# A Study of the Required Balmer-Lines for Integrated Data Analysis Systems in Tokamak Divertors

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#### Introduction

An integrated data analysis (**IDA**) system, developed to study the divertor region of **Nuclear Fusion tokamaks** [1], has been used to investigate the information carried by different combinations of Balmer lines.

- Spectral lines have complicated emission models, comprised of excitation and recombination emission (already simplified by provisionally ignoring plasma-molecule interactions)
- Challenging to decipher what information is held by different spectral line combinations in the IDA
- Research performed to interrogate the information held by different Balmer-lines (n  $\rightarrow$  2 Deuterium transitions) and so inform the lines required to be used in the IDA going forward

### **Motivation**

The method for accessing the information provided by a certain combination of Balmer-lines is outlined in figure 1.

- ► SOLPS [3] used to predict many possible plasma conditions found in the MAST-U divertor
- Each combination of *true* plasma conditions used to simulate a data set of expected emissivities for various Balmer-lines (3 < n < 7)
- ► IDA permitted to use only a certain combination of Balmer-lines for it's inference
- ► IDA resultant probability distribution for the underlying plasma conditions compared to the *true* plasma conditions used to simulate the data set
- Percentage difference between the two used to classify Figure 1: Flowchart of general method for accessing informahow much information that combination of lines tion available to the IDA from Balmer-lines. contained for this region of plasma conditions ▶ Map, over parameter space, of percentage difference (between IDA and *true* plasma parameters) created for each line combination

## **Methods**



IDA is desired to describe the **full 2D poloidal cross section** of the divertor.

- Described in terms of:
  - $\blacktriangleright$  Electron temperature,  $T_e$
- $\blacktriangleright$  Electron density,  $n_e$
- $\blacktriangleright$  Neutral density,  $n_0$
- Used to study the onset of detachment (which can drastically) reduce the heat flux onto the tokamak's plasma-facing wall)
- ► The MAST-U tokamak is the focus of this research (due to it's focus on divertor physics via multiple possible divertor configurations)
- ► IDA incorporates:
  - ► Langmuir probe (many)
  - ► Thomson Scattering
  - Multiple, wavelength-filtered, camera diagnostic (MWI)
- Only the MWI offers a view of the entire divertor region
- $\blacktriangleright$  Balmer-line ( $n \rightarrow 2$  transitions) emission from excited hydrogenic species is available to the MWI and these are known to provide information on the deuterium-dominated divertor plasma conditions
- Maximising the information provided by these lines is crucial to the success of the IDA
- ▶ What information is available to the IDA from a certain combination of Balmer-lines?

# **IDA Structure**

IDA utilises Bayesian inference to combine the available diagnostics. Solutions to the underlying plasma parameters may be found by

- Map split into recombination and excitation majority plasma conditions and investigated for different line combinations
- > Amount of information, for a certain plasma condition, provided by a line combination is found by comparison between IDA inferred parameters and true parameters.

## Results

- Inferred Log Electron Temperature 9.5e+19 -Prior Recombination Limited 3.5e+19 -Majorit 10 1.3e+19 -Excitation 4.7e+18 -Majority 1.7e+18 |MAP-true| % 10<sup>1</sup> 10<sup>0</sup> Electron Temperature, Te[eV] true
- Figure 2: IDA inferred MAP estimate percentage difference to the *true* parameter value for the  $ln(T_e)$  parameter. X-Y axis are the *true* plasma conditions from which the data was simulated and the inference performed for subsequent



- Plotted in terms of their true electron temperature and total hydrogen density
  - (linked to  $n_e$  and  $n_0$  via a neutral fraction to temperature) relation)
- ► IDA inferred maximum a posteriori (MAP) estimated value for each parameter compared to the *true* parameter value and percentage difference found
- $\blacktriangleright$  Result for the  $T_e$  parameter, with Balmer-lines  $n = \{3..7\}$  used by the IDA, is shown in figure 2
- $\triangleright$  Coloured regions have a percentage difference of < 30%
- Certain parameter combinations excluded by prior (these conditions would not be expected in the divertor plasma)
- Repeated for multiple two Balmer-line combinations and shown in figure 3
- Percentage of plasma conditions that provide an inferred MAP value within 30% of *true* plasma parameter value (non-white regions in figure 2) calculated
- maximising the posterior distribution
- > Posterior distribution asks: what is the probability of the plasma having a certain combination of parameters given that a certain data set has been measured?
- Posterior probability for one combination of plasma parameters  $\underline{\theta} = \{T_e, n_e, n_0\}$  is given by,

 $P(\underline{\theta}|\underline{\mathcal{D}}) \propto P(\underline{\mathcal{D}}|\underline{\theta})P(\underline{\theta}),$ 

(1)

- $\triangleright \mathcal{D}$  is the vector of data measurements  $\rightarrow$  for the MWI diagnostic corresponds to the different Balmer-line emissivities
- $\triangleright P(\underline{\theta})$  represents our prior belief in the plasma parameters: Would this combination of parameters be expected to be found in the divertor?
- Likelihood probability,  $P(\underline{\mathcal{D}}|\underline{\theta})$ , found by forward modelling of the expected Balmer-line emissivities for the certain combination of parameters and comparing them to the measured data
- $\blacktriangleright$  Emissivity for the transition  $n \rightarrow 2$  can be modelled by,

 $\varepsilon_{n \to 2} = n_e^2 PEC_{n \to 2}^{rec.}(T_e, n_e) + n_e n_0 PEC_{n \to 2}^{exc.}(T_e, n_e),$ (2)

- $\blacktriangleright$  *PEC<sup>rec.</sup>* and *PEC<sup>exc.</sup>* are the photoemissivity coefficients for recombination and excitation respectively
- $\blacktriangleright$  Coefficients, provided by ADAS [2], have complex dependence on  $T_e$  and  $n_e$
- Hydrogenic plasma states (that leads to Balmer-line emission) occurs from either excitation or recombination processes, however, only total emission is detected by the MWI
- ► MWI diagnostic represents an ill-posed problem:
- ► Many different plasma parameter combinations (representing a large region of plasma conditions) can give the same total emission and so the probability of which were the *true* plasma parameters is difficult to fix

Performed separately for the recombination-majority and excitation-majority regions

comparison. Balmer-line combination  $D_{\alpha}$ ,  $D_{\beta}$ ,  $D_{\gamma}$ ,  $D_{\delta}$  and  $D_{\varepsilon}$  used by the IDA.



Figure 3: Effect of two different Balmer-lines on the IDA inferred parameter performance - as percentage of plasma combinations that could have MAP values inferred to within 30% of *true* parameter value for each parameter - across different plasma regions. X-Y axis represent the two Balmer-lines used by the IDA in the inferrence. Squares and triangles show results separately for the recombination-majority and excitation-majority regions respectively. Arrows represent general trend.

Information available in inferred regions separately considered for different line combinations.

#### Discussion

Line combinations where the measured emission can be explained by a limited region of different plasma conditions corresponds to a lot of information in that region.

## References

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- Figure 2 shows that a combination of all lines  $D_{\alpha}..D_{\epsilon}$  contains a lot of information in the recombination-majority region and a good amount of information for  $T_e$  in the excitation-majority region.
- $\triangleright$  Figure 3 shows that no two line combination contains significant information for  $n_0$ . In the excitation dominated region,  $D_{\alpha}$  is minimally required to provide good information for  $T_e$  and  $n_e$  and it is best paired with a higher-n Balmer-line. The higher-n Balmer-line will also aid information for the electron density in the excitation-majority region.
- ▶ This result is likely due to the fact the emission, shown in equation 2, is frequently assumed by the IDA to arise from all recombination emission in a recombination majority region (vice versa for excitation) rather than from a balance of the two. n < 5 Balmer-lines have a greater relative excitation contribution to their emission than for n > 5Balmer-lines [4] and so the provision of a line that has more excitation emission in a recombination-majority environment prevents the assumption of all emission being from recombination and so increases the information held on  $T_e$  and  $n_e$  (and vice-versa for the excitation-majority region).
- $\blacktriangleright$  This reliance on the  $D_{\alpha}$  line is potentially problematic since it is known that molecular effects can impact the low-n Balmer-line emission in these plasma conditions [5]. Consequently, the emission model used in equation 2 must be adapted to include this affect.
- $\triangleright$  The  $D_{\alpha}$  line is required for good inference within the IDA and so molecular contributions will have to be considered in the IDA's MWI emissivity model going forward.

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