

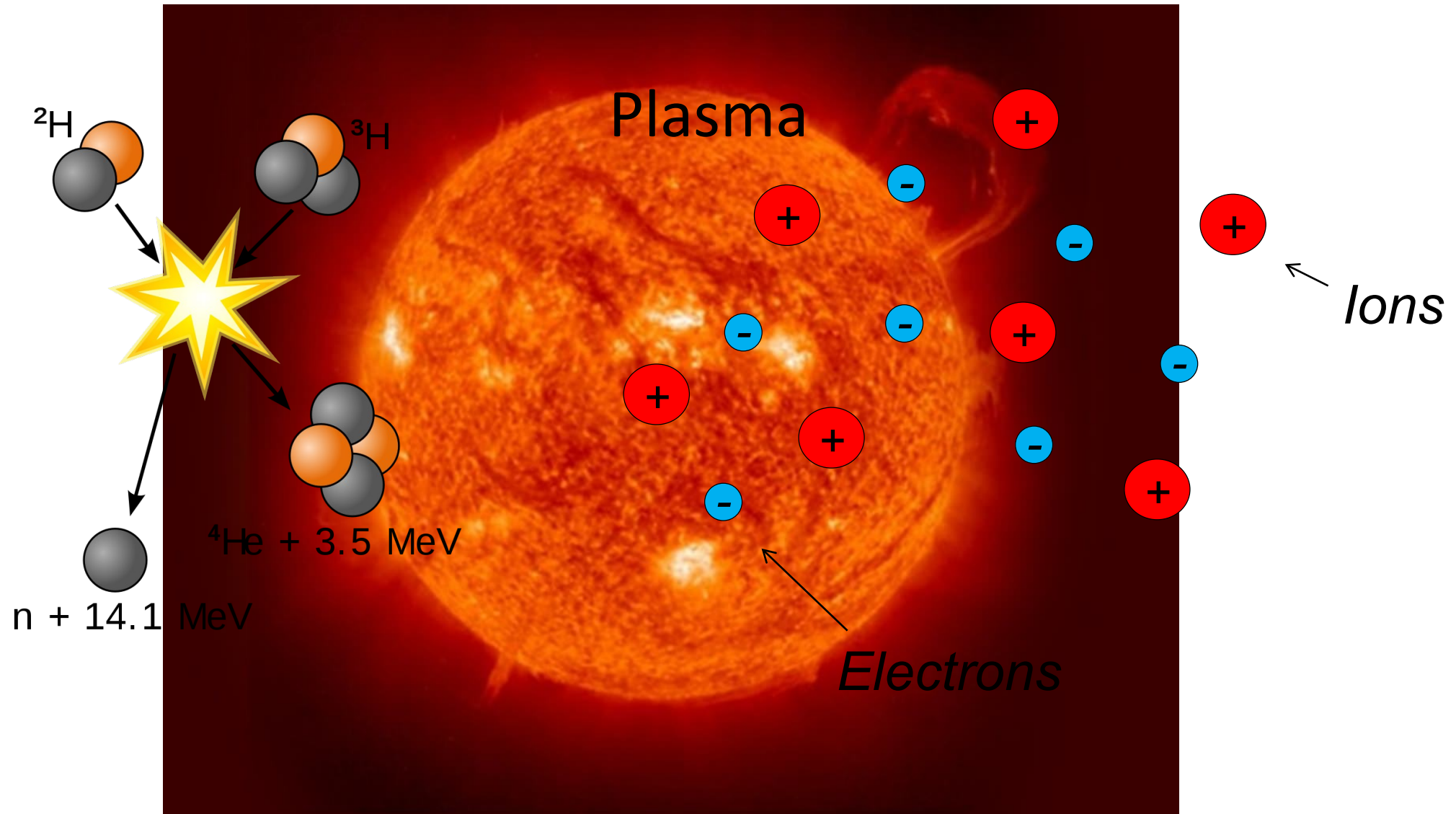
Collective Thomson Scattering Diagnostic on Wendelstein 7-X

Ivana Abramovic

27/01/2020

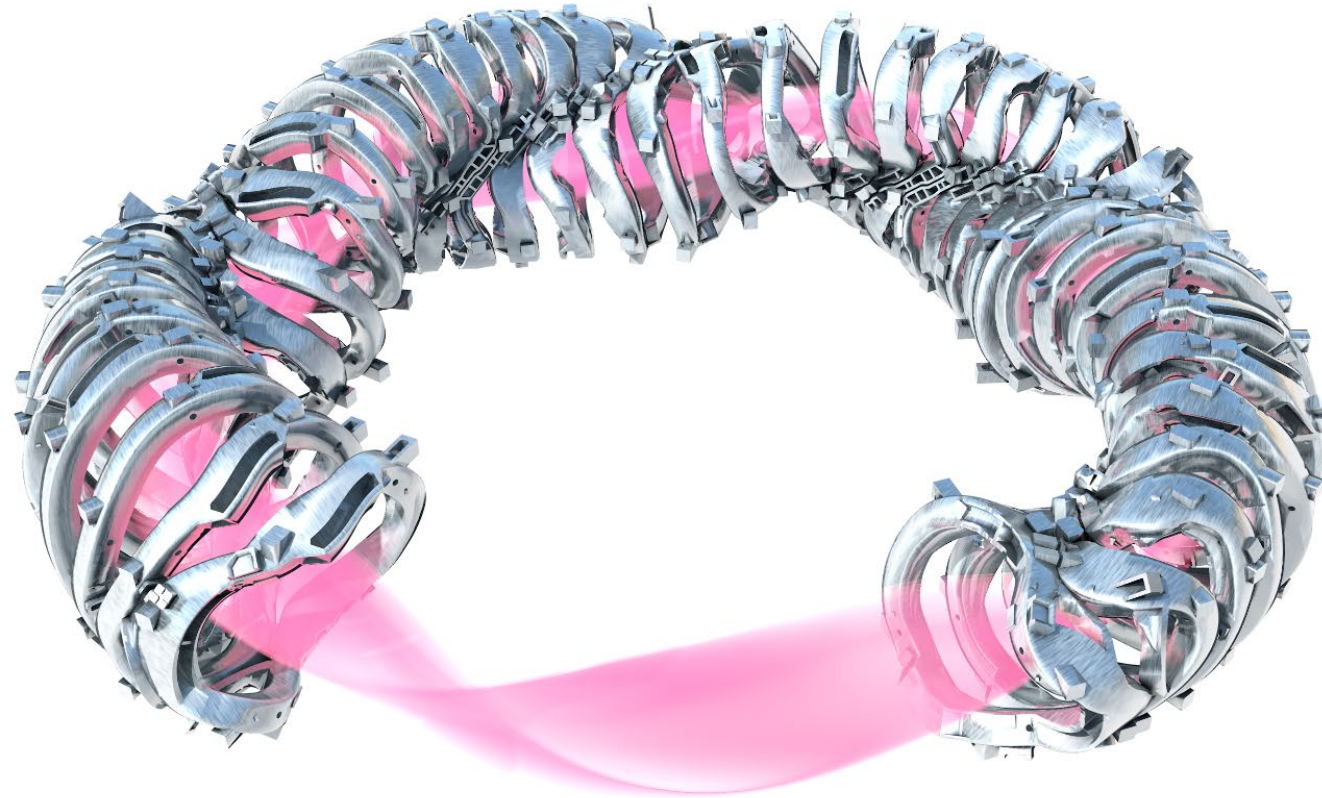
Nuclear Fusion

- **Nuclear Fusion**
- How do we do it?
- Wendelstein 7 - X
- Collective Thomson Scattering
- The Forward Problem
- The Inverse Problem
- Bayesian Inference and Neural Networks
- First Results
- Additional Work
- Summary



Bringing the Sun to Earth - How do we do it?

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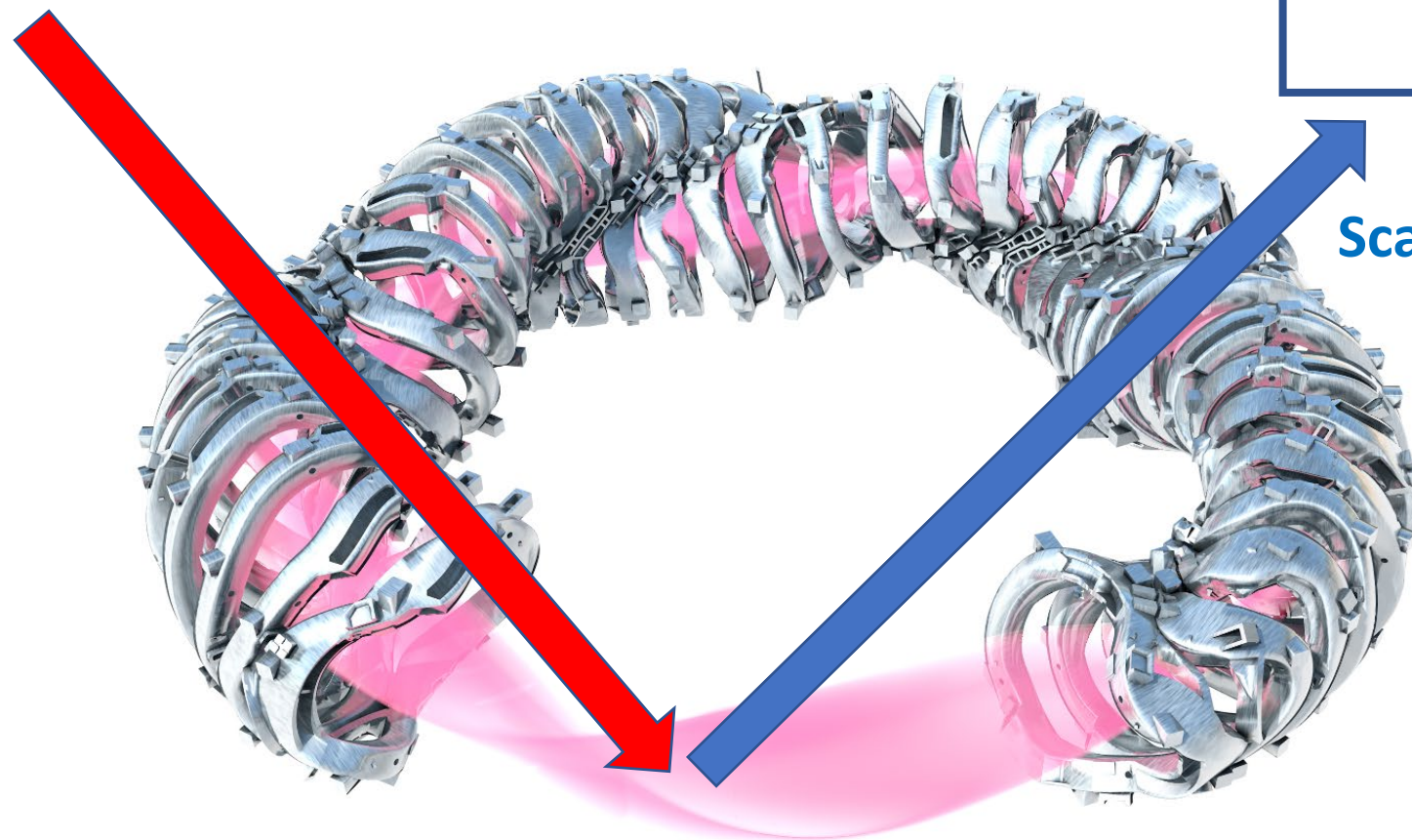


Collective Thomson Scattering (CTS)

Incident wave

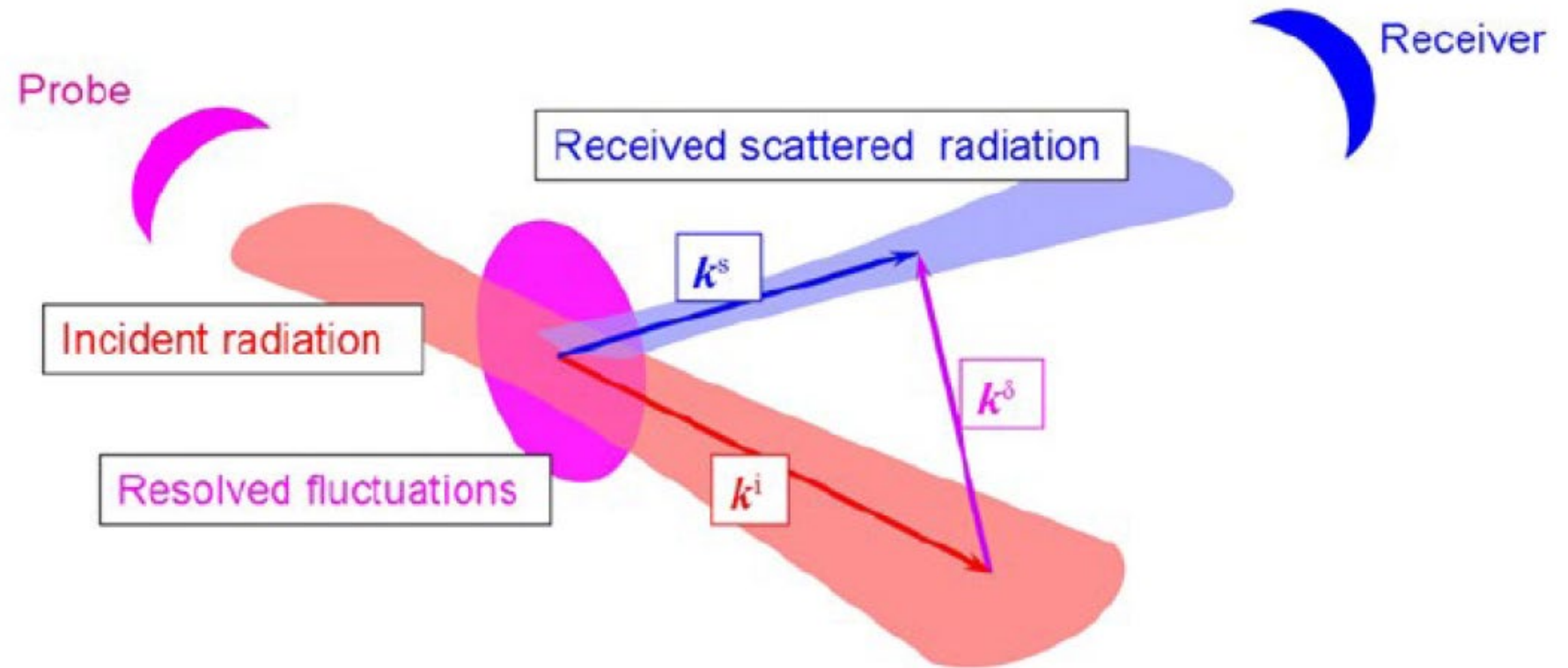
Detector

Scattered wave



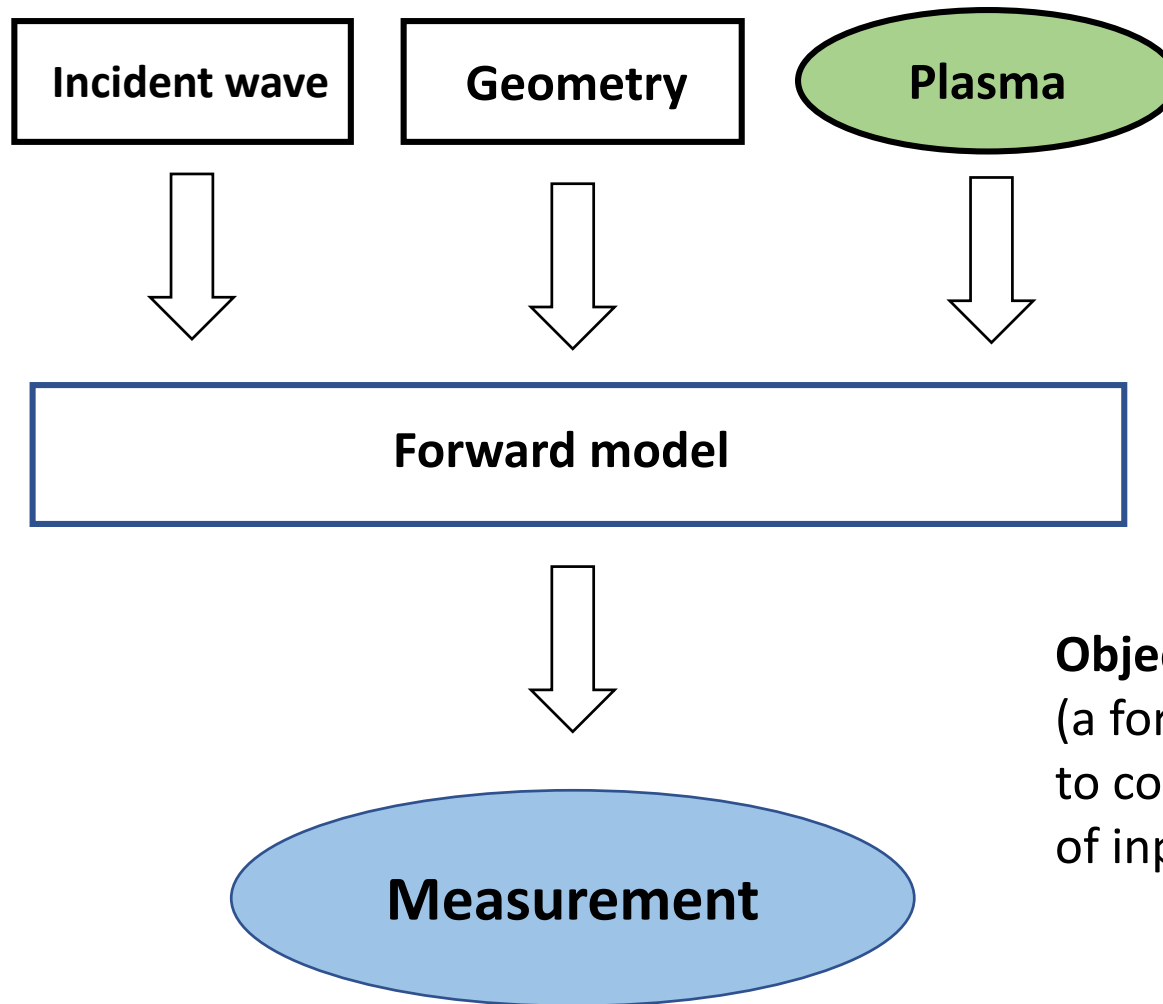
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Collective Thomson Scattering (CTS)



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The Forward Problem



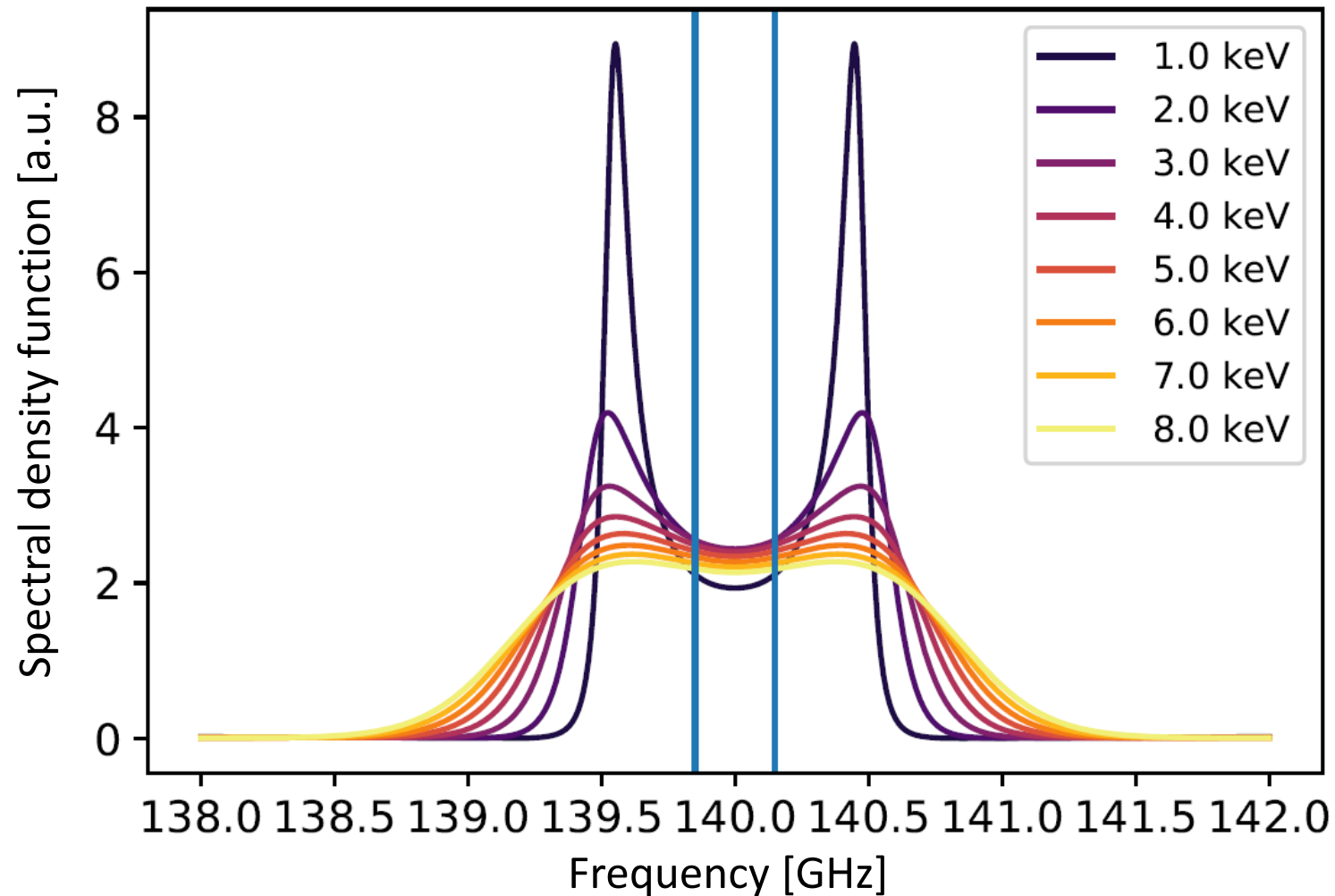
Objective: Development of a computer code (a forward model), based on a theoretical model, to compute measurement outcomes for sets of input parameters



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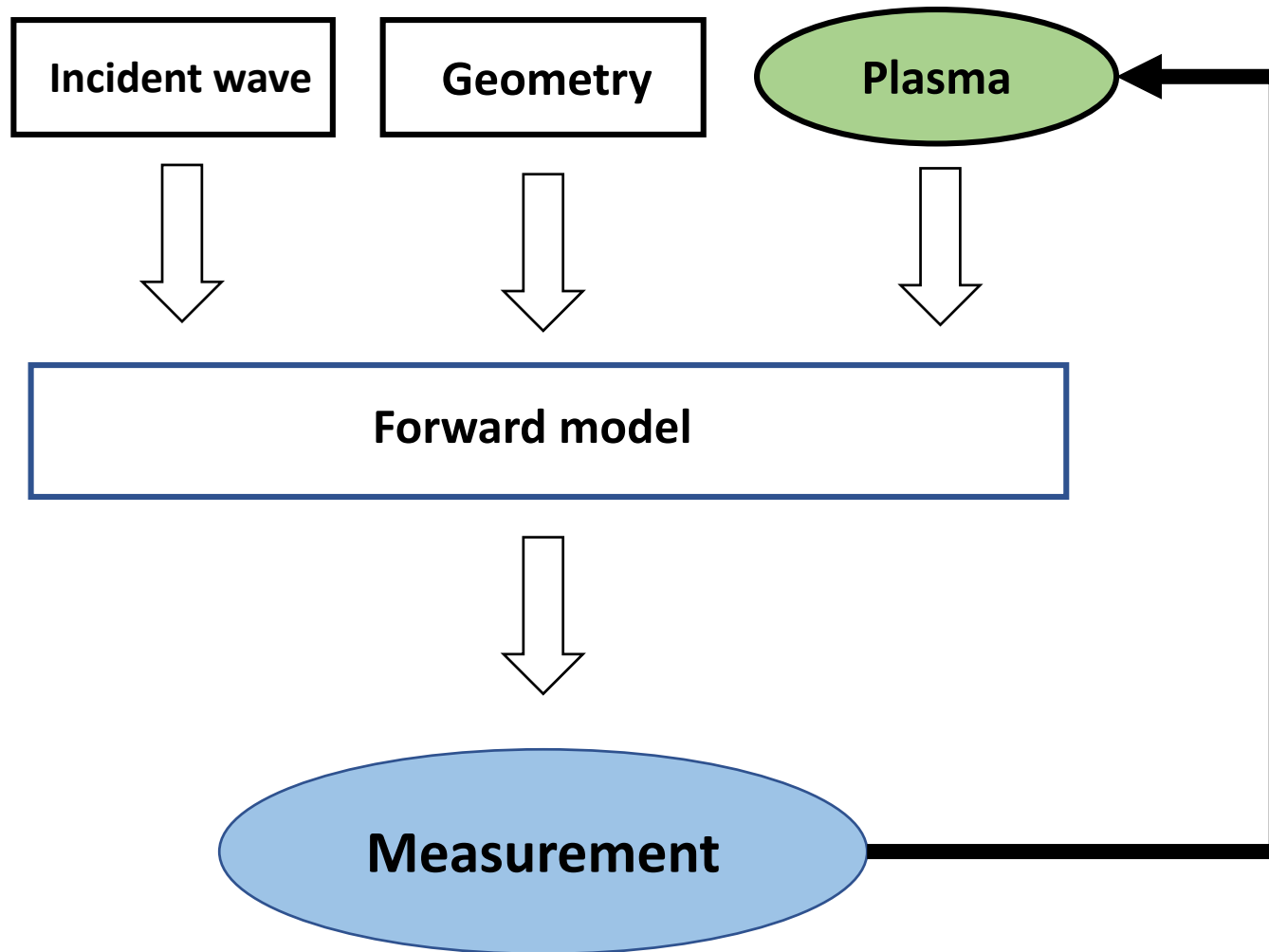
The Forward Problem

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The shape of the curve changes as the input ion temperature is changed

The Inverse Problem



Objective: Use the developed forward model to solve the inverse problem by means of Bayesian inference and machine learning



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Bayesian Inference

Niki Lauda or James Hunt?



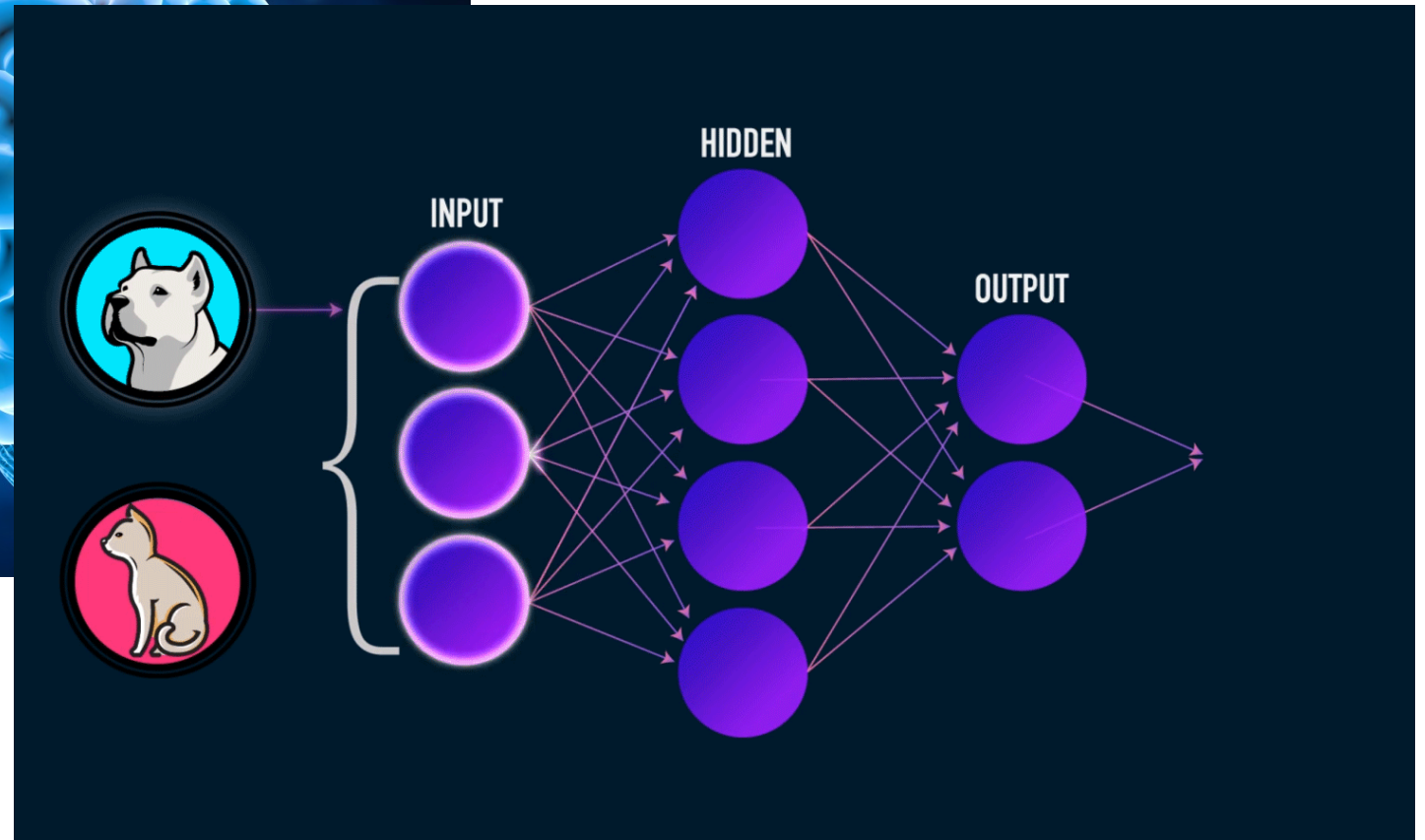
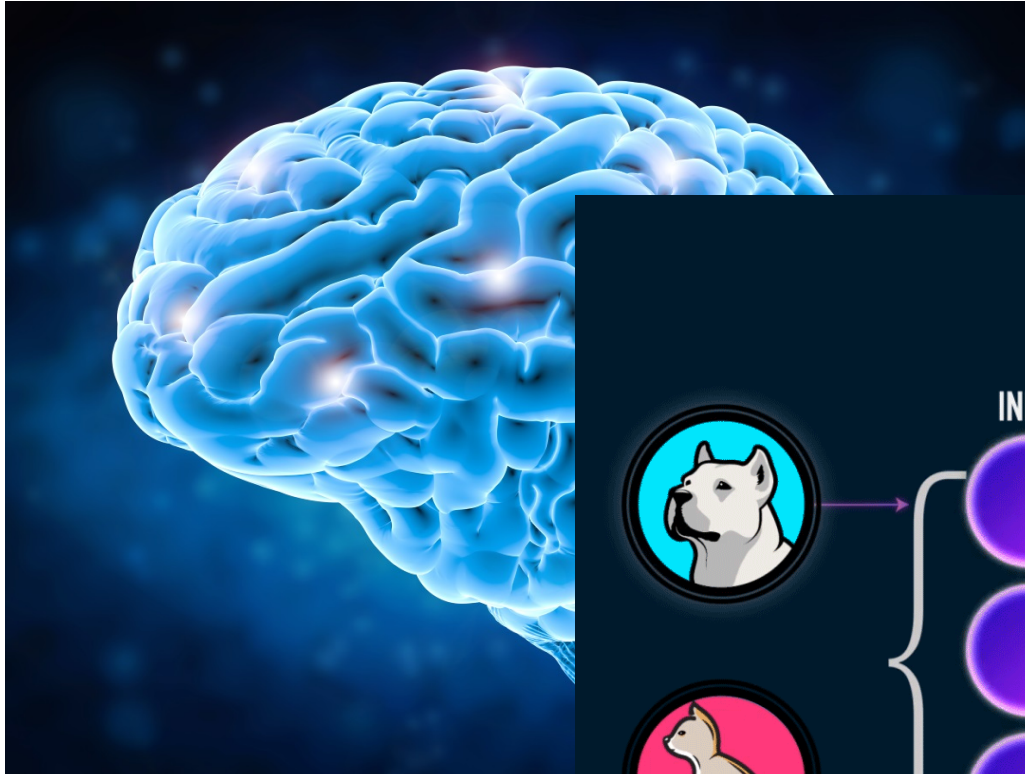
Minerva – Bayesian scientific framework

- Integration of the forward model
- Bayesian inference
- Access to data from other diagnostics

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Image: espn.co.uk

Artificial Neural Networks

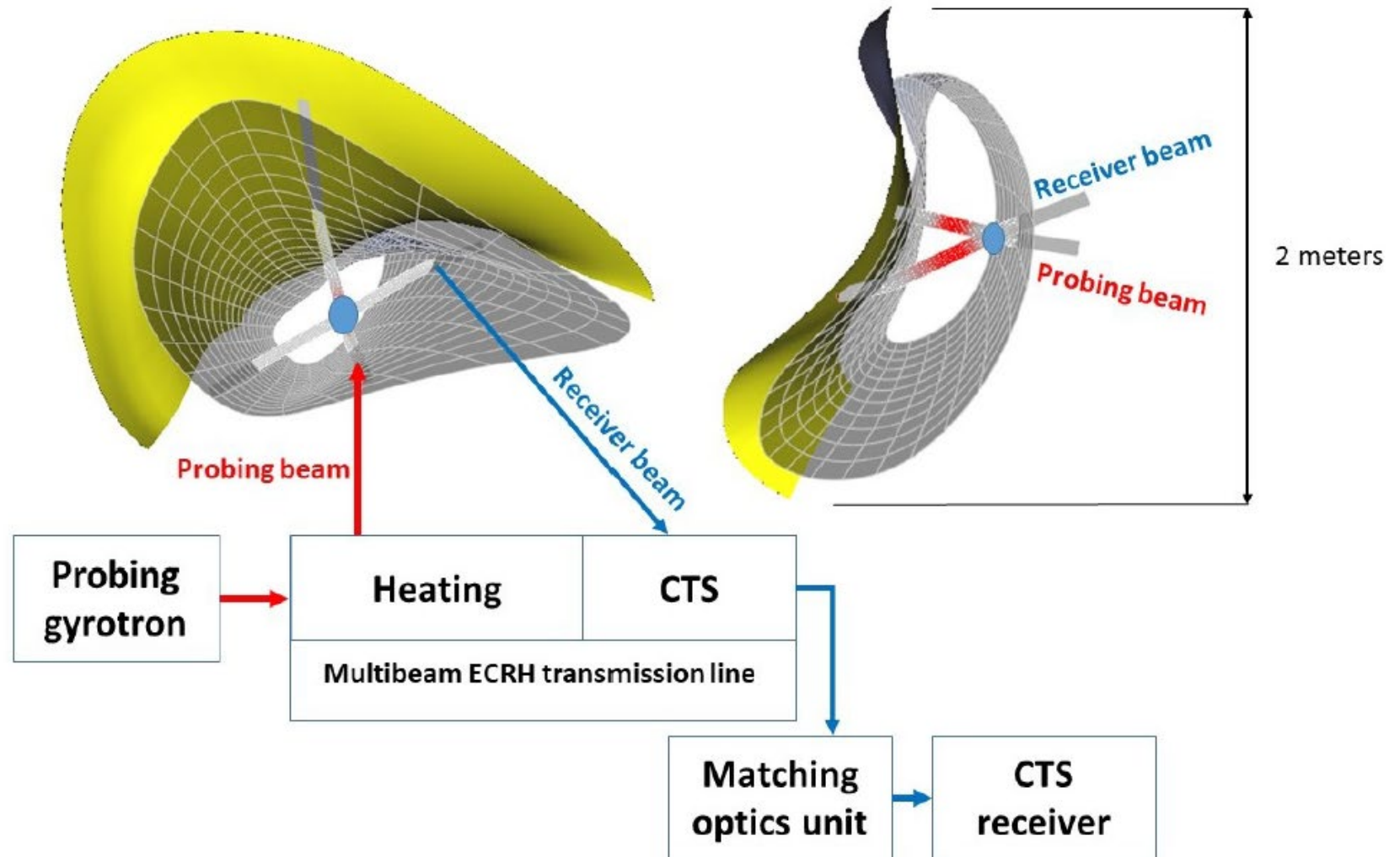


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Image:
Shutterstock/
Phonlamai Photo

Image: towardsdatascience.com

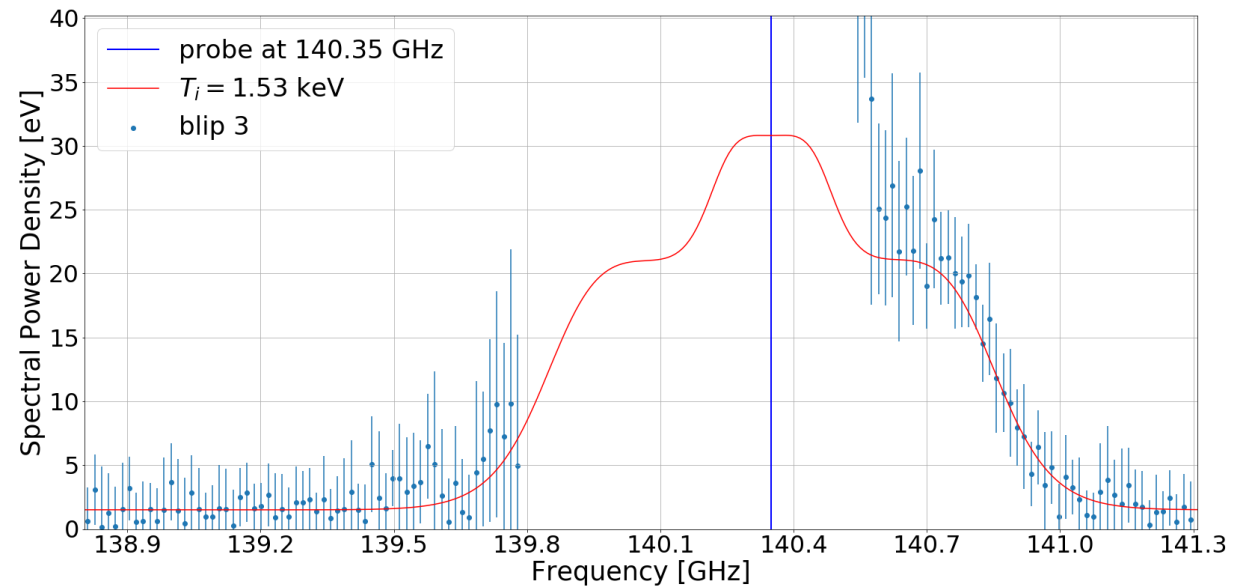
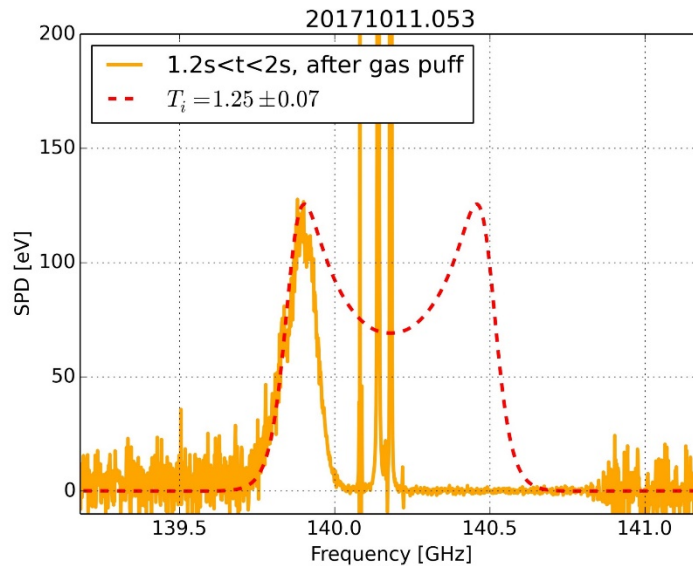
First Experimental Results



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First Experimental Results - Bean

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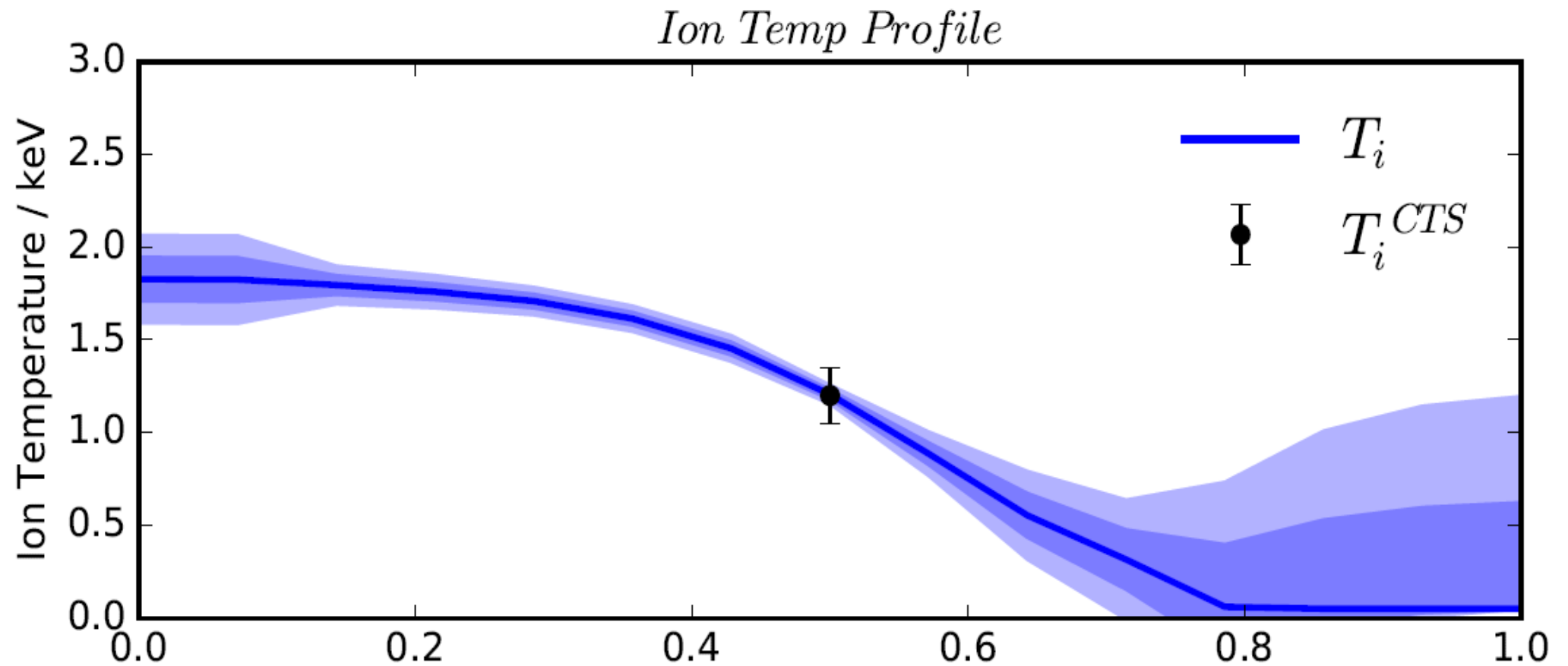


Objective: Analyze experimental data using the forward-model-based Bayesian inference in the Minerva framework



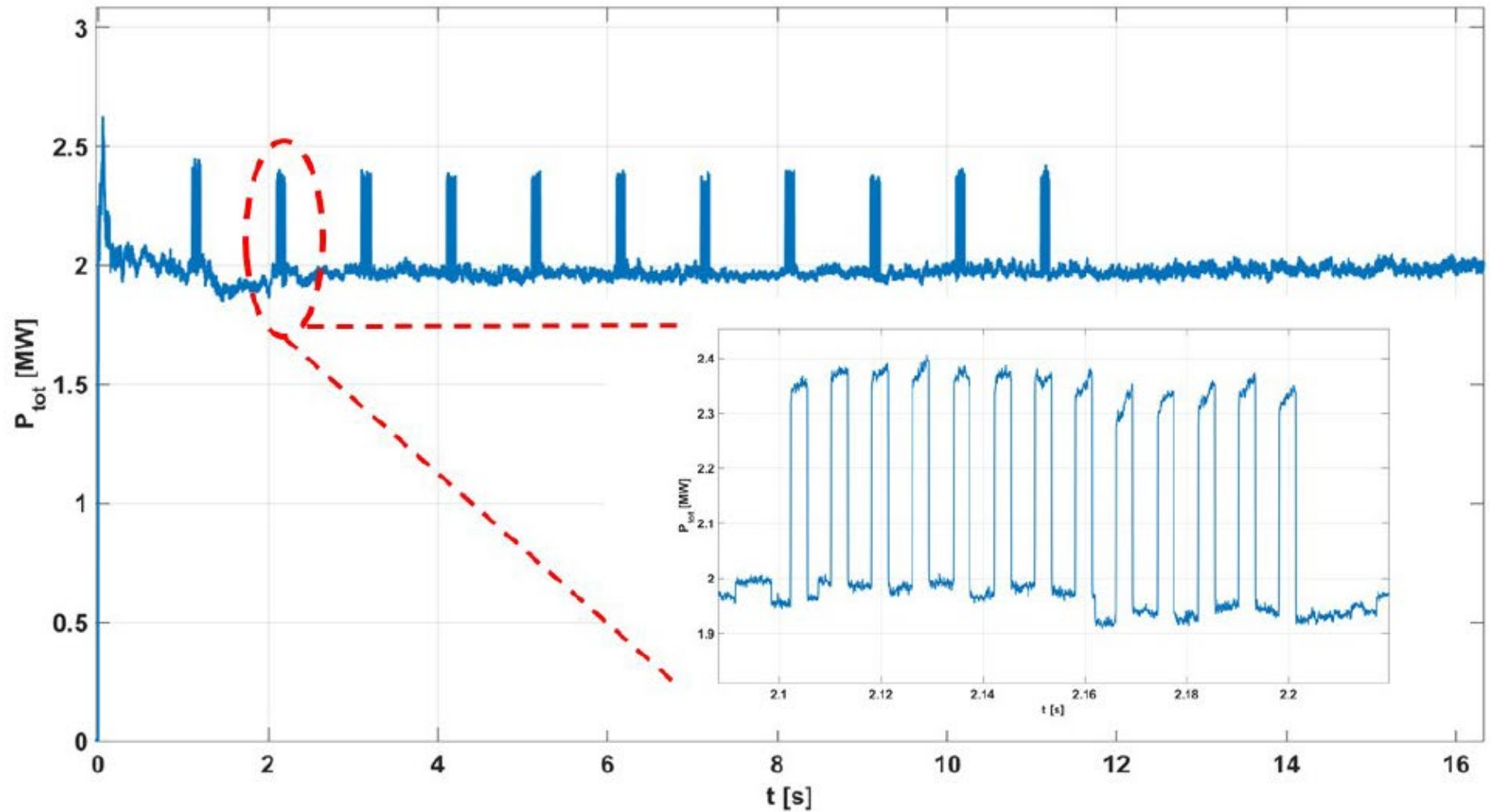
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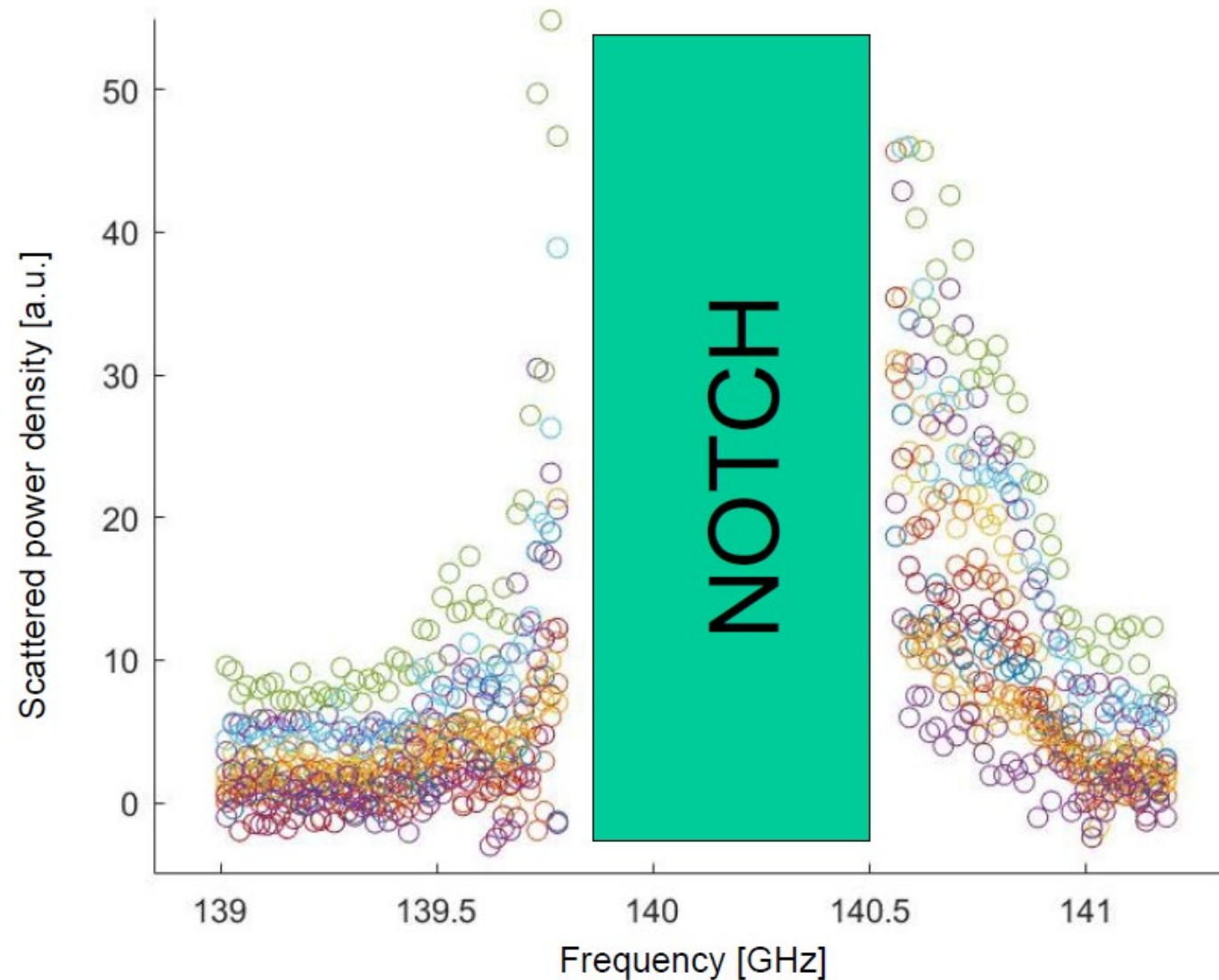


First Experimental Results - Triangular

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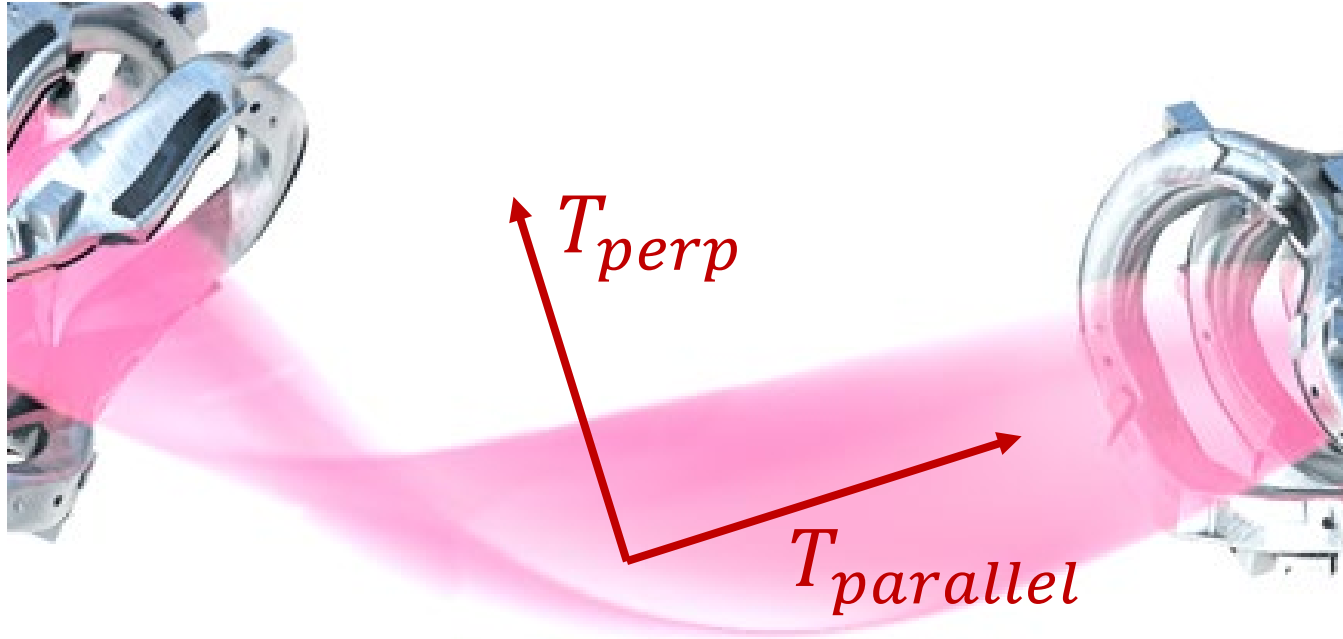


First Experimental Results - Triangular



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Last but not least ...



Objective: Extend the forward model to calculate CTS in a two temperature plasma.



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Summary

- A collective Thomson scattering diagnostic was developed and installed on Wendelstein 7-X
- A forward model was developed allowing calculations of the measurement result given the experimental conditions
- The inverse problem of extracting the desired parameter value from measurements was tackled in two ways:

Bayesian inference

machine learning

- The forward model and the inference methods were used to analyze the first CTS measurements obtained on this device
- The forward model was extended to enable calculations in plasmas with two temperatures

- Nuclear Fusion

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- Collective Thomson
Scattering

- The Forward
Problem

- The Inverse
Problem

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and Neural
Networks

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