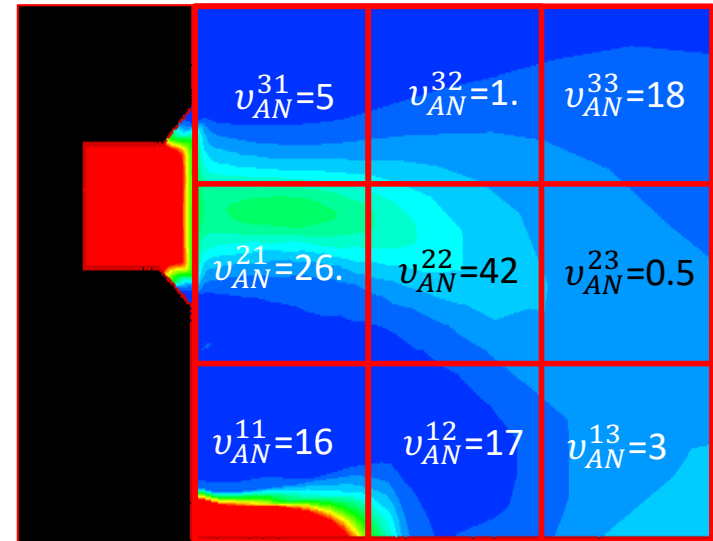
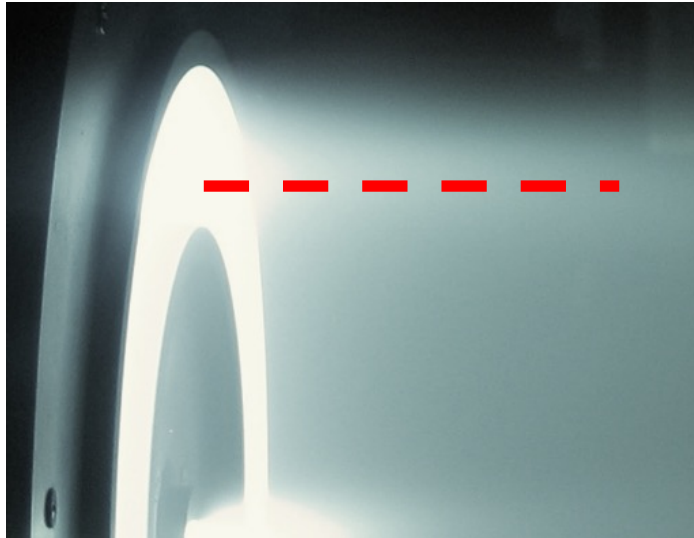


Iteration #1

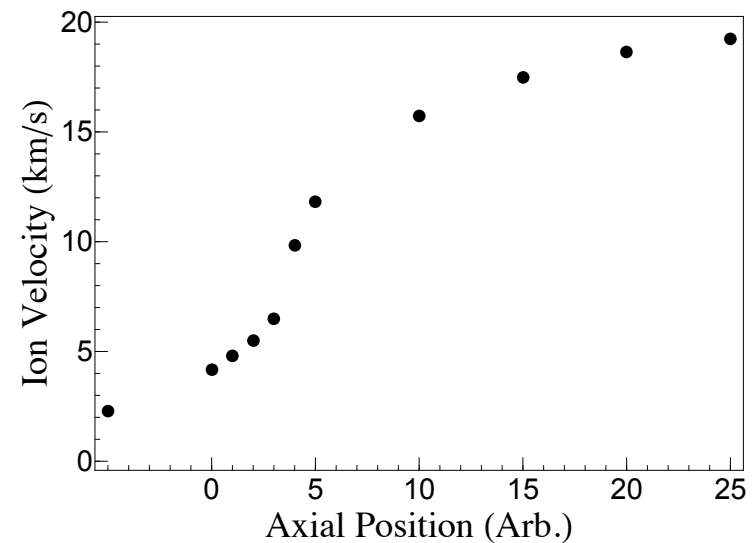
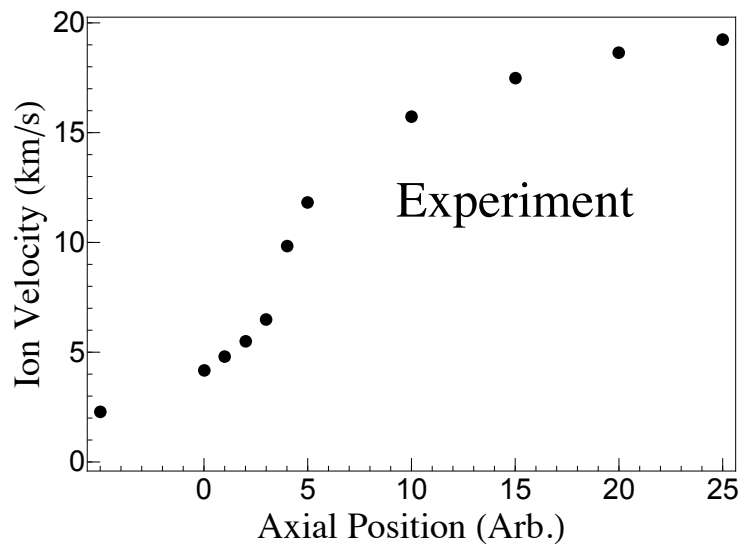




Closures for anomalous collision frequency: empirical estimate

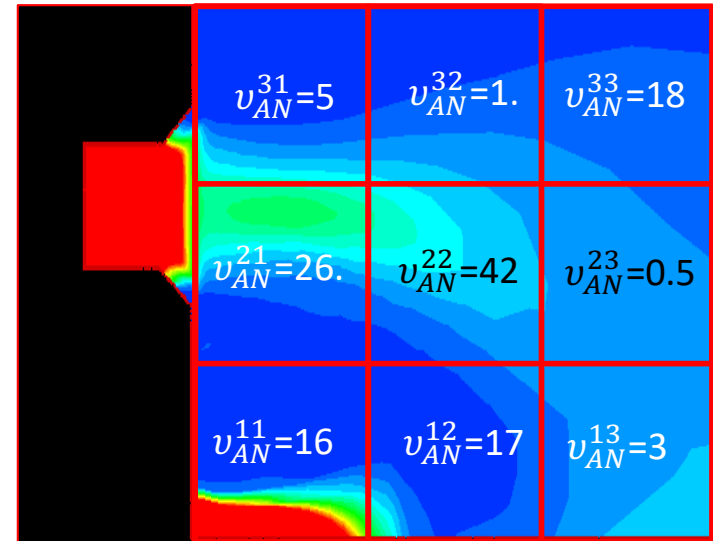
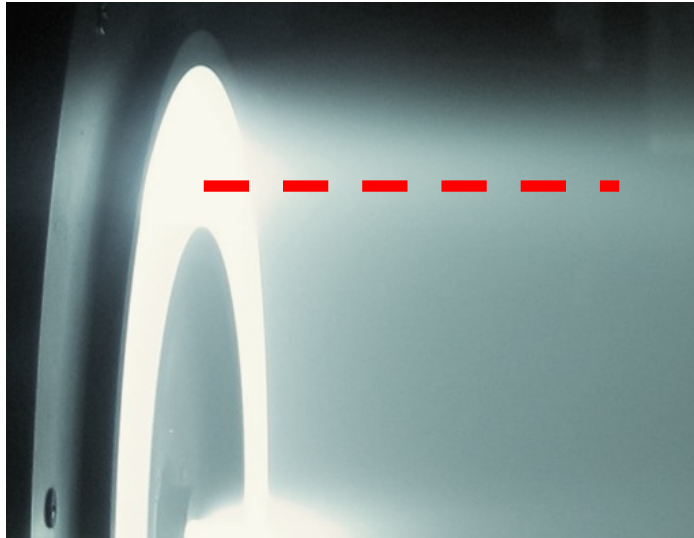


Iteration #2

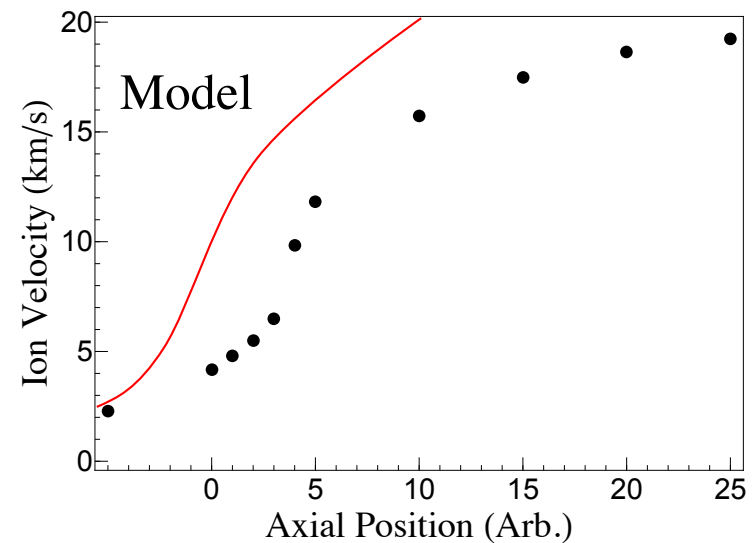
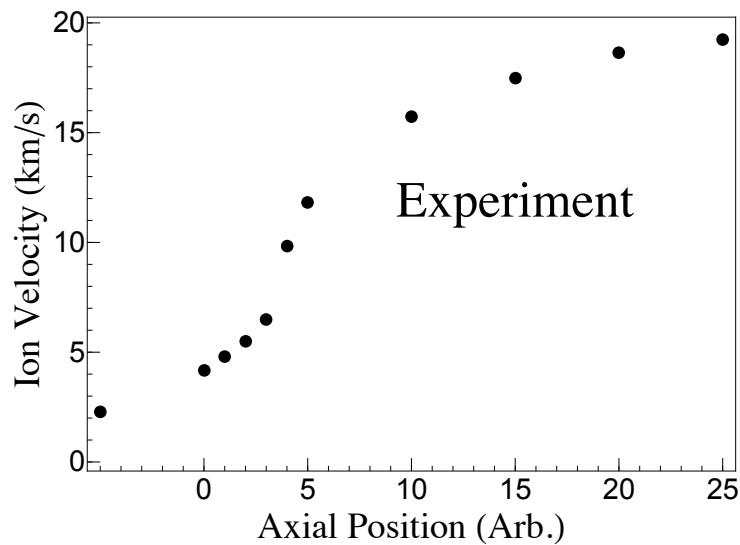




Closures for anomalous collision frequency: empirical estimate

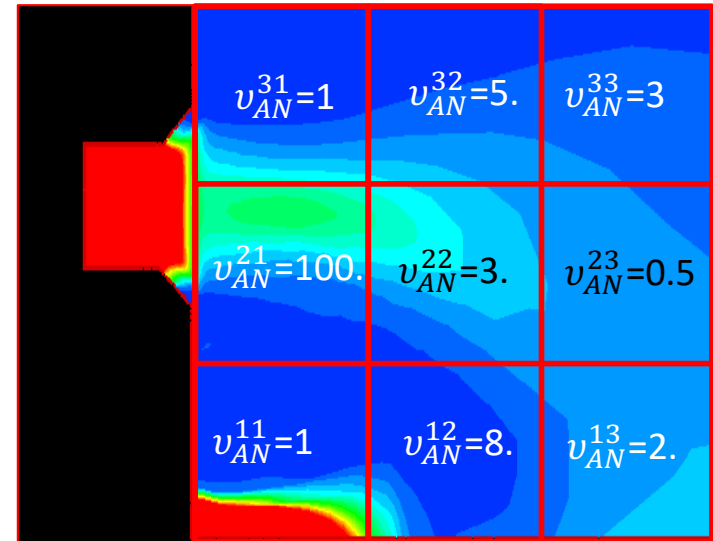
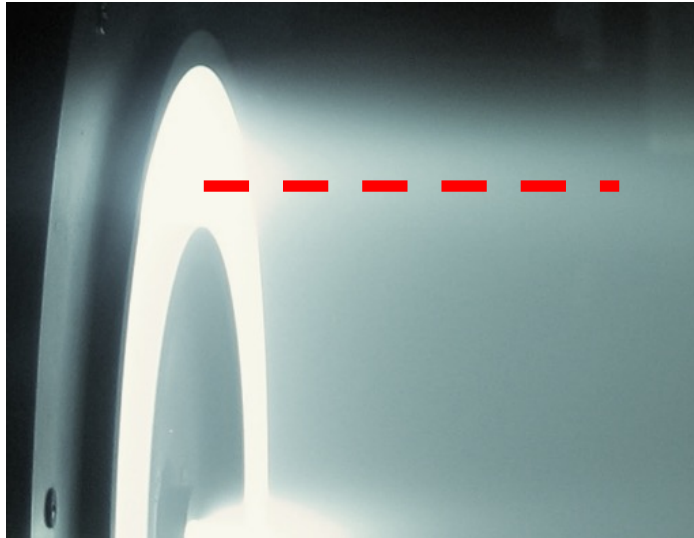


Iteration #2

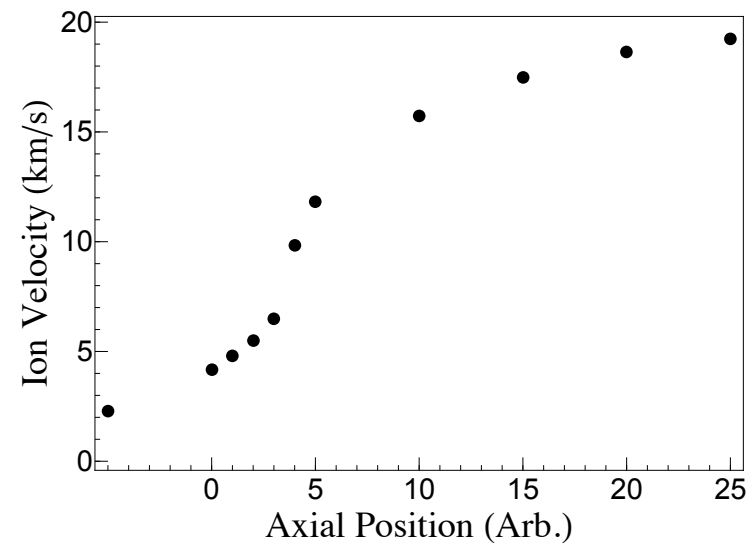
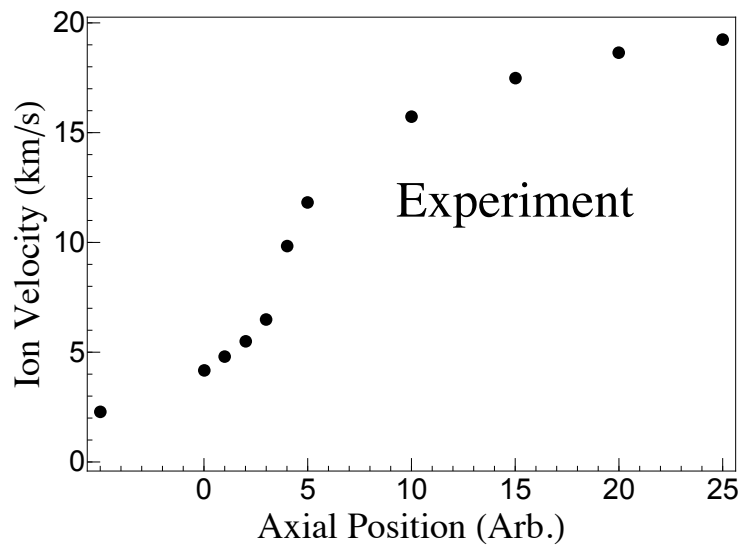




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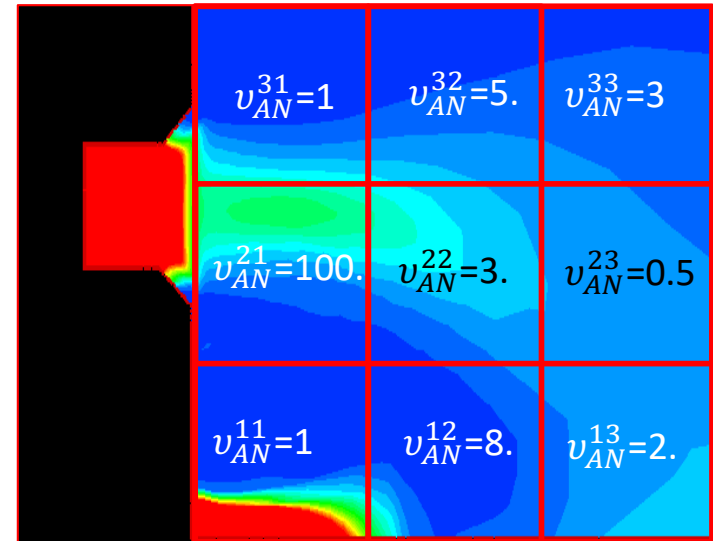
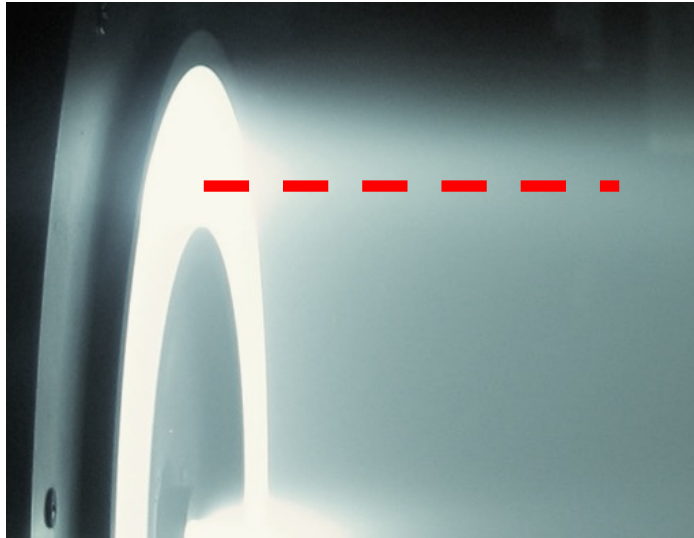


Iteration #3

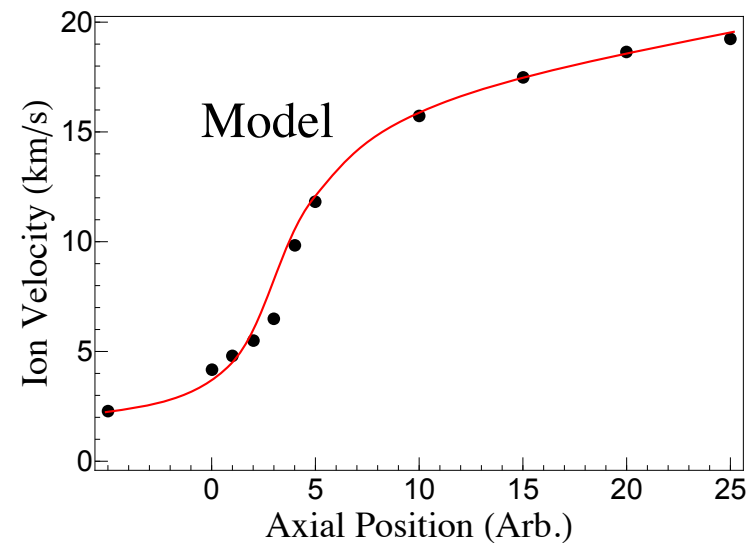
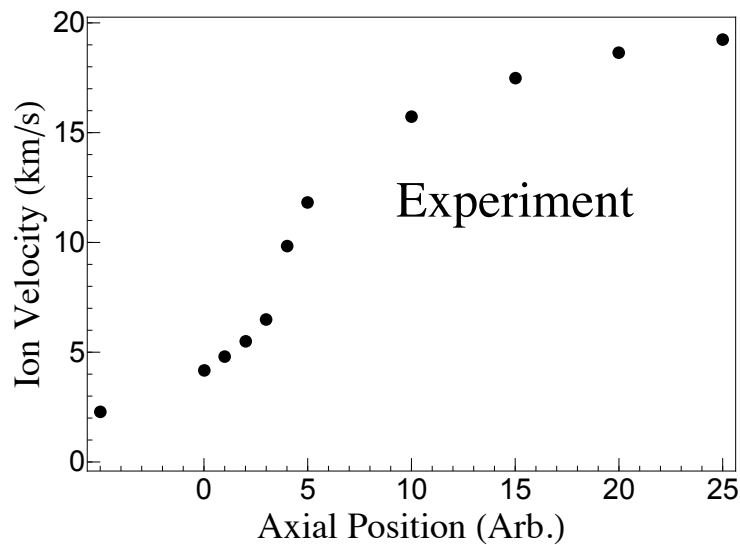




Closures for anomalous collision frequency: empirical estimate



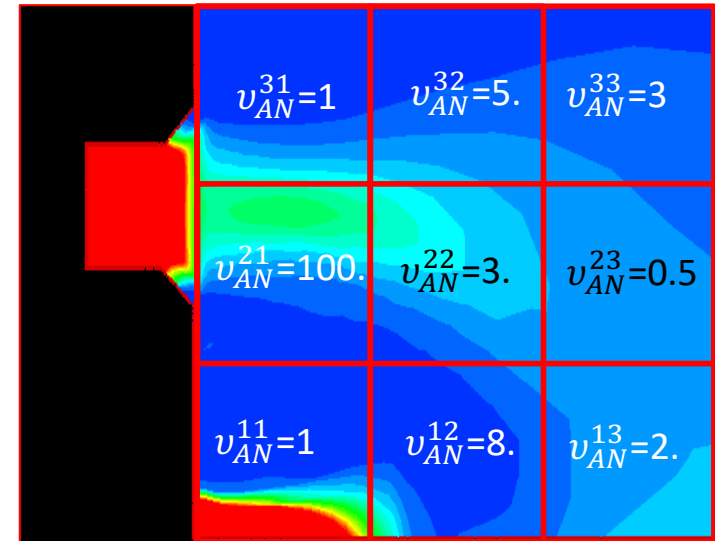
Iteration #3



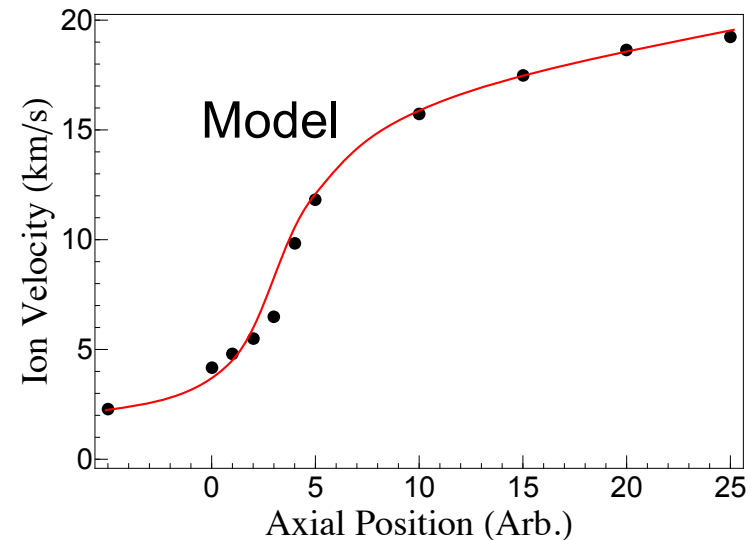


Closures for anomalous collision frequency: empirical estimate

- Yields excellent agreement with experimental results for a given operating condition
- Collision frequency is specified empirically. Only applicable for data set used for validation



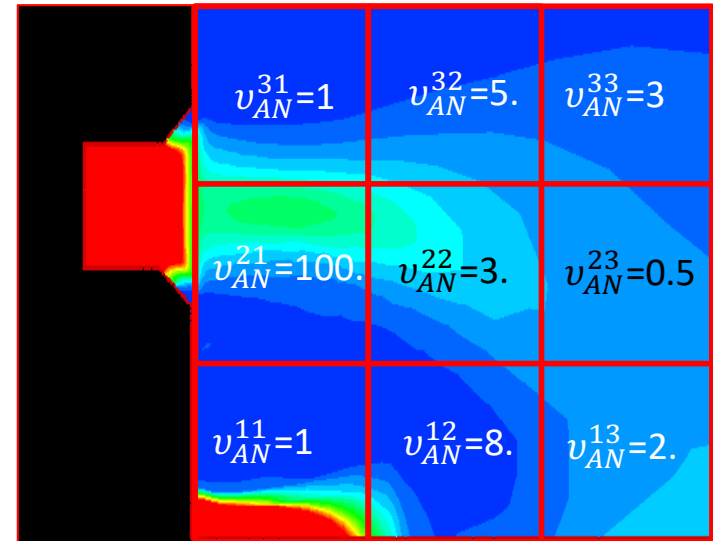
Iteration #3



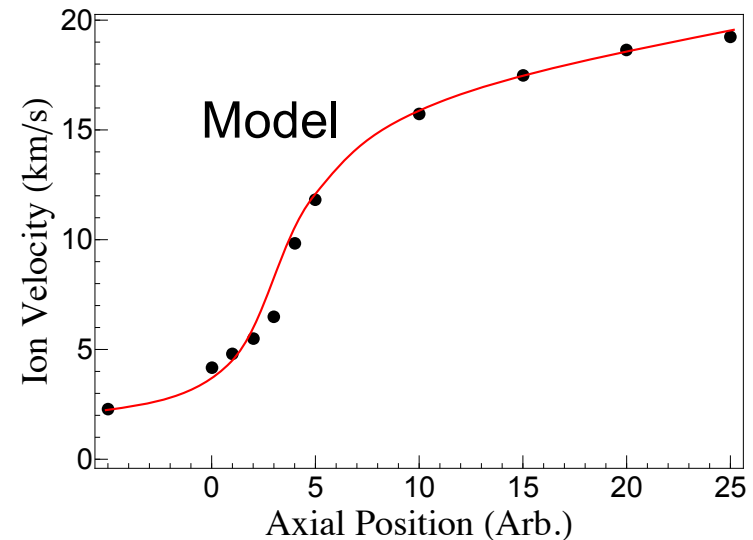


Closures for anomalous collision frequency: empirical estimate

- Yields excellent agreement with experimental results for a given operating condition
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- **To date, empirical models have not been predictive**



Iteration #3

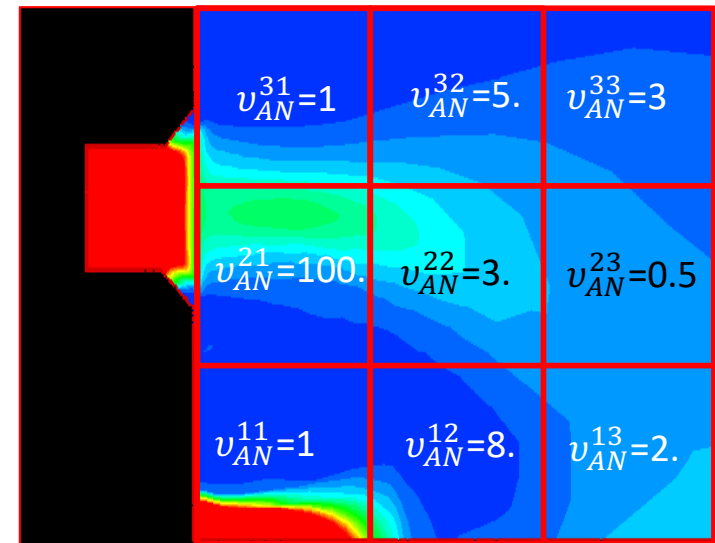




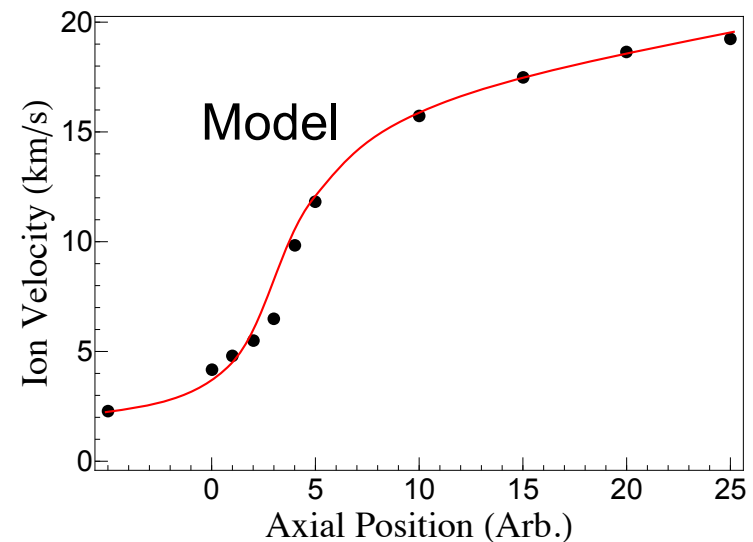
Closures for anomalous collision frequency: empirical estimate

- Yields excellent agreement with experimental results for a given operating condition
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- **To date, empirical models have not been predictive**

Hypothesis: we can use empirical data to generate a functional form, $v_{AN}(T_e, n_e, \dots)$

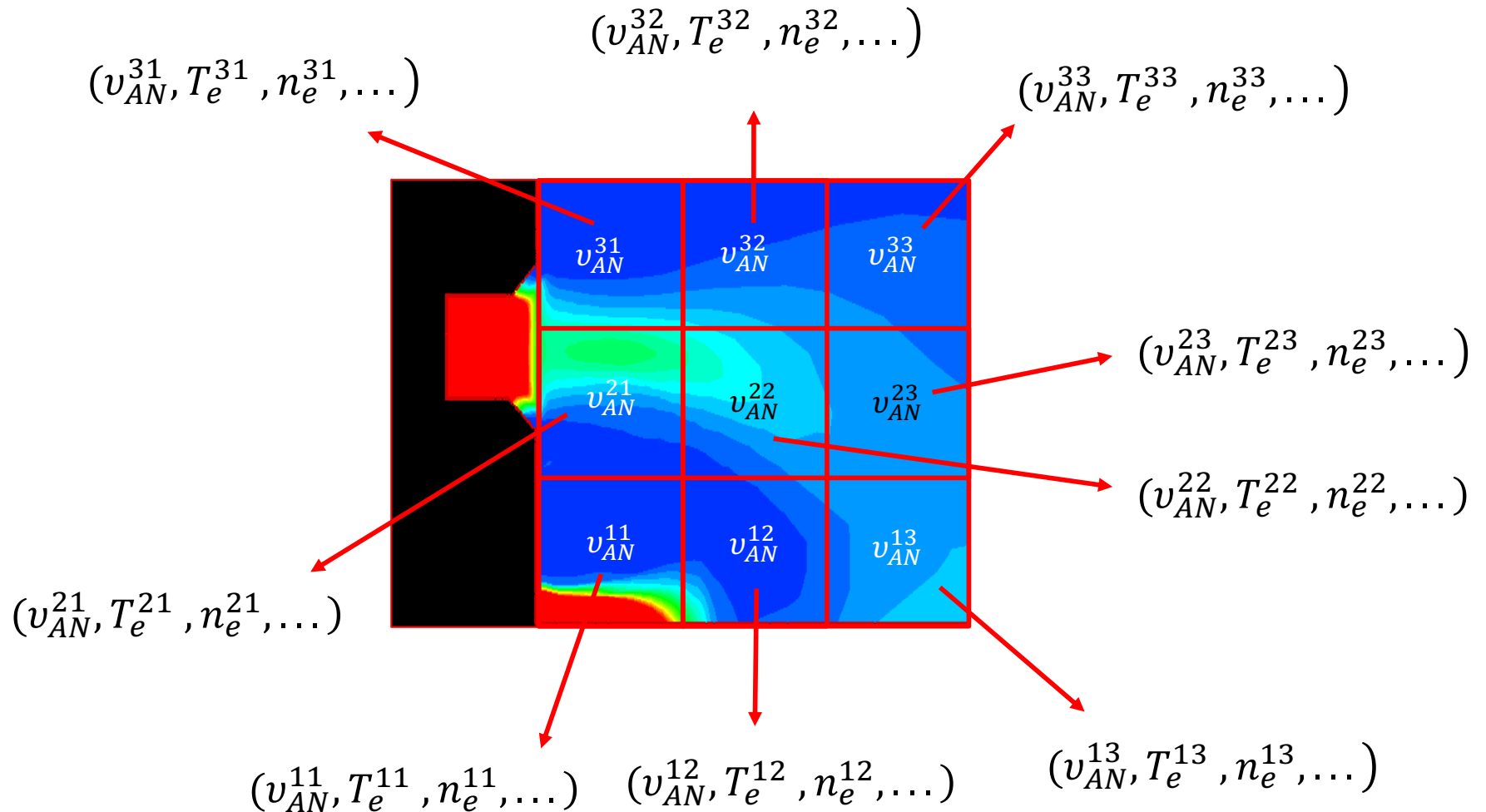


Iteration #3





Model from regression



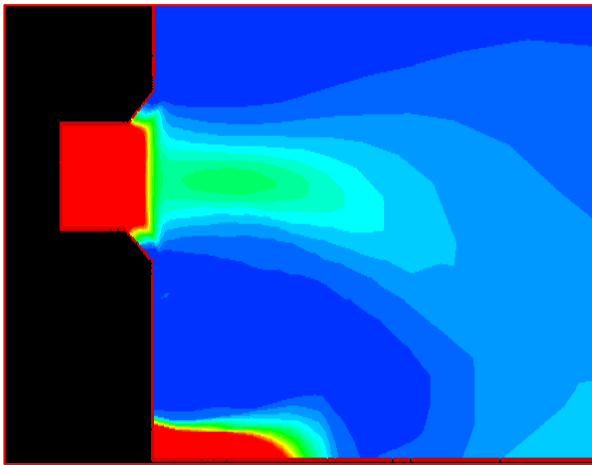
Each point from empirical model yields data point

Maybe there is a function, $v_{AN}(T_e, n_e, \dots)$, that fits the data



Regression with machine learning

Generate datasets from empirically validated codes



7 operating conditions from 4 different thrusters from Hall2De*: 700 data points

Prepare datasets for regression

Frequencies normalized by electron cyclotron frequency, ω_{ce}	
Ion plasma frequency	ω_{pi}
Classical electron collision frequency	f_e
Classical ion collision frequency	f_i
Velocities normalized by ion sound speed, c_s	
Ion axial velocity	u_i
Electron Hall velocity	v_{de}
Length scales normalized by electron Larmor radius, r_{ce}	
Debye length	λ_{de}
Pressure gradient length-scale	$L_p = P_e / \nabla P_e$
Ion drift velocity length-scale	$L_{ui} = u_i / \nabla u_i$

8 normalized lengthscales, velocities, and frequencies

Apply ML regression algorithm

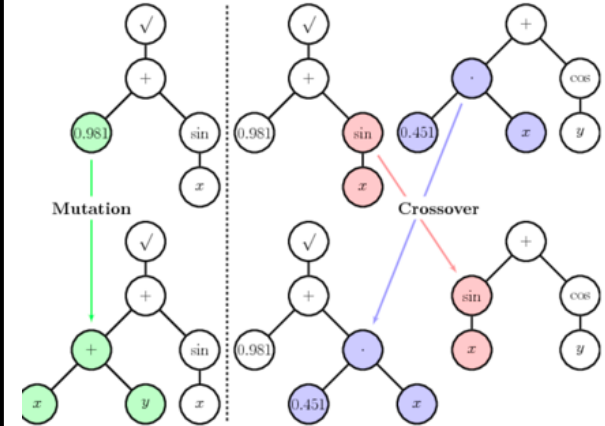
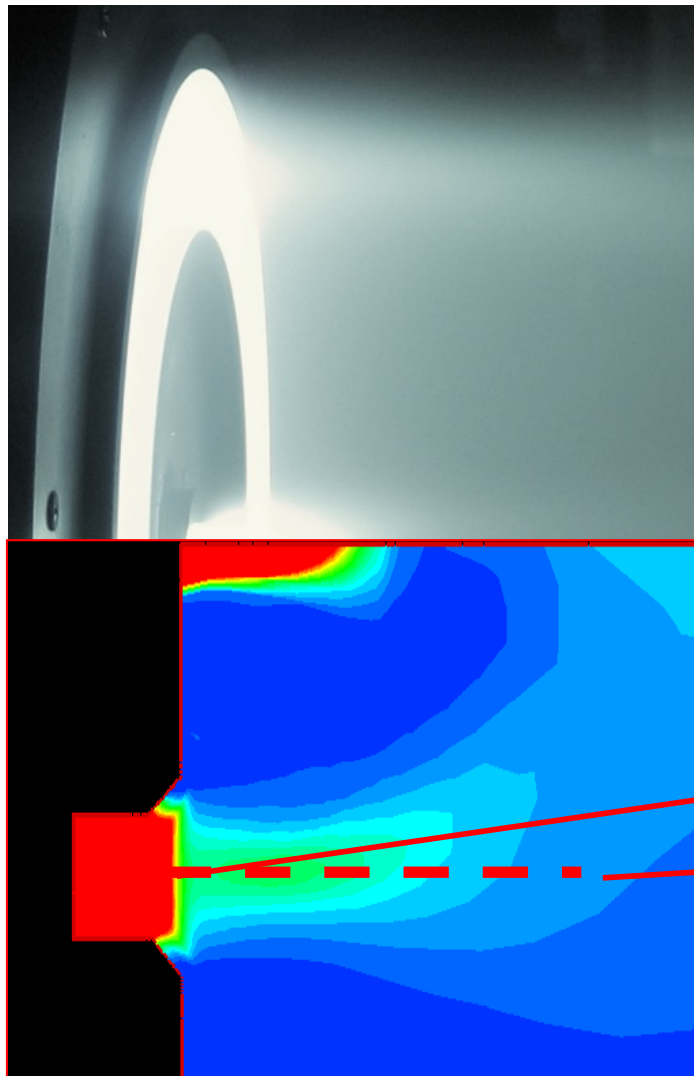


Image credit: M. Quade, Phys Rev. E. no 1. 2016

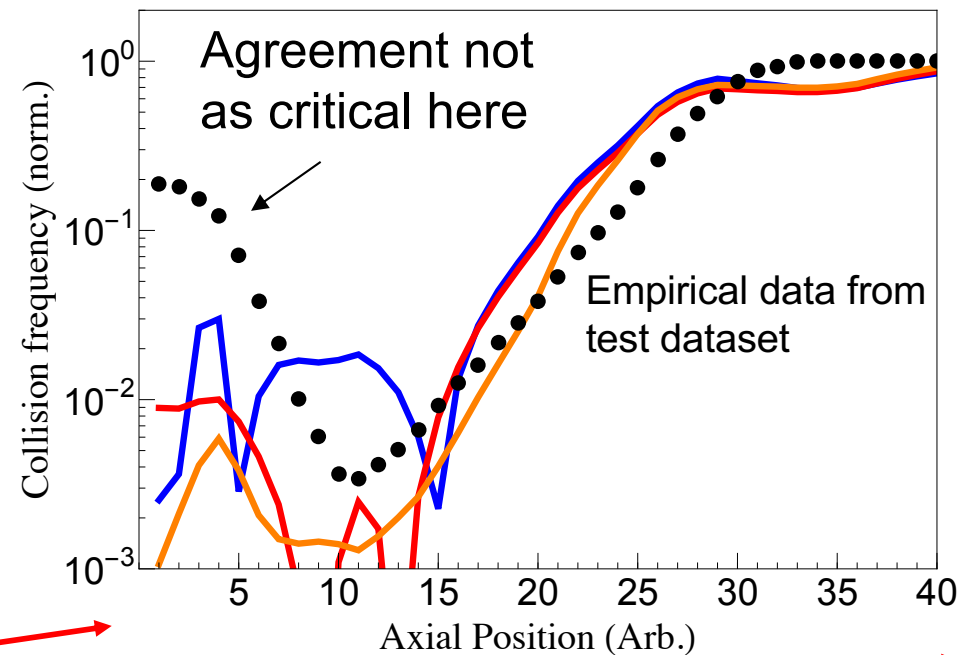
DataModeler symbolic regression from *Evolved Analytics*



Data-driven model predictions



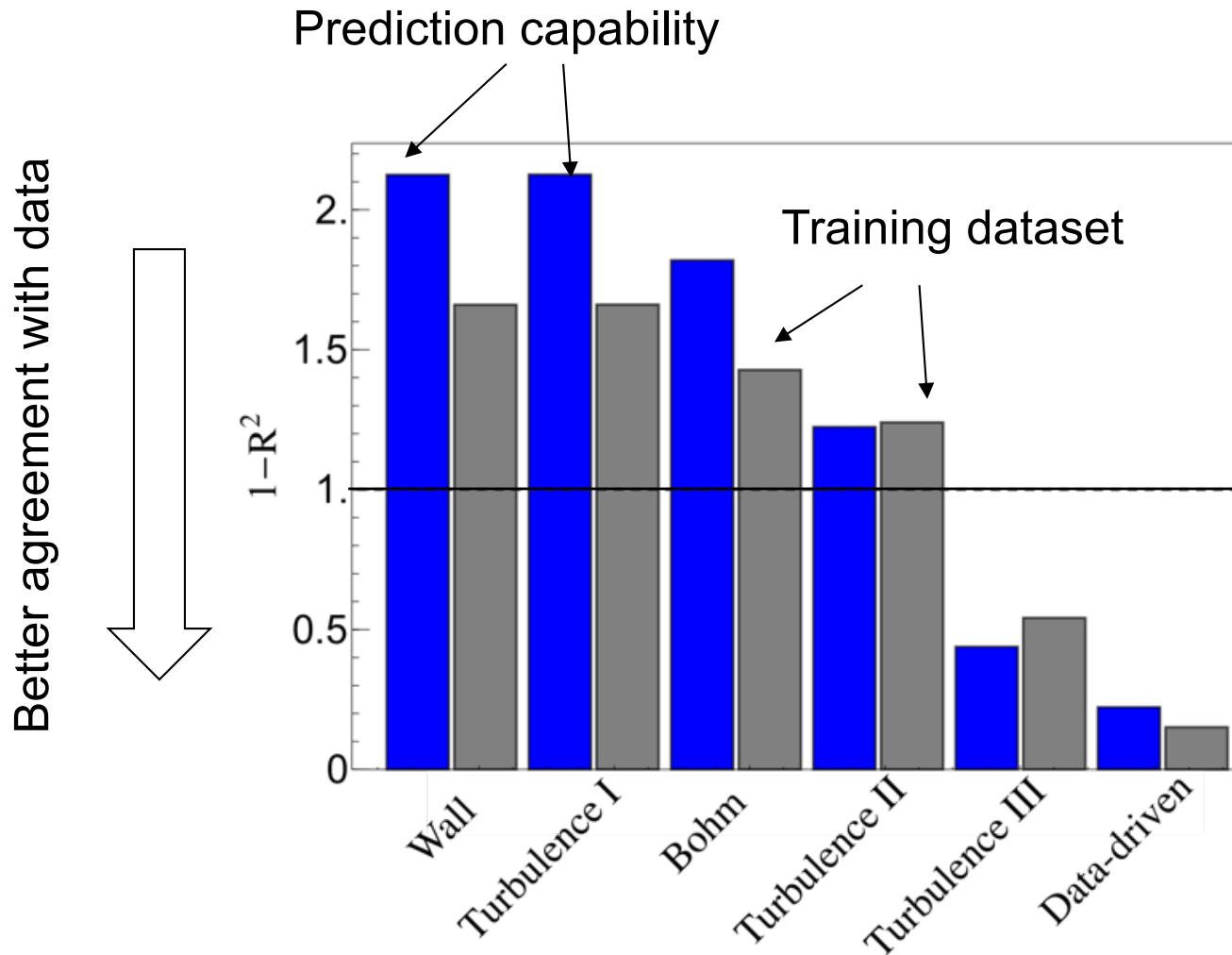
Model predictions for collision frequency



Note: model collision frequency independent of position



Comparison of ML to first-principles models



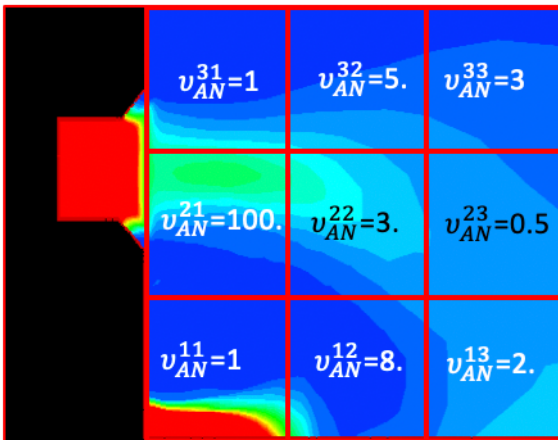
ML model has best correspondence and predictive capability of proposed closures

Practically, can this be used for predictive models?

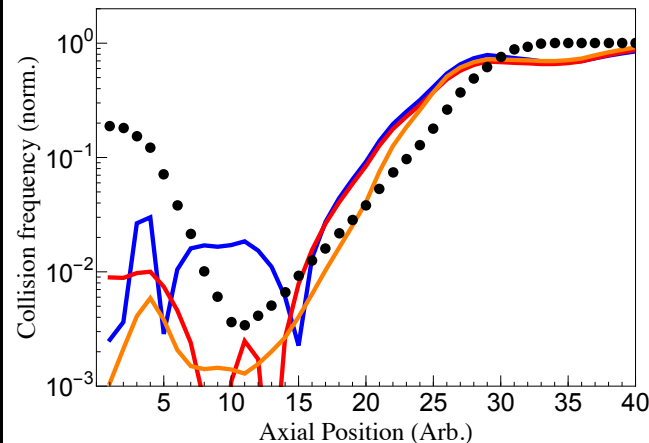


Summary of data-driven approach to closure

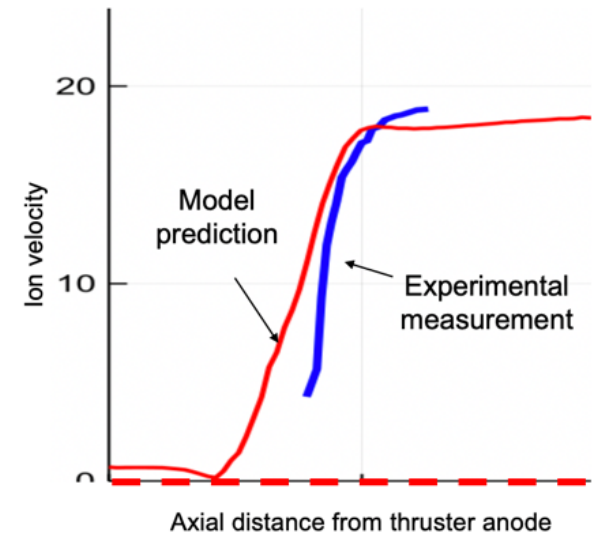
Use experimental data to measure $v_{AN}(T_e, n_e, \dots)$ over several operating conditions



Regress data to build empirical closure model



Implement self-consistently into model



- Data-driven approach yields closures that better match experimental measurements of collision frequency
- The formulations are symbolic and can be incorporated into self-consistent models
- Not clear about the quality of predictions or extensibility outside datasets.



Summary

- Electric propulsion is a highly enabling technology for space exploration
- The Hall effect thruster is one of the most popular and successful forms of electric propulsion
- There are still outstanding and operationally critical open questions about Hall thruster operation. These mostly relate to the lack of fully predictive models
- The problem of non-classical electron transport must be solved (or bounded) to develop predictive models.
- We are exploring both physics-based and data-driven approaches.
- Results will have direct implications for future qualification and development efforts



Acknowledgments



- Zach Brown (PhD Candidate, NSF Fellow)
- Dr. Ethan Dale
- Thomas Marks (PhD Candidate)

