



# **Taking predict-first to the next level: opportunities, challenges and limits**

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## **Why we love predict-first …**

- Predict-first can be a powerful tool in the control room
	- To optimize the experimental time
	- To support decision making (including unexpected failures)

Will show an example of successful application of predict-first:

achievement of sustained q<sub>min</sub> with early EC heating and CD



## **… and what we should be careful about**

- In order to be successful it needs:
	- A *whole device*, comprehensive, time-dependent model (equilibrium, transport, MHD, fast ions)
	- Verified and validated physics models from high to low fidelity

### **We are not there yet …**

Will discuss limits of predictive models, challenges in experimental preparation and identify opportunities for improvement.



## **When things go well**

### Demonstrated sustained  $q_{min}$  with early EC heating and CD

– 100% success in use of resources with one shot planned and executed.



## **"Predict First" EC and NBI trajectory achieved high** b **access with no high gain feedback, obtaining smooth, elevated, sustained qmin with little MHD activity**





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#### **Significant Alfvenic activity present in higher q<sub>min</sub> plasma**





Due to the high(er) NBI power already in the ramp-up phase

## **AE activity triggered by NBI at low plasma current**

•Linear AE stability performed with TRANSP + kick model [M. Podesta'] •Test:

•Use NBI waveform from #175286 keeping same profiles as in reference #172538

•*How much does AE drive change?*

•#175286 has ~1MW additional NB power after 1.2 sec •Enough to destabilize several AEs with respect to reference shot



DIII-D #172538

## **Our success resulted from careful step-forward planning**

Start with a well diagnosed case Assessment of predictive models Make a *small* change to the reference that can be predicted within the limit of the models Run a *feedforward* experiment to validate simulation **Post-process analysis and validation: assess what is missing, what could have been done better**



## **Our success resulted from careful step-forward planning**





# Goal: modify the q<sub>min</sub> trajectory to sustain flat q profile

Two reference discharges with feedback on  $\beta_N$ :

- $\Rightarrow$  q profile relaxes to monotonic in the stationary phase
- $\Rightarrow$  MHD in the flattop phase





**improve q<sub>min</sub> trajectory and MHD?** 

9/17/18 Francesca M. Poli **11**

## **Our success resulted from careful step-forward planning**





## **Since the goal is to modify the q<sub>min</sub> trajectory, the validation focusses on the q profile**

- **Step 1**: evolve free-boundary magnetic equilibrium with prescribed  $n_e$ ,  $n_C$ ,  $T_e$ ,  $T_i$ ,  $v_\phi$ , profiles
- Expect larger uncertainties in the early ramp-up, at low current (no good profile mapping available)
- => but initial condition important for full discharge predictions
- Assuming input profiles are 'good', differences due mostly to bootstrap current and neutral beam model
	- => initial condition important for full discharge predictions





## **Since the goal is to modify the q<sub>min</sub> trajectory, the validation focuses on the q profile**

**Step2**: evolve free-boundary magnetic equilibrium with prescribed  $n_e$ ,  $n_c$ ,  $v_\phi$ , but predict  $T_e$ ,  $T_i$  with GLF23 inside the pedestal

– Our target is to change EC, which affects the electron temperature





## **Predictions should include the pedestal region**

**PROBLEM**: pedestal models are not designed for current ramp-up/ramp-down conditions

**Step3**: evolve free-boundary magnetic equilibrium with prescribed  $n_e$ ,  $n_c$ ,  $v_a$ , but predicted  $T_e$ ,  $T_i$  **including pedestal** (EPED1-NN)

 $\Rightarrow$  Need to rescale the pedestal in the ramp-up phase (basedon comparison between predicted and measured values)

**TEPED\_SCALE** = 
$$
11.0 \left( \frac{I_P}{I_{flat}} \right)^3 - 26.0 \left( \frac{I_P}{I_{flat}} \right)^2 + 21.0 \frac{I_P}{I_{flat}} - 5.3
$$





**…** except at low current (remember: initial condition is important)

**Step4**: evolve free-boundary magnetic equilibrium with prescribed  $n_e$ ,  $n_c$ ,  $v_\phi$ , but predicted  $T_e$ ,  $T_i$  including pedestal (rescaled according to plasma current)

**Stick to this model and move to the fun part**





## **Our success resulted from careful step-forward planning**





#### **We have used prior lessons learnt from ITER modeling**

- H&CD from RF in ramp-up critical for access to steady-state **=> focus on core EC**
- keep NBI waveform close to reference
- Predict equilibrium and temperature
	- $\Rightarrow$  Sustains higher q<sub>min</sub>
	- $\Rightarrow$  more flat q profile in the core







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## **"Predict First" EC and NBI Trajectory achieved high** b **access with no high gain feedback, obtaining smooth, elevated, sustained qmin with little MHD activity**



# **Preliminary analysis after the experiment indicated that we achieved all our targets**





## **Our success resulted from careful step-forward planning**





# **Degradation in Energetic Particle confinement correlates with instabilities**



- Measurements deviates from "classical predictions"
- Use neutron rate as global metric of EP confinement





# **MHD codes (NOVA/NOVA-K) used as starting point: compute mode structure, damping rates**



- Ideal MHD provides eigenmodes for each toroidal mode number
- Set of candidate modes selected based on stability

 $sqrt(\Psi_{pol})$ 

# **Reduced models (interpretive) reproduce loss of performance observed in experiments**

- Interpretive analysis
	- Adjust mode amplitudes to match measured neutron rate
- Linear stability analysis (kick model) indicates large number of unstable AEs



• Confinement degradation results in >50% dilution of EP density





## **Our success resulted from careful step-forward planning**





## **New experiments should be predicted "from scratch"**

How well can a discharge be reproduced with minimum input?

- Fix  $n_e$ ,  $T_e$ ,  $T_i$  and  $v_\phi$  at the separatrix
- Predict everything inside
- Set  $n_c$  as a fraction of  $n_e$ , read radiation from data

Obtain a good agreement with data

HOWEVER

#### **this is A FORTUITUOUS AGREEMENT**





#### **Challenge: pedestal predictions limited by available models** 4



Semi-empirical model for  $n_{sep}$ ,  $n_{ped}$ ,  $T_{e,ped}$ ,  $T_{i,ped}$  based on large experimental database and neural networks [*anybody interested, please come and talk to me*]

#### **Looking into details: the rotation profile is over-predicted**

How well can a discharge be reproduced with minimum input?

- Fix  $n_e$ ,  $T_e$ ,  $T_i$  and  $v_\phi$  at the separatrix
- Predict everything inside
- Set  $n_c$  as a fraction of  $n_e$ , read radiation from data

#### **Opportunities for improvement:**

Can a reduced model for rotation help? [*see work by T. Stolfzuck-Duek and B. Grierson*]





## **Experimental rotation results in poorer agreement**

How well can a discharge be reproduced with minimum input?

- Fix  $n_e$ ,  $T_e$ ,  $T_i$  at the separatrix
- Predict everything inside
- $n_c$  fraction of  $n_e$ , read radiation from data
- Read rotation from data

*Believe it or not …*

The disagreement with the measured neutrons rate and with the measured impurity density increases when the rotation profile is taken from the experiment.

Plasmas are nonlinear systems => better predicting everything and then compare quantities one-to-one to identify problems, than constraining one quantity and let the code adjust the rest.





### **Kick model brings down neutrons, but density is over-predicted**

How well can a discharge be reproduced with minimum input?

- Fix  $n_e$ ,  $T_e$ ,  $T_i$  at the separatrix
- Predict everything inside
- $n_c$  fraction of  $n_e$ , read radiation from data
- Read rotation from data
- Apply kick model to NBI calculations

#### **Opportunities for improvement:**

Self-consistent modeling of NBI and fast ion transport needed inside TRANSP [*see work by M. Podesta'*]





## **My one cent lesson learnt**

- We had a successful example of predict-first approach
	- went to the control room with a simulated discharge
	- achieved target using one single shot
	- have been able to design EC trajectories during a failure and even generate a solution in-between shot => not ready yet for applications in the control room.
- Fairly good predictions can be done with some assumptions on the boundary conditions
- However, large uncertainties still remain:
	- radiation is largely over-predicted => cannot use it in electron power balance
	- impurity predictions have large uncertainties => cannot predict  $n_e$ ,  $n_{\text{imp}}$  together
	- we have used coil currents from the experiment => in reality we should use gaps
	- more robust boundary conditions for  $n_e$ ,  $T_e$ ,  $T_i$ ,  $v_{\phi}$  at the separatrix needed



#### **The things that nobody says … (our predictive models suck)**

This was a nice exercise, but it is not going to work when the NBI waveform is modified

- $\Rightarrow$  Because the beams fuel the plasma
- $\Rightarrow$  Because the beams affect rotation
- thermal transport models do not include effect of fast ions among sources
- fast ion transport due to AEs/MHD needs to be included self-consistently
- present models for momentum transport are inadequate
- pedestal models do not separate among channels, do not predict density
- $\Rightarrow$  semi-empirical models needed to guide theory development
- Boundary conditions at the separatrix are important => need reduced core-edge model
- with 2D neutral model
- self-consistent impurity transport with core+edge radiation
- Need more robust free-boundary equilibrium solver







# **Reduced models are used to include EP transport by instabilities in TRANSP**

- A common framework has been developed and tested in FY18 to manage both kick and RBQ-1D models in TRANSP
	- *Models compute phase-space resolved "transport probability"*  $p(\Delta E, \Delta P_{\epsilon}/E, P_{\delta}\mu)$ associated with each mode
	- Probabilities are used in Monte Carlo NUBEAM module of TRANSP to compute fast ion evolution





# **Two approaches explored in FY18: numerical vs theory-based (quasi-linear)**

- Models use mode structure, damping rate from MHD codes such as NOVA-K
- Difference: how is  $p(\Delta E, \Delta P_c | E, P_c, \mu)$  inferred?
	- "Kick model": compute *p* numerically using particle-following code ORBIT
		- Retain possibility of sub/super diffusive or convective transport (non-gaussian *p*)
		- Include kicks in both energy and canonical momentum;  $\mu$  conserved
	- "Resonance broadened Quasi-linear model" RBQ-1D: use improved quasi-linear theory to compute *p*
		- Diffusive approximation -> gaussian  $p(\Delta P_Z)$ ; assume *E* and  $\mu$  are conserved
		- More computationally efficient than kick model approach
- *Improve ad-hoc diffusive models previously available in TRANSP*
	- Physic based; enable both *interpretive* and *predictive* TRANSP simulations
		- Mode saturation levels inferred by balancing drive vs. damping



# **Approach: proceed from** *interpretive* **to** *predictive* **simulations, validate models**

#### *Let's first agree on the definitions…*

- Interpretive simulations:
	- Constrain simulations with available experimental data
	- Validate main physics assumptions of the models
	- Benchmark among models
	- Validate models against additional experimental data
- Predictive simulations:
	- Remove constraints
	- Increase number of parameters to be determined ("predicted") self-consistently by the models
	- Assess predictive capability
	- Identify missing physics



# **Metrics for success: use neutron rate as global metric, available EP diagnostics data for more detailed validation**

- Historical approach for TRANSP simulations:
	- Introduce "anomalous fast ion diffusivity" when instabilities are present
	- Adjust diffusivity to match measured neutrons -> good!
- Will use the same approach for a first estimate of "success"
	- Allows quick experiment/modeling comparison
	- OK to infer overall degradation in plasma performance
- Will turn to more detailed measurements for validation
	- Compare modeling results to phase-space resolved EP data (FIDA, NPA)





