

# Tokamak Disruption Event Characterization and Forecasting (DECAF) and Progress on Real-Time Implementation

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**KFE** KOREA INSTITUTE  
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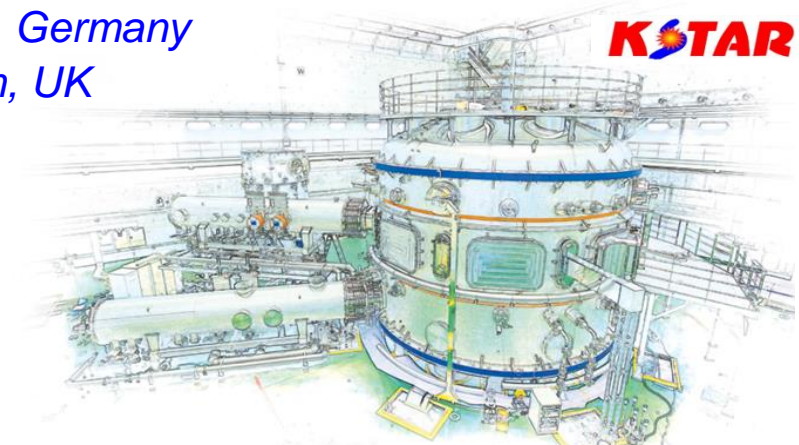


Presented at the

**APAM Physics Colloquium**

(Virtual)

18-Feb-2022



# DECAF is a broad-based physics research program aimed at a “grand-challenge” goal of disruption elimination in tokamaks

- ❑ Disruption Event Characterization and Forecasting (DECAF) quick review
- ❑ MAST-U stability projections, initial stability space investigation
- ❑ DECAF ELM detection with global MHD discrimination
- ❑ Initial DECAF locked mode proximity determination in ASDEX-U
- ❑ DECAF locked mode forecasting model and application to KSTAR
- ❑ Stability sensitivity study on KSTAR examining potential use in MRE
- ❑ Predict-first analysis of 100% non-inductive current KSTAR plasmas
- ❑ Counterfactual machine learning analysis examination for DECAF
- ❑ DECAF computational and database capability expansion
- ❑ Real-time DECAF implementation on KSTAR

# Disruption Prediction and Avoidance is a Highest Priority International Topic for ITER and Beyond – KSTAR is a key leader

## ❑ Present DOE U.S.-ITER ReNeW Workshop

- ❑ Disruption prediction and avoidance remains a highest priority topic
- ❑ Alberto Loarte (ITER) showed this topic as a highest priority ITER need

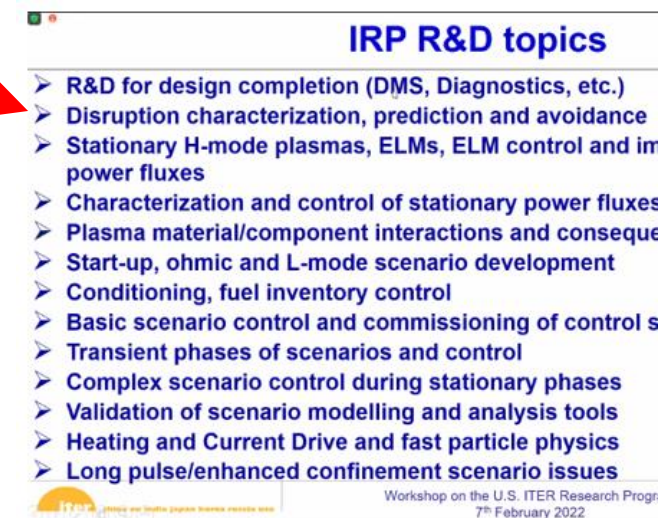
From Alberto's Talk

## ❑ The ITPA MHD and IOS Topical Groups

- ❑ ITPA MHD Spring meeting will emphasize this topic
- ❑ MDC-22 (G. Pautasso) is holding special meetings to prepare
- ❑ We are keeping the MDC-22 group informed regarding DECAF capability, integrated real-time diagnostics / real-time DECAF implementation and research on KSTAR

## ❑ The ITER Control Team

- ❑ Starting participation in design meetings of the ITER PFP01 control system for implementation of real-time DECAF in the ITER control system



IRP R&D topics

- R&D for design completion (DMS, Diagnostics, etc.)
- Disruption characterization, prediction and avoidance
- Stationary H-mode plasmas, ELMs, ELM control and in power fluxes
- Characterization and control of stationary power fluxes
- Plasma material/component interactions and consequ
- Start-up, ohmic and L-mode scenario development
- Conditioning, fuel inventory control
- Basic scenario control and commissioning of control s
- Transient phases of scenarios and control
- Complex scenario control during stationary phases
- Validation of scenario modelling and analysis tools
- Heating and Current Drive and fast particle physics
- Long pulse/enhanced confinement scenario issues

Workshop on the U.S. ITER Research Progr  
7<sup>th</sup> February 2022

# ITER is the largest tokamak in the world (construction 80% completed) that will produce a burning fusion plasma for the first time

A. Loarte, et al., U.S.-ITER  
Research Program talk 2/7/22

## ITER Mission and Goals

To demonstrate the scientific and technological feasibility of **fusion power** as energy source for humankind

➤ Pulsed operation:

$Q \geq 10$  for burn lengths of **300-500 s**  
inductively driven current

→ **Baseline scenario 15 MA / 5.3 T**

$$P_{\alpha} \geq 2 P_{\text{external-heat}}$$

➤ Long pulse operation:

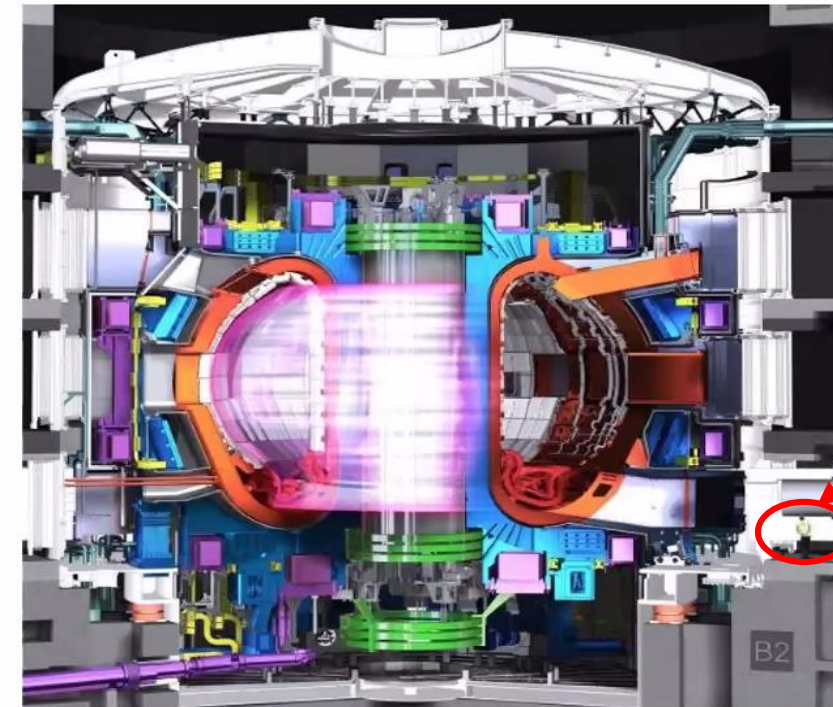
$Q \sim 5$  for long pulses up to **1000 s**

→ **Hybrid scenario ~ 12.5 MA / 5.3 T**

➤ Steady-state operation:

$Q \sim 5$  for long pulses up to **3000 s**, with fully non-inductive current drive

→ **Steady-state scenario ~ 10 MA / 5.3 T**



Workshop on the U.S. ITER Research Program  
7<sup>th</sup> February 2022

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□ Please visit <https://www.iter.org> for full information including GREAT photos!

# Continued DECAF development builds from an extrapolatable approach with strong initial success – expanding to real-time in KSTAR

Fully automated, physics-based analysis of existing tokamak databases from multiple devices (e.g. KSTAR, NSTX, MAST/-U, AUG)

(J. Berkery BP11.00016 → MAST/-U)

(V. Klevarova JP11.00059 → AUG)

Analyzing all plasma states, continuous and asynchronous events

“Critical”: (Level 3) event chains leading to disruption if no action taken

“Proximity”: (Level 2) paths to “critical” events

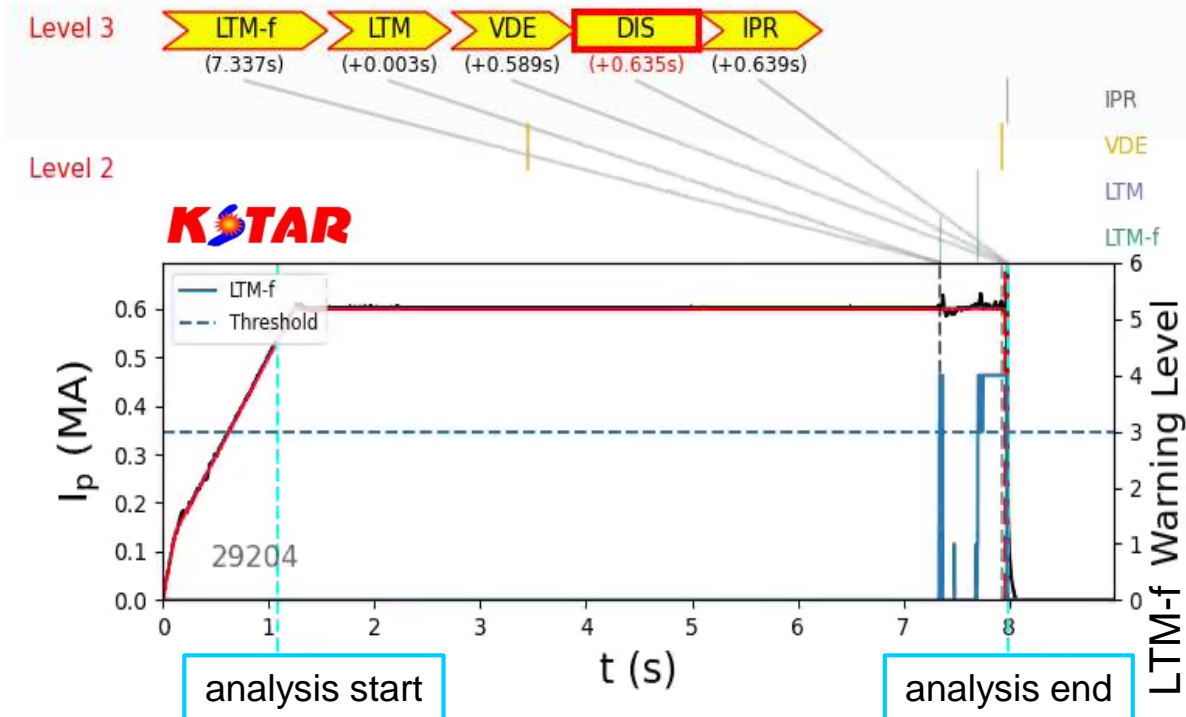
“Safe”: (Level 1) events indicate steady operation (e.g. L-mode / H-mode determination, steady ELMing, benign confinement transitions)

“Forecaster events”: give earliest warnings

High quantitative success found to date

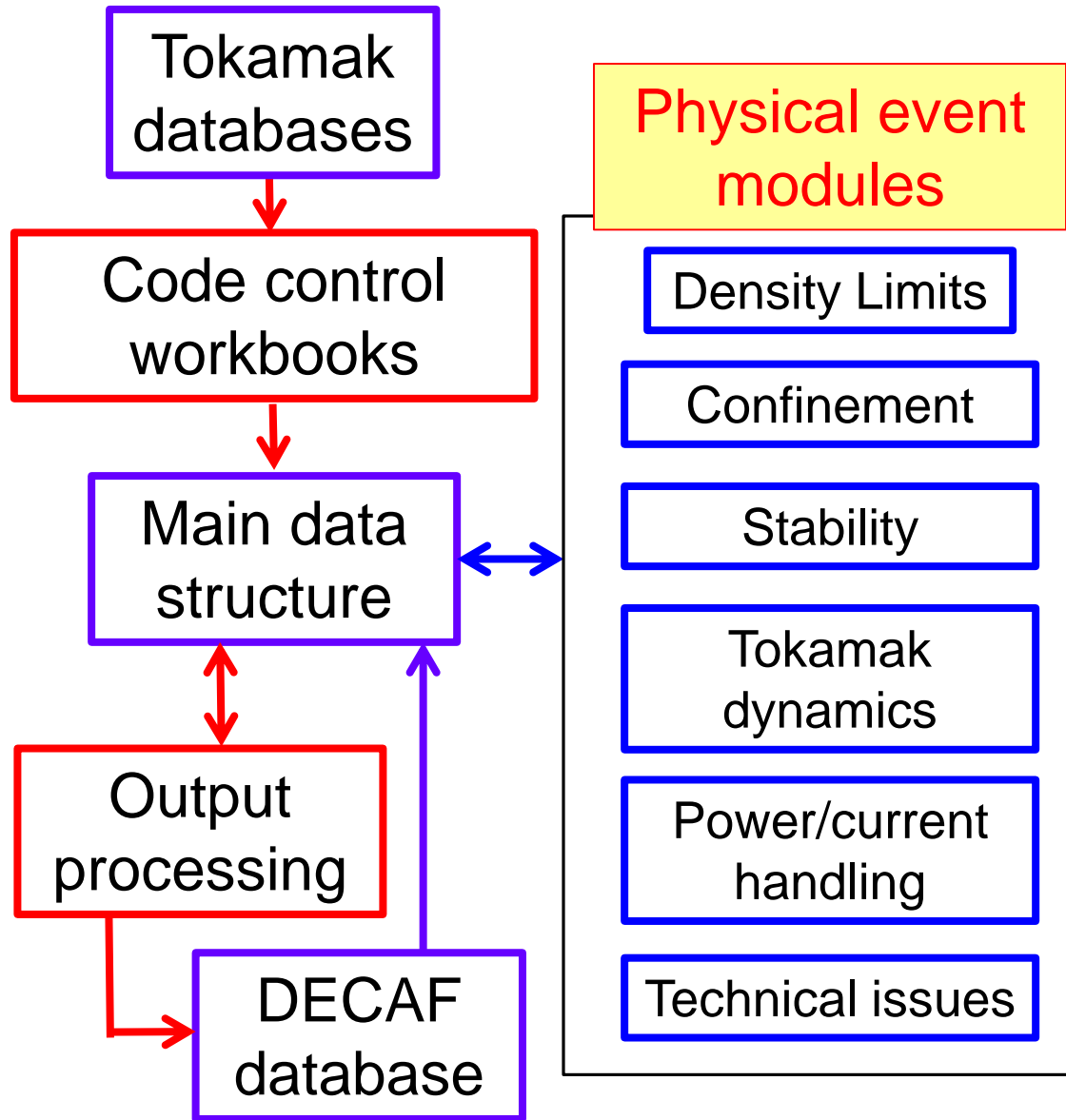
> 91% true positive, ~ 8% false positive (~1e4 shots, ~1e6 samples)

Research continues focused on improving forecasting to needed accuracy (98%+ goal for ITER, w/low false positives)



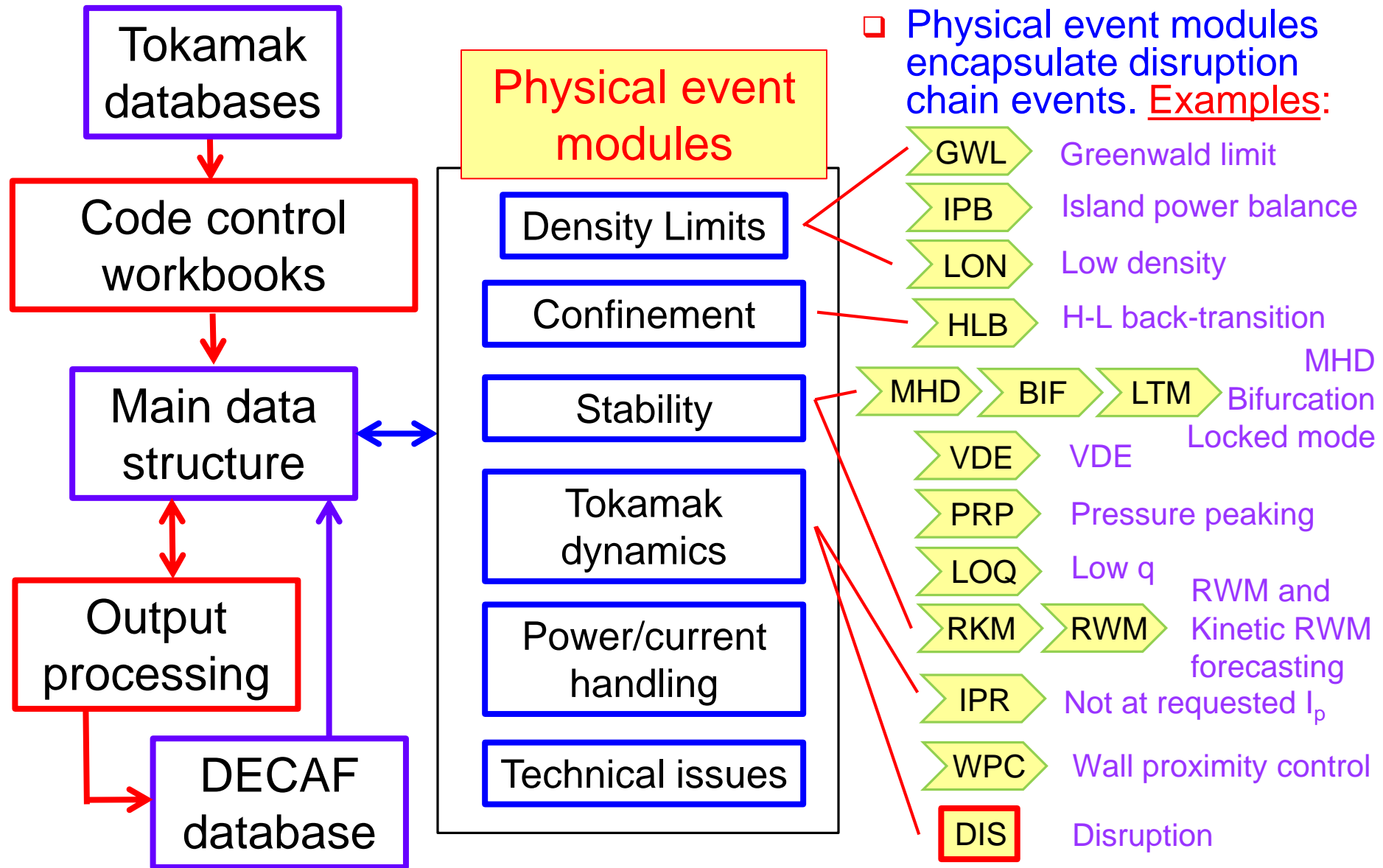
Data / analysis is desired in real time to reproduce offline analysis

# DECAF is a physics-based approach to disruption event understanding / forecasting to enable disruption avoidance



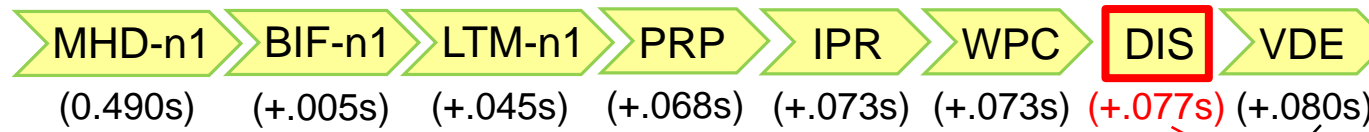
- ❑ Physical event modules encapsulate disruption chain events
  - ❑ Continued development focuses on improving these modules
  - ❑ Structure eases parallel development incl. real-time
- ❑ KEY: Offline and real-time analysis **INTEGRATED**
  - ❑ The SAME researchers that oversee the offline code/analysis are responsible for real-time code specifications

# DECAF is structured to ease parallel development of disruption characterization, event criteria, and forecasting



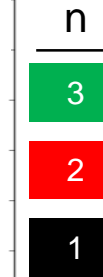
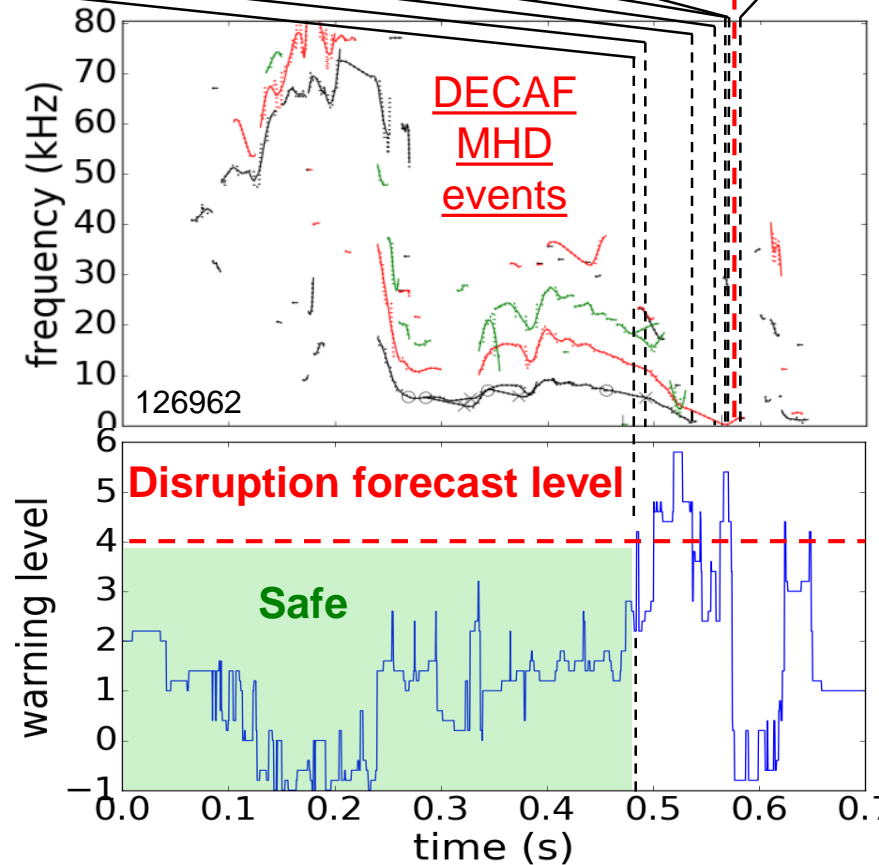
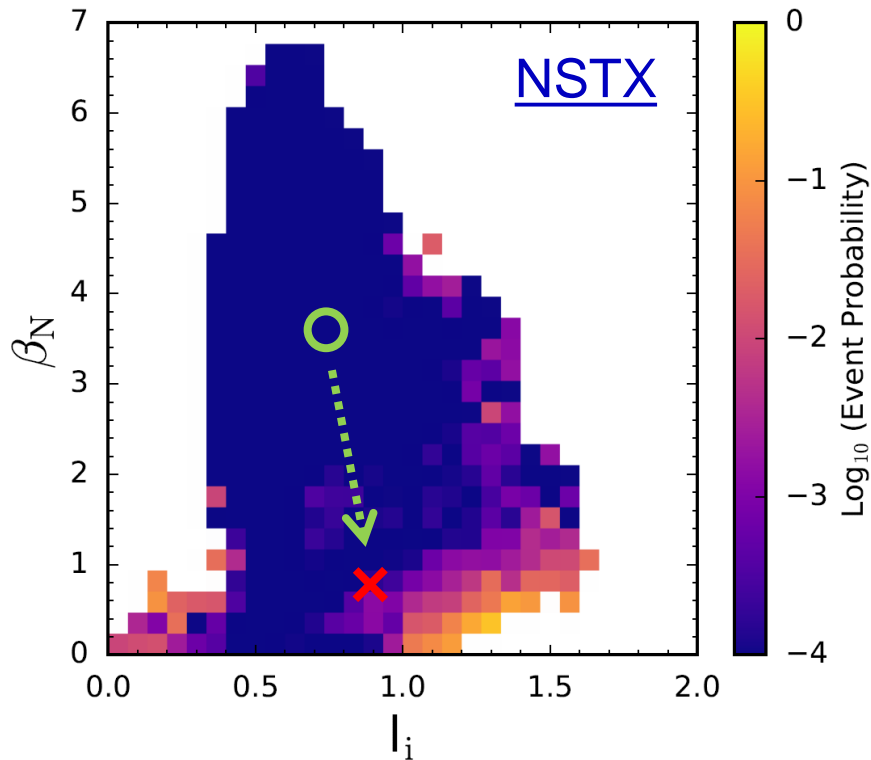
# Review: DECAF provides an **early disruption forecast** - on transport timescales – giving potential for disruption avoidance

DECAF Level 3 event chain



□ DECAF event chain reveals physics

NSTX stability operational space



- Rotating MHD slows, bifurcates, locks
- Plasma has an H-L back-transition (pressure peaking warning PRP) before DIS
- Early warning occurs in apparently SAFE region of operating space!

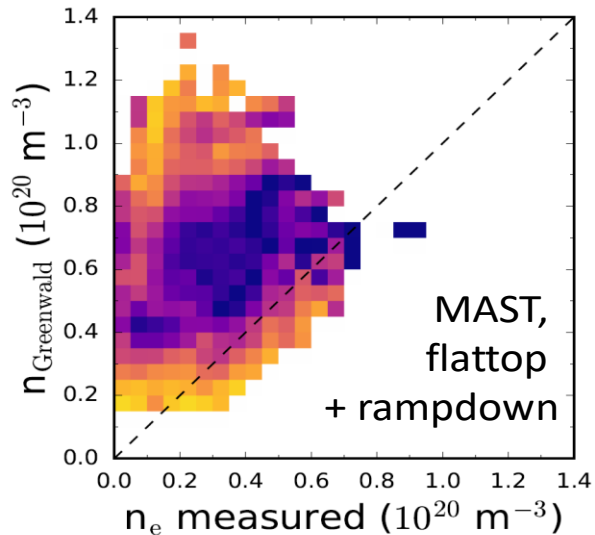
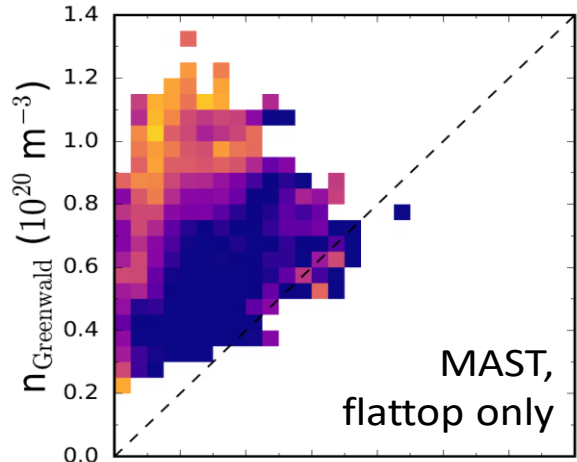
• NOTE: 15 conditions used including plasma velocity profile

S.A. Sabbagh, et al., 2020 IAEA Fusion Energy Conference, Paper IAEA-CN-286/1025

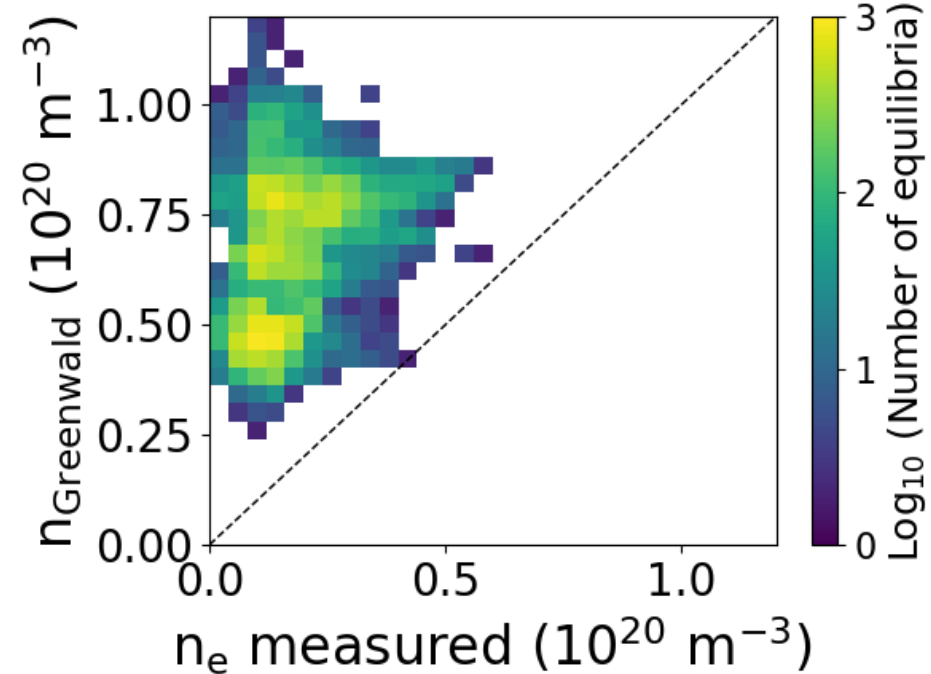


# DECAF analysis of MAST showed disruptions with Greenwald limit violation common in ramp down; MAST-U flattops mostly below limit

## MAST disruptivity



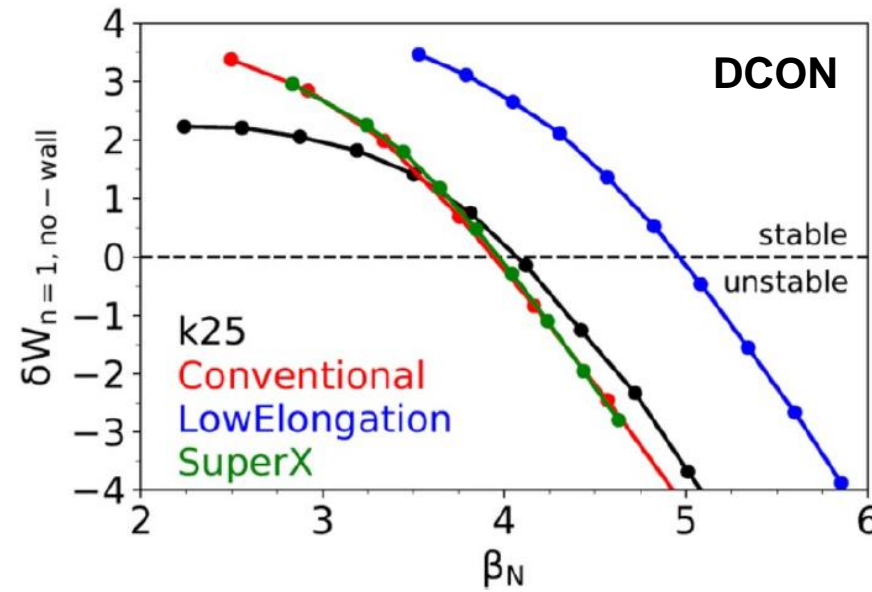
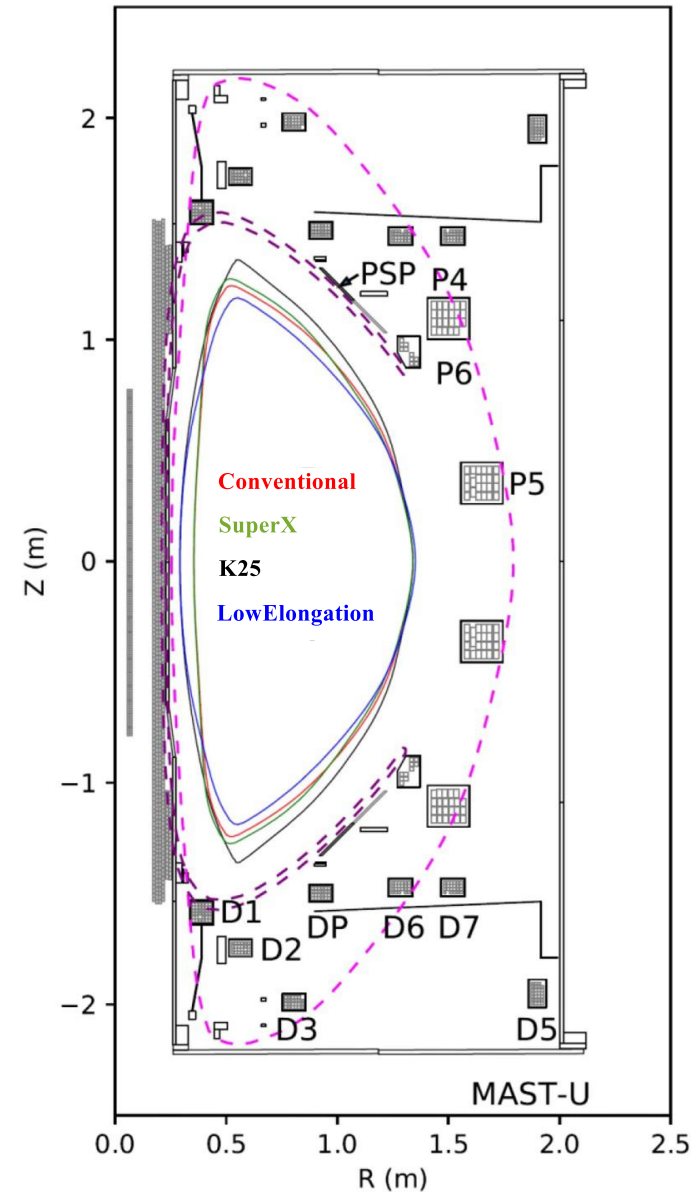
## MAST-U operational space



- ❑ MAST flattops reached the Greenwald limit, but disruptions over the limit were relatively rare
  - ❑ Decreasing  $I_p$  in ramp down reduces the limit
- ❑ MAST-U flattops usually well below limit

J. Berkery, et al., APS  
DPP BP11.00016

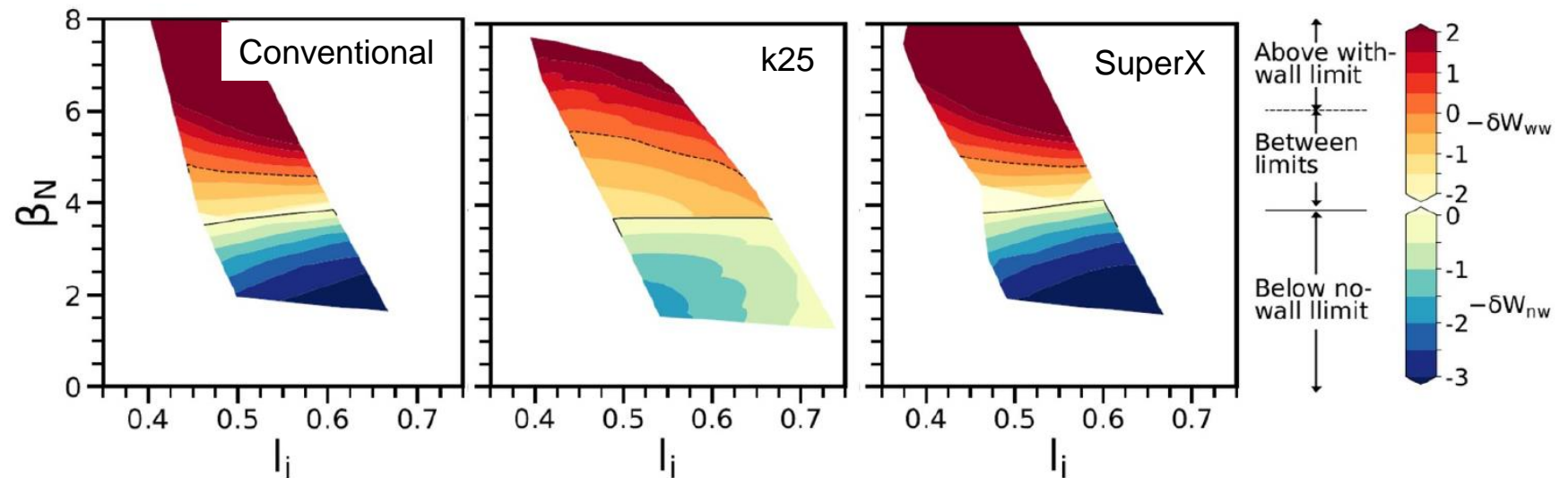
# Ideal stability of four MAST-U projected equilibria shapes were evaluated for stability by scaling pressure, etc.



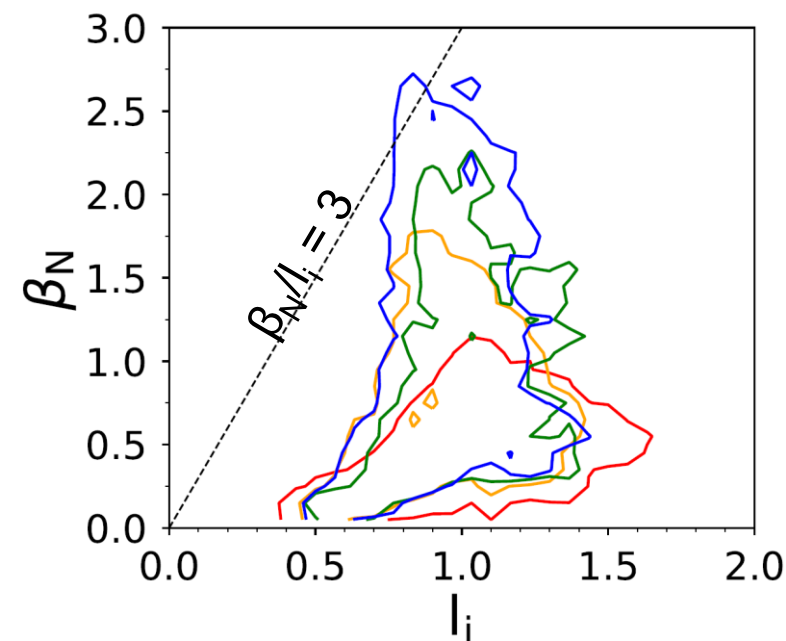
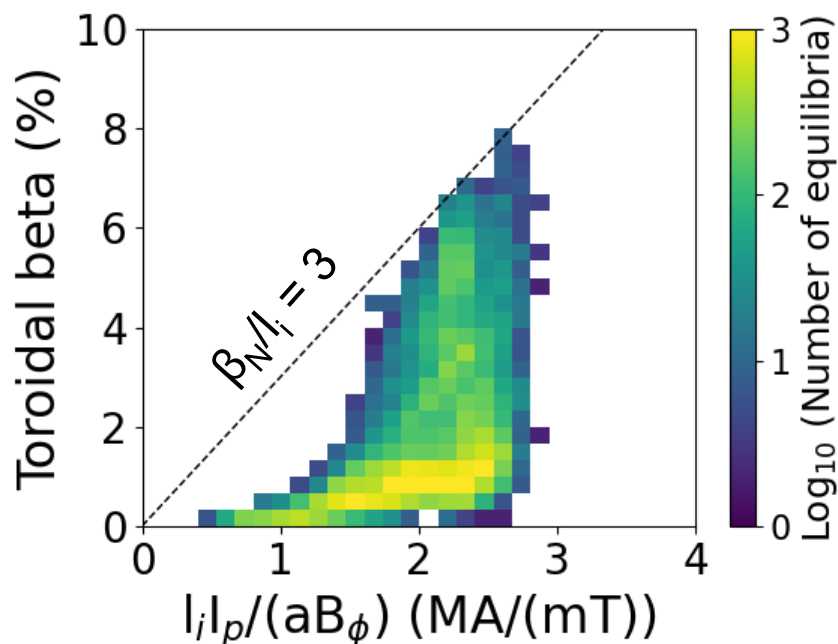
## Ideal stability evaluation

- pressure profile scans
- q(0) scans
- Projected no-wall limit:  $\beta_N \sim 4$  and  $\beta_N/l_i \sim 7$

J.W. Berkery, *et al.*, PPCF 62 (2020) 085007

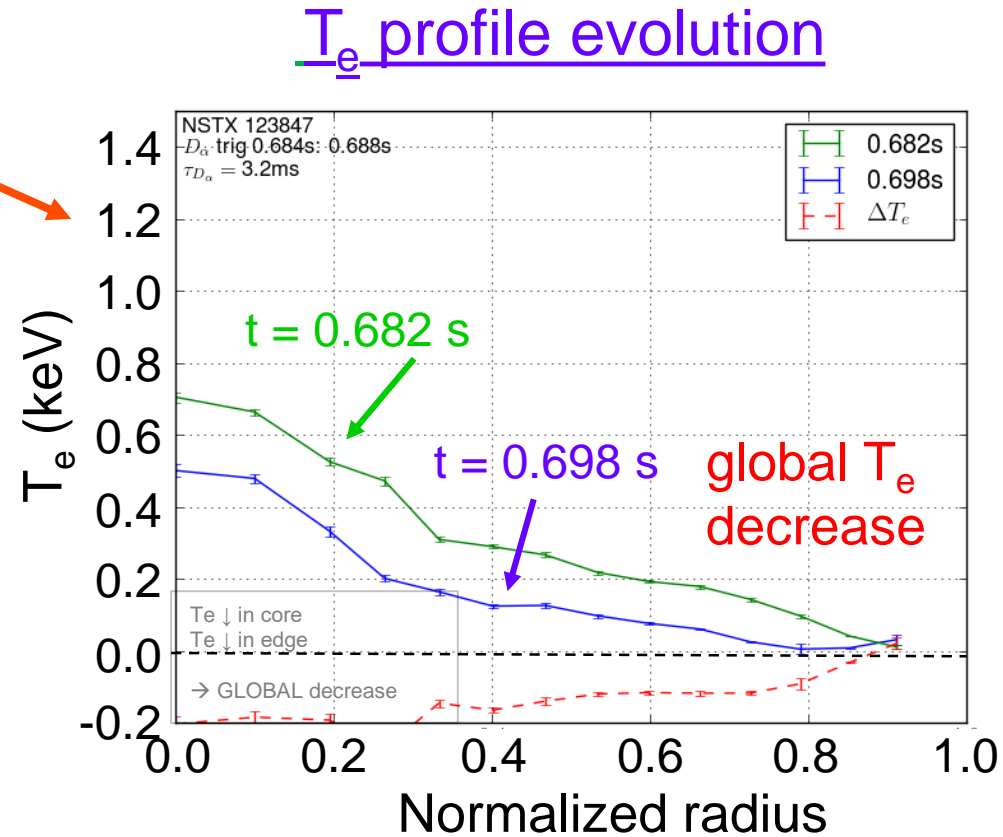
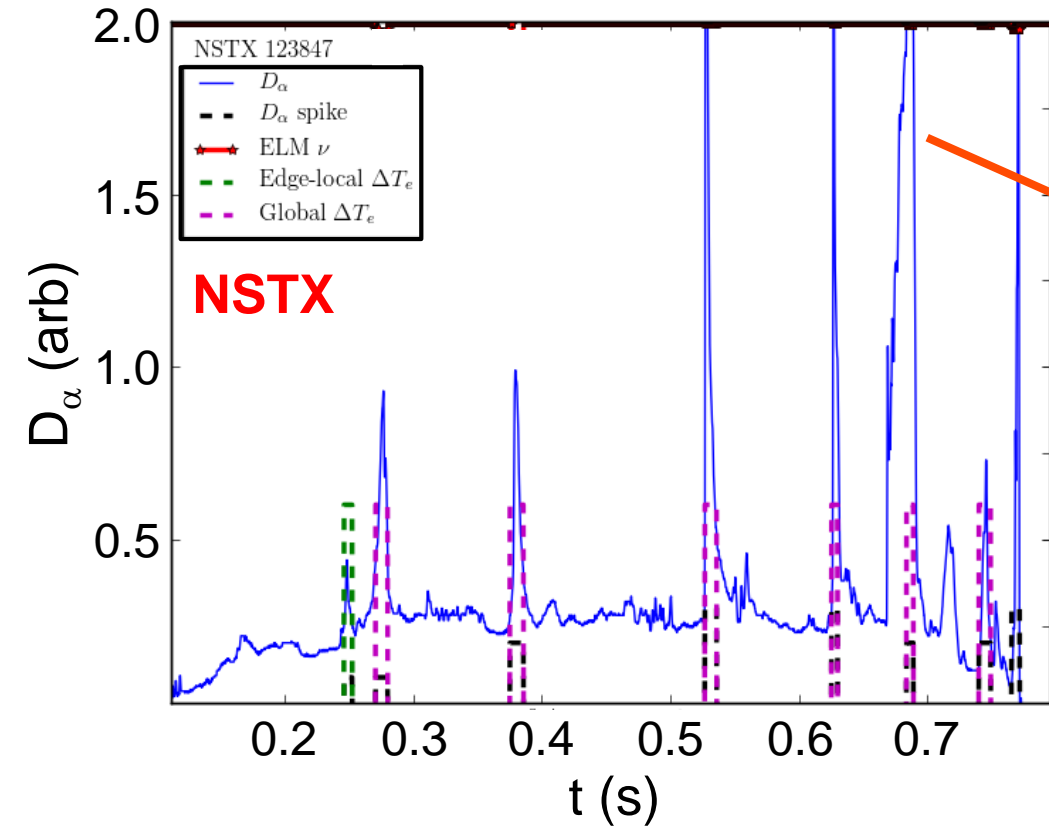


# DECAF examination of MAST-U operation has reached max $\beta_N$ of 3.18 and $\beta_N/I_i$ of $\sim 3.3$ , still below computed global stability limits



- ❑ Normalized beta diagrams show macroscopic stability limits
  - ❑ The colored lines are contours containing at least 10 equilibria for:
  - ❑ Ohmic (red), SW off axis beam (orange), SS on axis beam (green), and two beam (blue)
- ❑ Projected MAST-U no-wall limit:  $\beta_N \sim 4$  and  $\beta_N/I_i \sim 7$

# $T_e$ profile provides critical addition to $D_\alpha$ ELM detection by determining the radial extent of perturbation – needed to distinguish disruptive MHD



- Need a real-time system that measures  $T_e(R)$
- ELMs can also trigger tearing modes, locking
- For KSTAR, a real-time ECE system can also examine mode position, geometry

$D_\alpha$  spikes normally considered “edge localized”....

... can in fact be global  
- In this case, a global kink / RWM

J. Butt, et al. (APS DPP 2021 TP11.00109)

# Locked mode dependence on plasma parameters being studied for “proximity” disruption prevention approach

(V. Klevarova JP11.00059 → AUG)

- ❑ In large devices, static (‘locked’) modes (LM) are frequently detected close to the end of chain of events that lead to disruption [1, P.C. de Vries et al., *Nucl. Fusion* **51** (2011) 053018]
- ❑ Semi-empirical scaling relations for mode locking based on mode amplitude have been derived and (routinely) applied

-> Some normalize LM amplitude to plasma current, e.g. in JET

‘Mode lock/ $I_p$ : 400–520 pT/A’ [2, C. Reux et al. *Fusion Engin. and Design* **88** (2013) 1101-1104, Table 1]

- ❑ Multi-device study of disruptive LM amplitude  $B_{LM,disr}$  shown in [3, P.C. de Vries et al., *Nucl. Fusion* **56** (2016) 026007] resulted in a scaling containing more physics ingredients:

$$\hat{B}_{LM,disr}(r_c) \propto I_p \cdot a^{-1.1} \cdot (li/q_{95})^{1.2} \cdot \rho_c^{-2.8} \quad (1)$$

$$\rho_c = r_c/a, r_c = |R_{mag} - R_{coils}|$$

$a$  .. plasma size,  $\rho_c$  .. mode structure

$q_{95}$  .. mode-plasma edge distance

$li/q_{95}$  .. proxy for energy driving mode growth

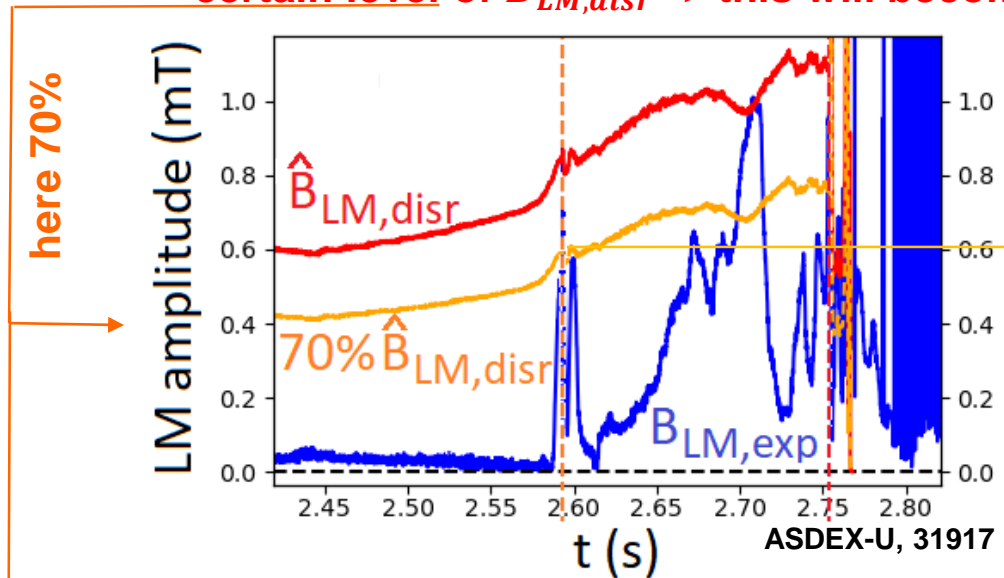
- ❑ Scaling (1) was further validated on large database (JET, ASDEX-U, DIII-D, COMPASS) in [4, V. Klevarova et al., *Fusion Engin. and Design* **160** (2020) 111945]

❑ For example in ASDEX-U  $B_{LM,disr} \sim (0.95 \pm 0.42) \hat{B}_{LM,disr}$  at the disruption time

# Proximity of experimental and scaled disruptive mode amplitudes a measure of disruption onset (ASDEX-U)

(V. Klevarova APS DPP JP11.00059)

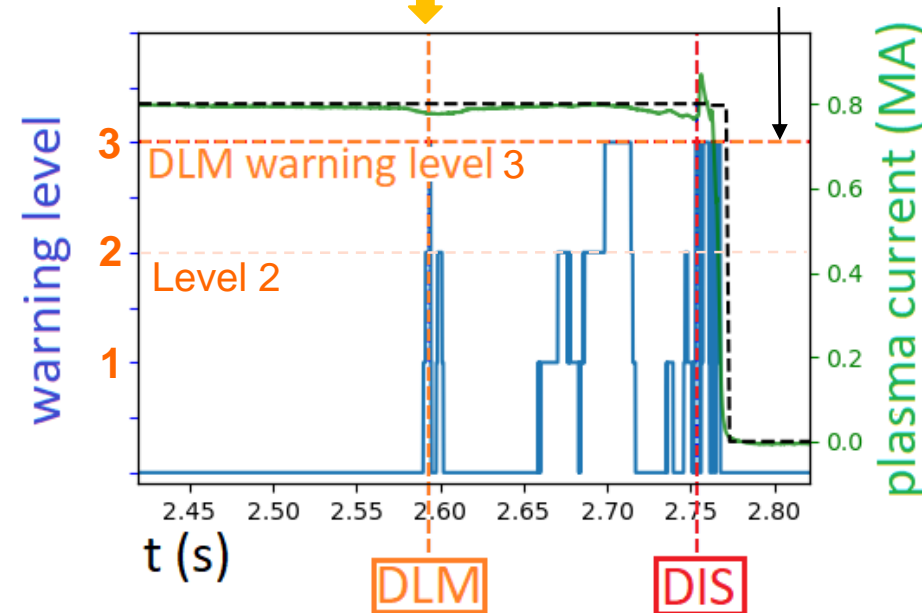
- When compared to experimental data, scaling (1) can estimate how 'close' the mode, in terms of amplitude, is to disrupt the plasma
  - Here, (1) added to DECAF, warning is generated once experimental mode amplitude  $B_{LM,exp}$  reaches a certain level of  $\hat{B}_{LM,disr}$  -> this will become one of DECAF events, the DLM event ('disruptive locked mode')



Level 3 = event will disrupt plasma, take action!  
 Level 2 = disruptive level is approached, pay attention!

- Level of  $\hat{B}_{LM,disr}$  can be varied, allowing study of DLM performance in pre-disruptive warning generation

Upper figure: Comparison of scaled  $\hat{B}_{LM,disr}$  and experimental  $B_{LM,exp}$  mode amplitudes for an ASDEX-U discharge  
 Right figure: Generation of DLM warning in DECAF once  $B_{LM,exp}$  reaches certain level (70%) of  $\hat{B}_{LM,disr}$  (DIS: disruption time)



# Initial confusion matrix evaluation of DLM capability for ASDEX-U shows promise for use as a proximity

(V. Klevarova APS DPP JP11.00059)

Confusion Matrix Result	
TP: 17.7 %	FP: 15.7%
FN: 22.3 %	TN: 44.3%

STUDY INTERVAL [FTE-0.5 s, FTE+0.1s]

**DLM**

Level 3 warning generated (33.4%)

No Level 3 warning (66.6%)

Had DIS (26.5%, 79.2%)

No DIS (6.9%, 20.8%)

Had DIS (22.3%, 33.5%)

No DIS (44.3%, 66.5%)

Median(DIS-DLM) ± MAD: 5.6 ± 7.7 ms

**FALSE POSITIVE**

**FALSE NEGATIVE**

**TRUE NEGATIVE**

DLM ≤ DIS (17.7%, 66.8%)

DLM > DIS (8.8%, 33.2%)

**TRUE POSITIVE**

**FALSE POSITIVE**

DIS-DLM: 24.0 ± 21.4 ms

DIS-DLM: -1.3 ± 0.5 ms

- First % in parentheses refer to full set of 2694 shots (Slide 13), second % to number of shots in the upper category

MAD: Median absolute deviation

# Island rotation dynamics model used to compute the critical frequency to forecast disruption

LTM-f

- Cylindrical, rigid body model
- Possible model of drag for both a “slip” and a “no slip” condition:

$$\frac{d(I\Omega)}{dt} = T_{aux} - T_{mode} - \frac{(I\Omega)}{\tau_{2D}}$$

- Utilize DECAF real-time MHD system to determine mode, critical frequency

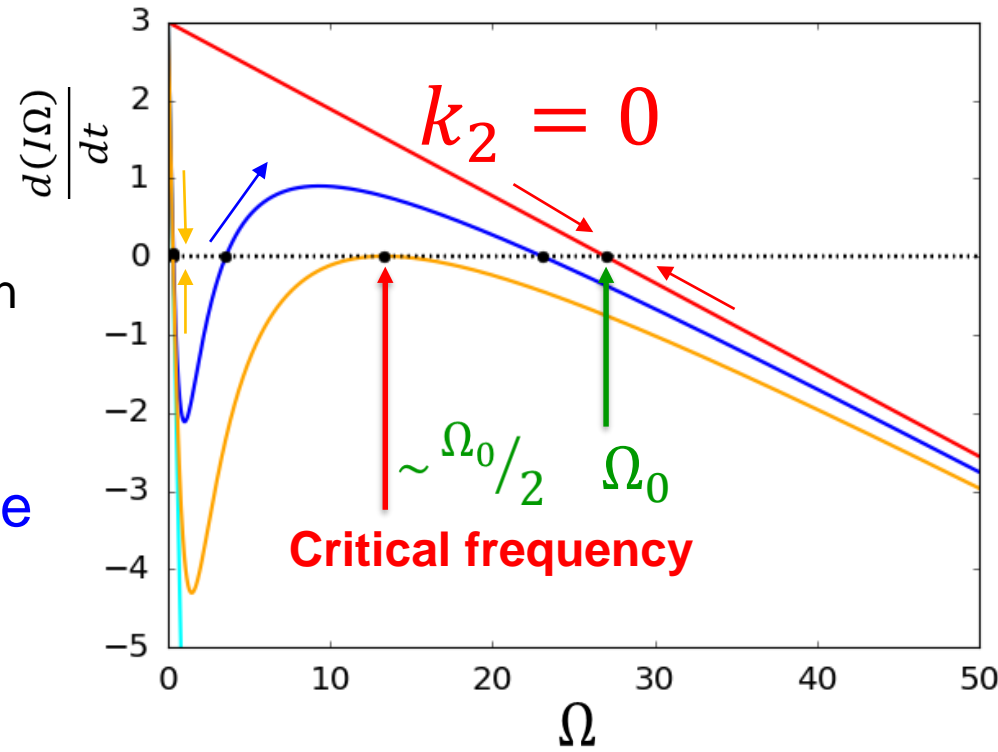
$$T_{mode} = \frac{k_2\Omega}{1 + k_3\Omega^2}$$

R. Fitzpatrick et al., Nucl. Fusion 33 (1993) 1049

- At very low angular speed, mode can reach a stable steady state, **→ observed in KSTAR**

- First real-time model, assume “no slip” condition

$$T_{mode} = \frac{k_1}{\Omega}$$

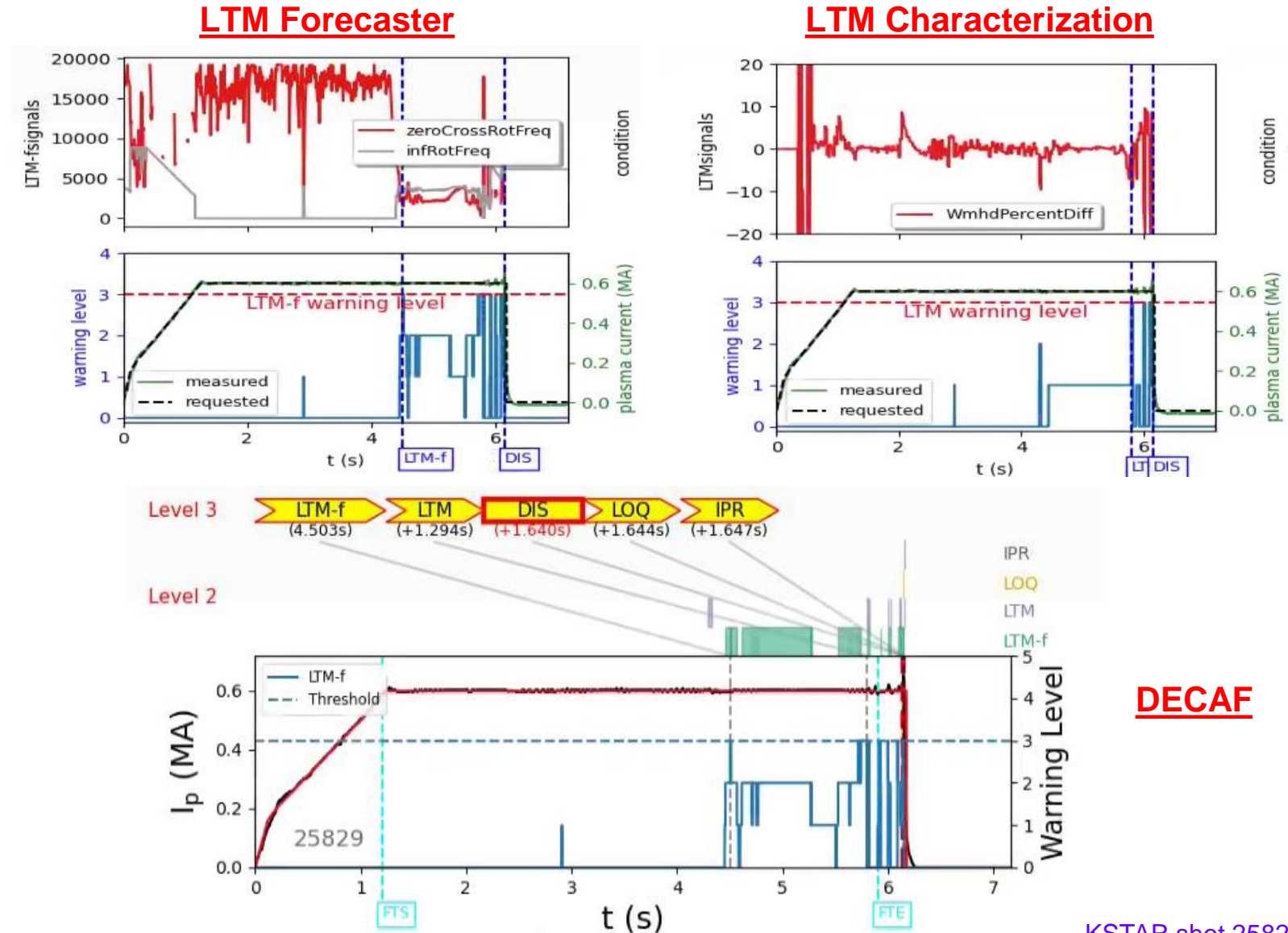


J. Riquezes, et al. APS DPP PO09.00007



# LTM forecaster on KSTAR leaves ample time for potential NTM control before disruption

- Plots show summary of DECAF results for characterization and forecaster in a disrupting KSTAR shot
- Bifurcation frequency is crossed at  $\sim 4.5$  s
  - Locking occurs at  $\sim 5.8$  s
  - Disruption happens at  $\sim 6.1$  s
- Significant time period of 1.6 s between forecasting and disruption



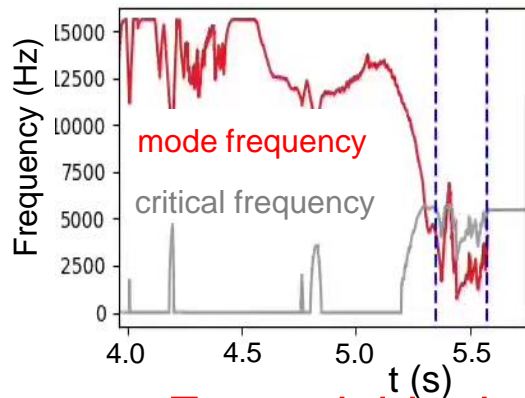
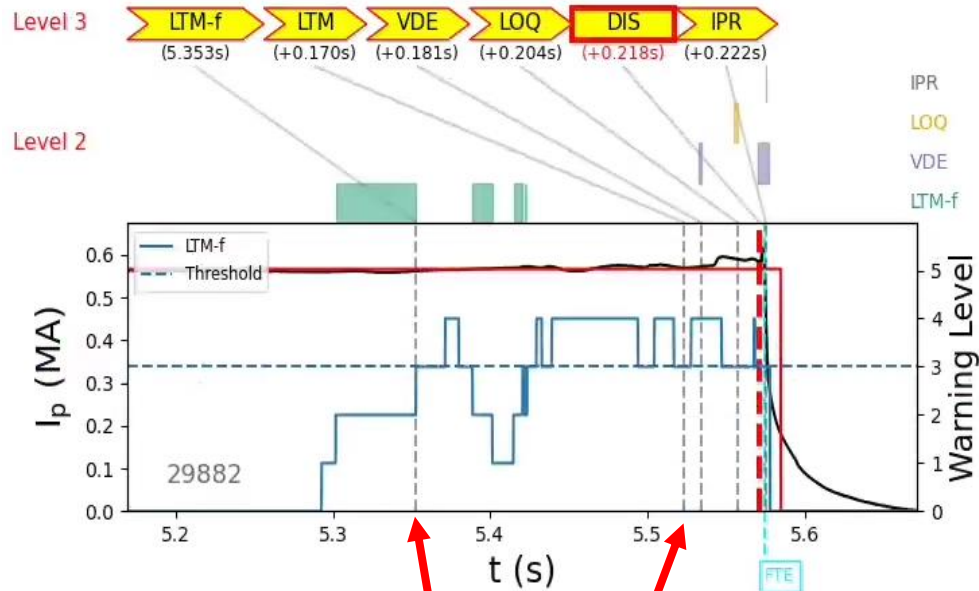
**DECAF**

J. Riquezes, et al. APS DPP PO09.00007

KSTAR shot 25829

# DECAF MHD mode lock event forecaster provides early warning; MHD shows tearing and kink-like characteristics in ECEI

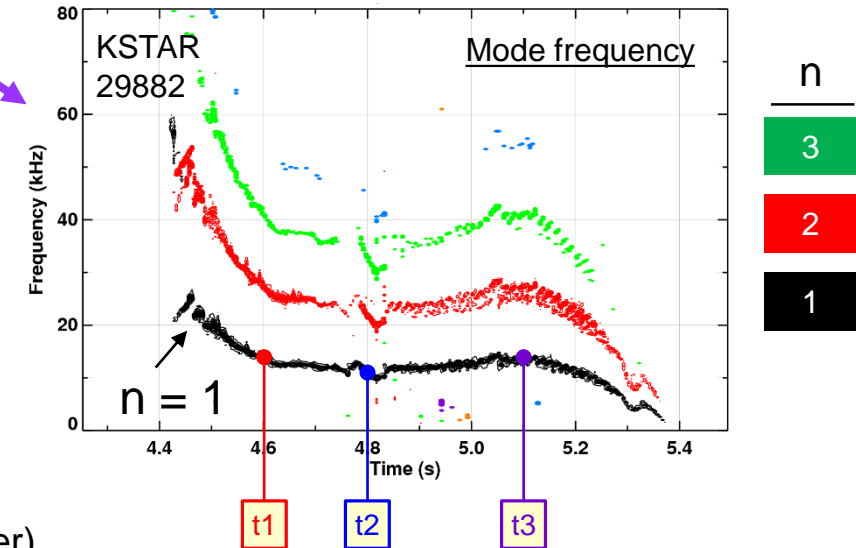
DECAF locked mode (LTM), forecaster (LTM-F) events (rtMHD system)



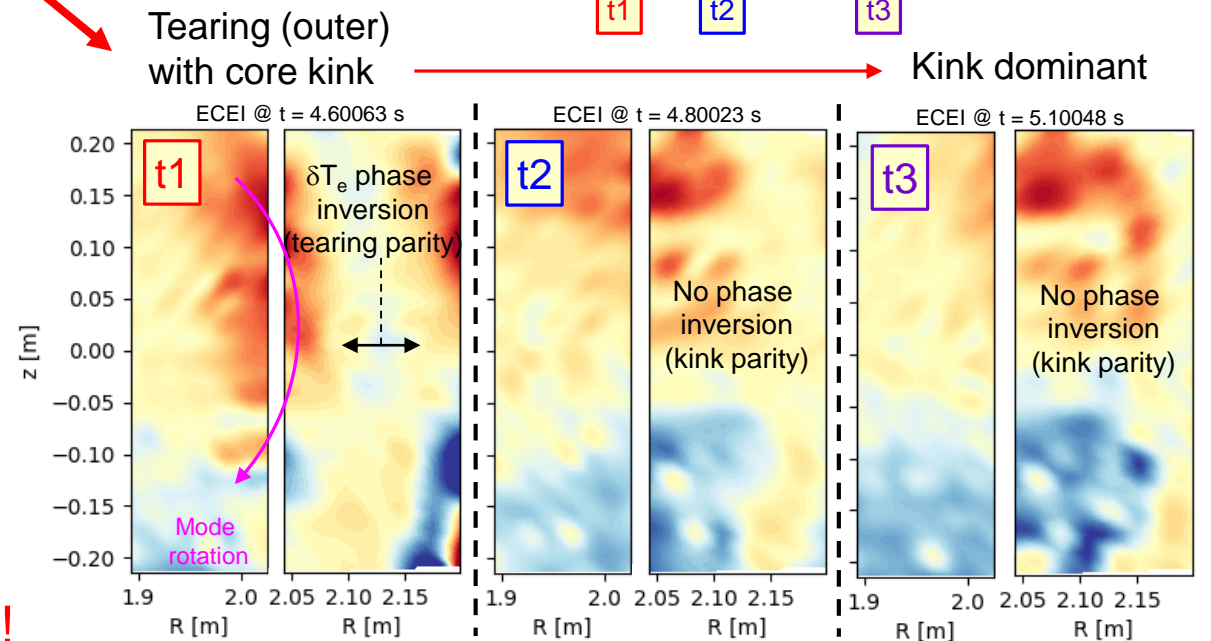
- LTM-f forecaster triggered 218 ms before disruption
- LTM event 170 ms after it was forecast

□ Expand this data/analysis, including real-time!

Magnetic spectrogram (toroidal array)



2D ECE imaging (ECEI)

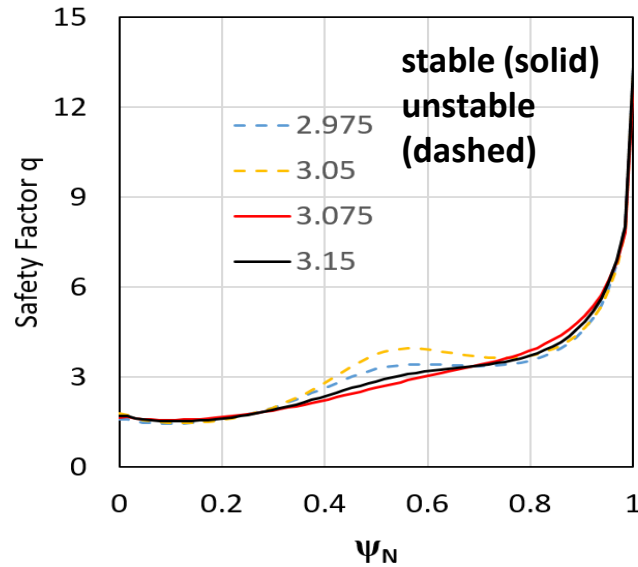


Tearing (outer) with core kink

Kink dominant

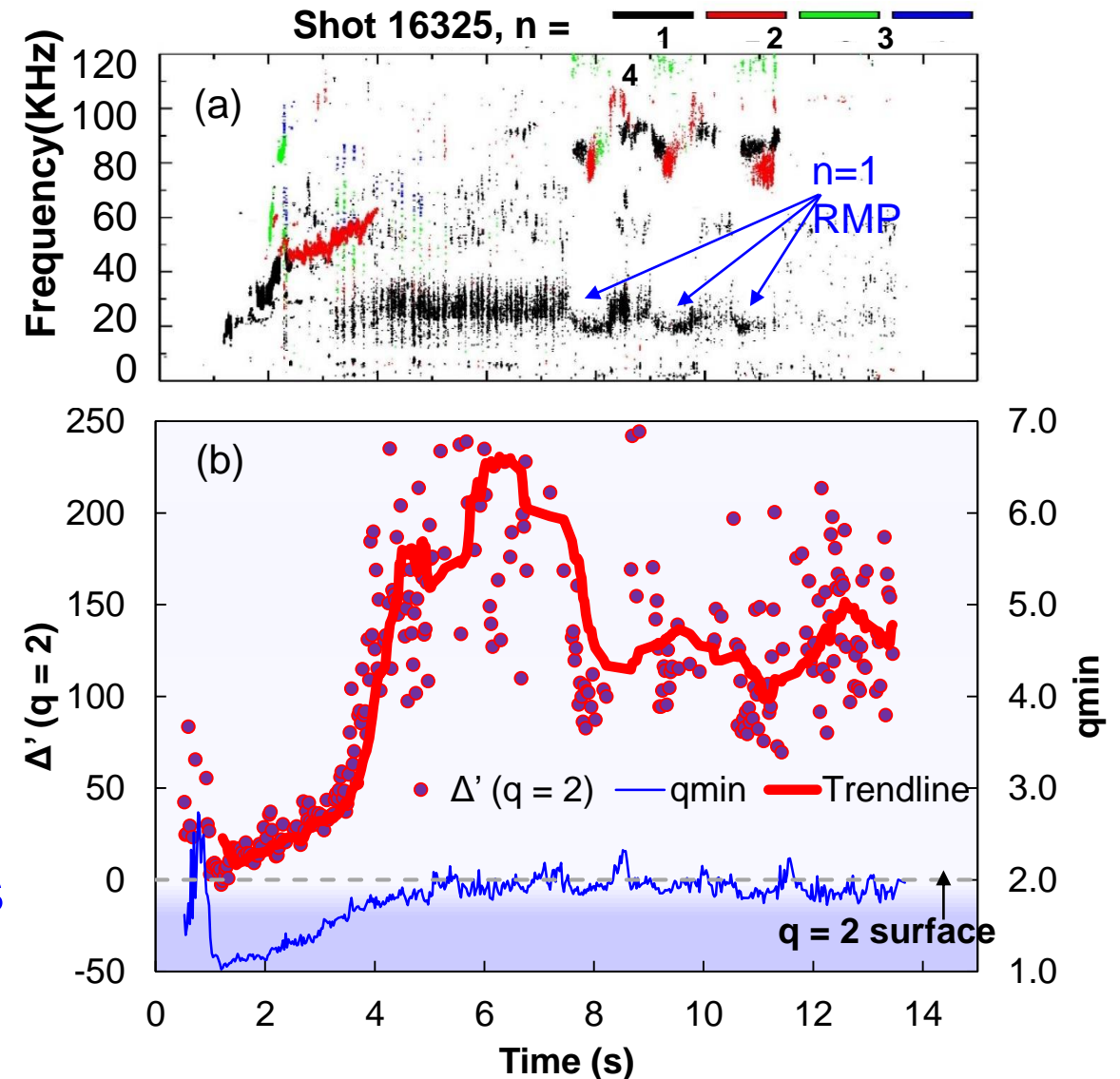
# Sensitivity of resistive, ideal DCON stability on KSTAR examined for high non-inductive plasmas – potential use of $\Delta'$ as stability indicator

## Ideal stability of profiles: $q$ shear reversal

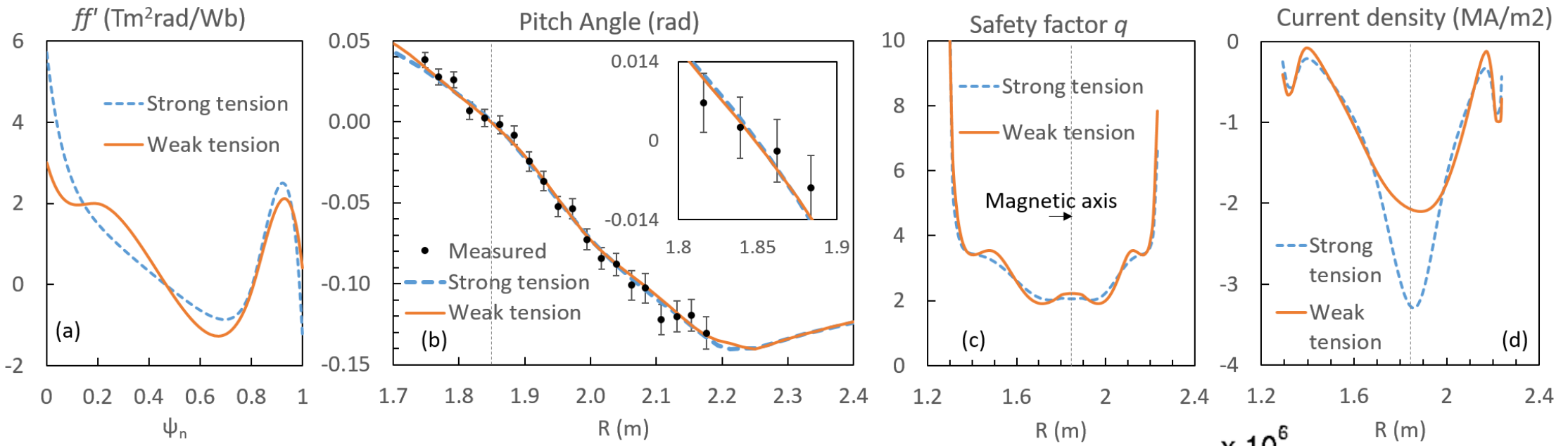


- $\Delta'$  analysis supporting evaluation of modified Rutherford equation as resistive stability indicator
- Less freedom in equilibrium basis functions produces less computed stability variation

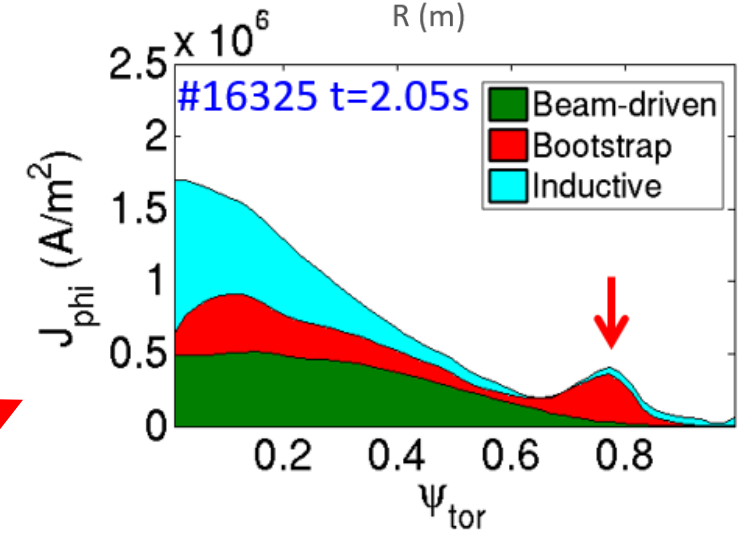
Y. Jiang, S.A. Sabbagh, *et al.*, Nucl. Fusion **61** (2021) 116033



# Weak splined tension basis function model manifests greater localized reversed shear and off-axis current profile



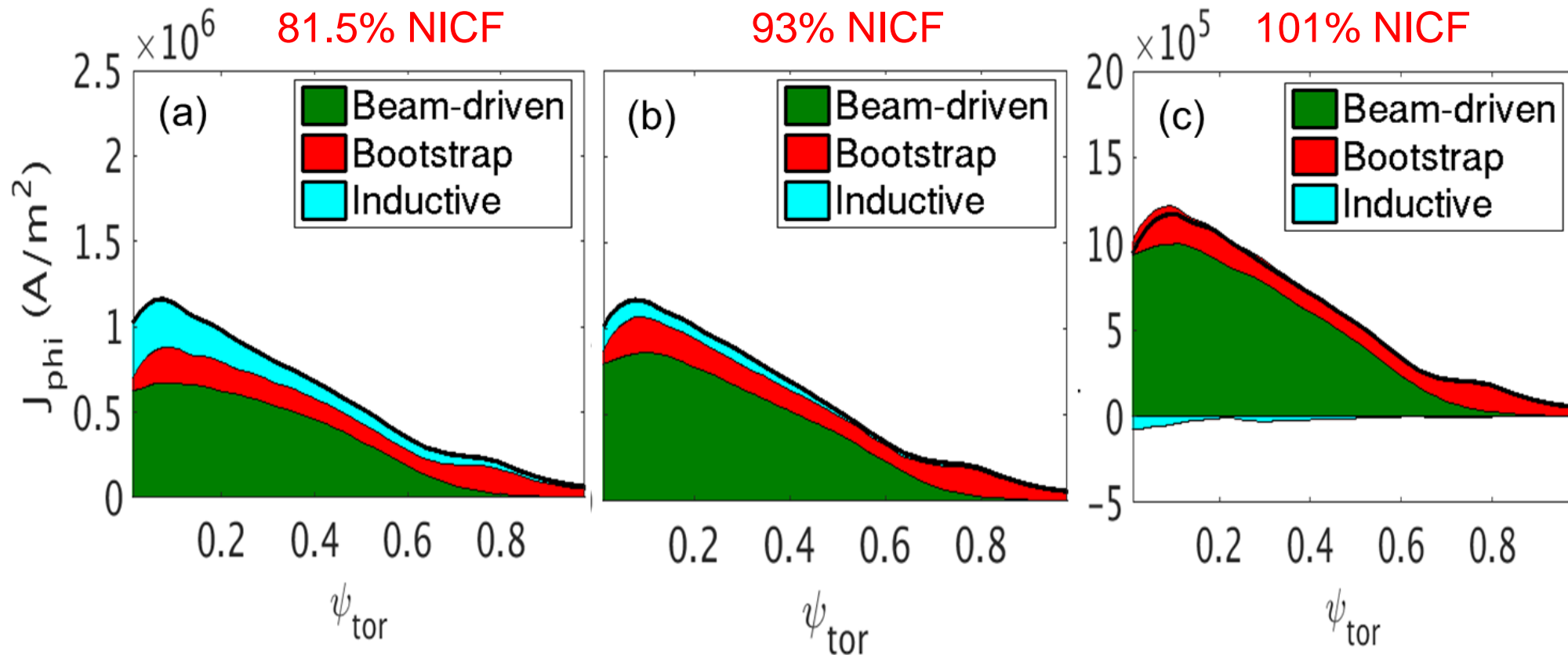
- Polynomial basis function models also produce MSE measured data
- Local flat spots form in  $q$  profile
  - challenging for ideal and resistive stability evaluation
- Consistent with KSTAR TRANSP high non-inductive current evaluation (~ 75% total non-inductive current)



Y. Jiang, et al., Nucl. Fusion 61 (2021) 116033

# “Predict-first” KSTAR TRANSP analysis shows expected high performance plasmas at > 80% NICF

Predicted high non-inductive current fraction (NICF) current profiles

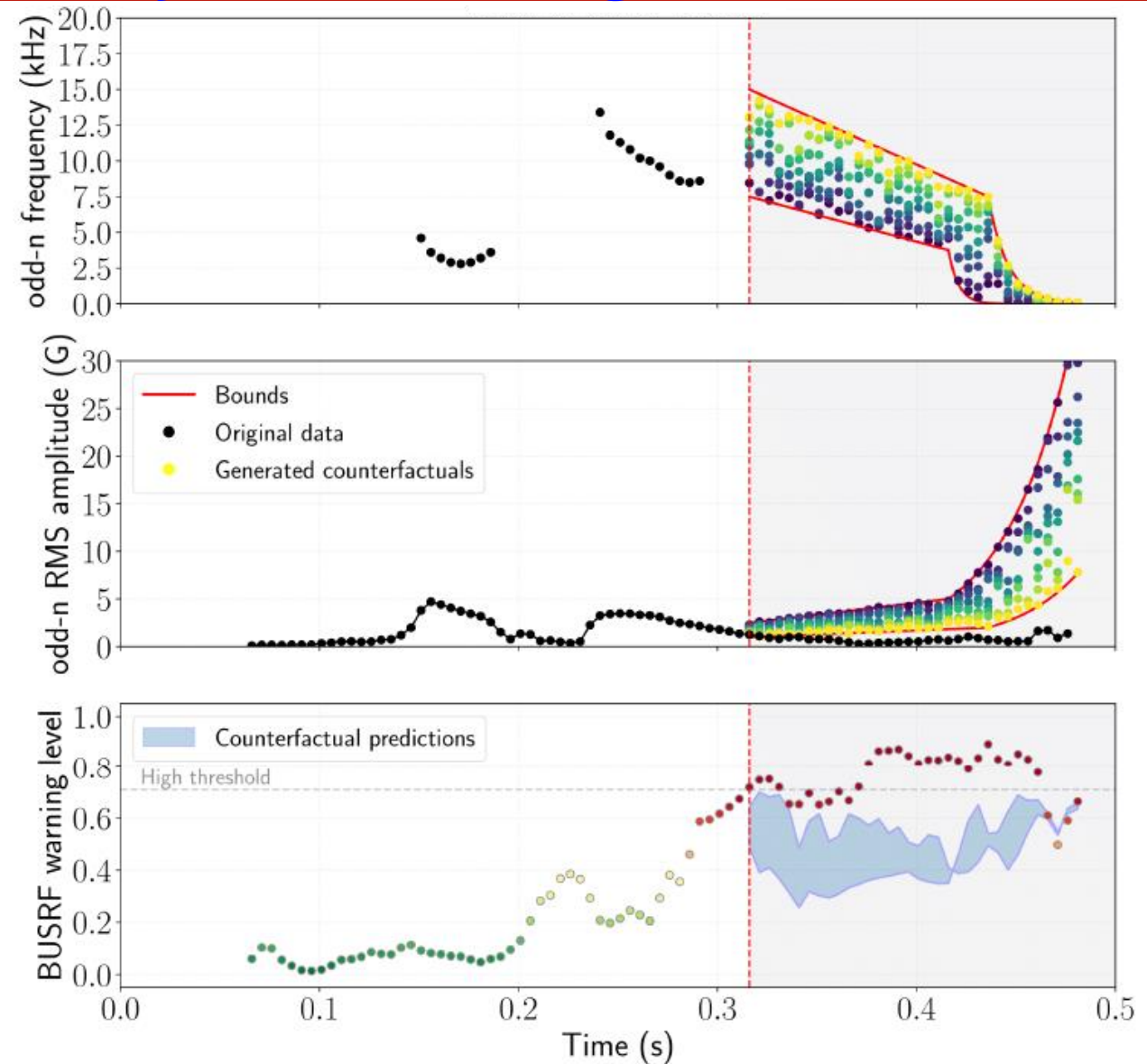


- High non-inductive current fraction predicted for 6.5, 7.5, 8.5 MW NBI
  - The  $\beta_N$  ranges from 3.0 – 3.5; based on KSTAR plasmas with NICF ~70%
- Produced high NICF plasmas (2021 run) with ~record  $\beta_p = 3$  in KSTAR (analysis pending)

# Innovative counterfactual machine learning introduced for the first time to generate hypothetical activity contradicting observations

- ❑ RWMs typical do not grow in NSTX if strong rotating MHD is present
- ❑ Consideration of 10 different MHD activity evolutions that would have kept the RWM stable on NSTX
- ❑ Counterfactual generation constrained within bounds based on NSTX rotating MHD operational experience
- ❑ Examining for use in DECAF for disruption proximity avoidance

A. Piccione, J.W. Berkery, S.A. Sabbagh, Y. Andreopoulos,  
Nucl. Fusion **62** (2022) 036002



# DECAF development attention 2020 – 2021 to real-time system design and implementation on KSTAR, DECAF code analysis processing

## ❑ Real-time DECAF on KSTAR

- ❑ several key diagnostics now acquired in real-time as part of the KSTAR PCS
- ❑ initial implementation real-time DECAF software as part of KSTAR PCS

See NEXT slides!

## ❑ DECAF analysis capability (several development goals recently achieved)

### ❑ Parallel processing over high performance clusters

- PPPL private (~30 CPUs) and open SLURM queues (~1,000 CPUs)
- Next step to utilize Princeton Stellar cluster (over 28,000 CPUs)

### ❑ Analysis persistence

- Automated interaction with the DECAF database
- 200 TB dedicated storage, funded for further expansion

### ❑ Analysis chunking

- Standard DECAF analyses are now “one-button” capable to process an *entire run year of data*, or the *entire database of a device(!)* for iterated analysis of DECAF forecasting models, etc.

**NSTX DECAF run: 30 CPU SLURM**

- 20 shots, 16 DECAF events
- 30 seconds computation time

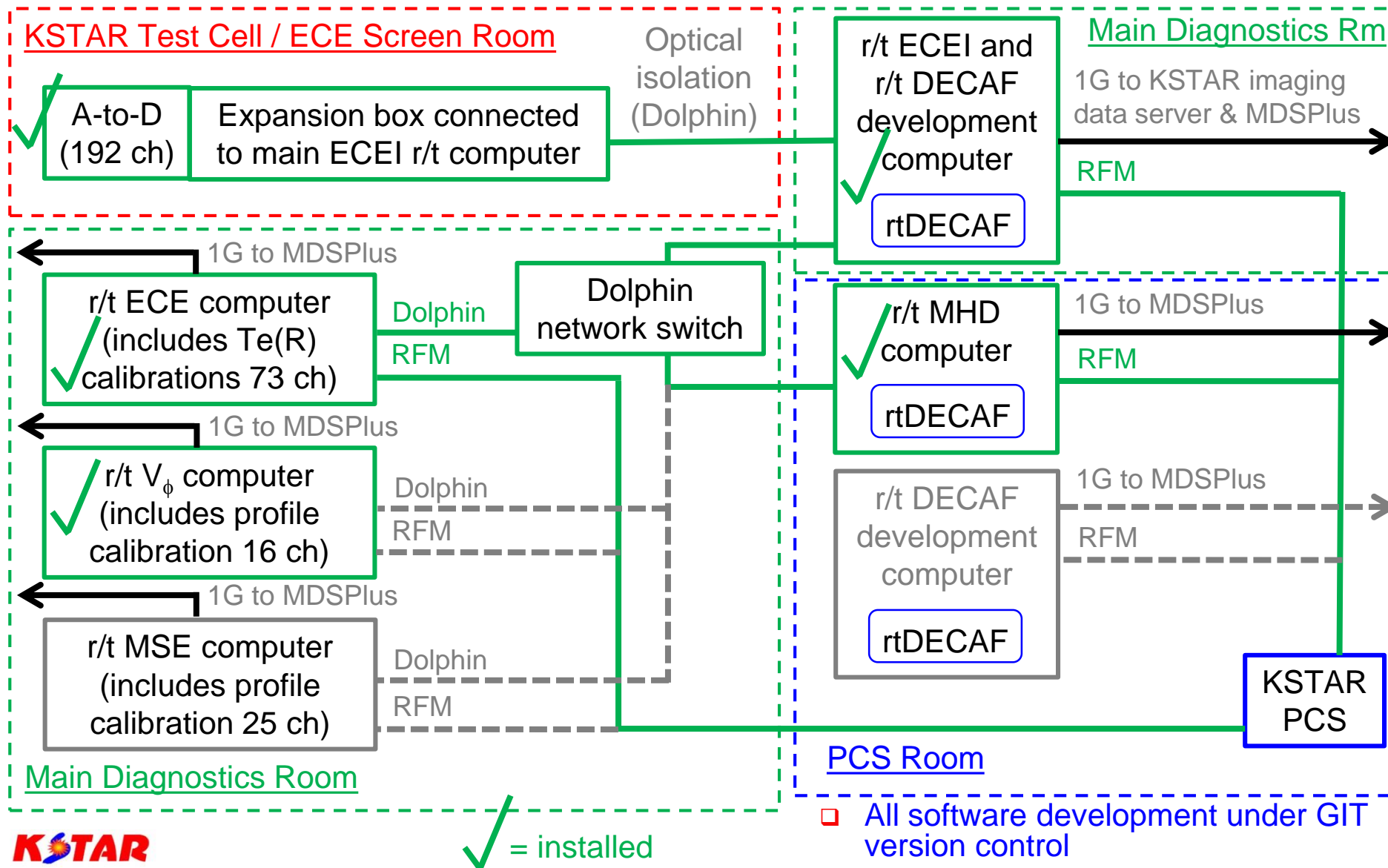
**NSTX run year ~ 3,000 shots**

- extrapolation: 1.2 hours computation

**NSTX database ~ 25,000 shots (40 TB)**

- extrapolation: 10.4 hours computation

# New real-time diagnostic acquisition in the KSTAR PCS enabling an integrated, world-class r/t DECAF analysis



## Installed

- Real-time MHD
- Real-time  $V_\phi$ ,  $T_i$ 
  - New system for 2022
- Real-time ECE, ( $T_e(R)$ , mode ID)
- Real-time ECEI ( $2D \delta T_e$ )

## Designed

- Real-time MSE
  - B pitch angle,  $\delta B$

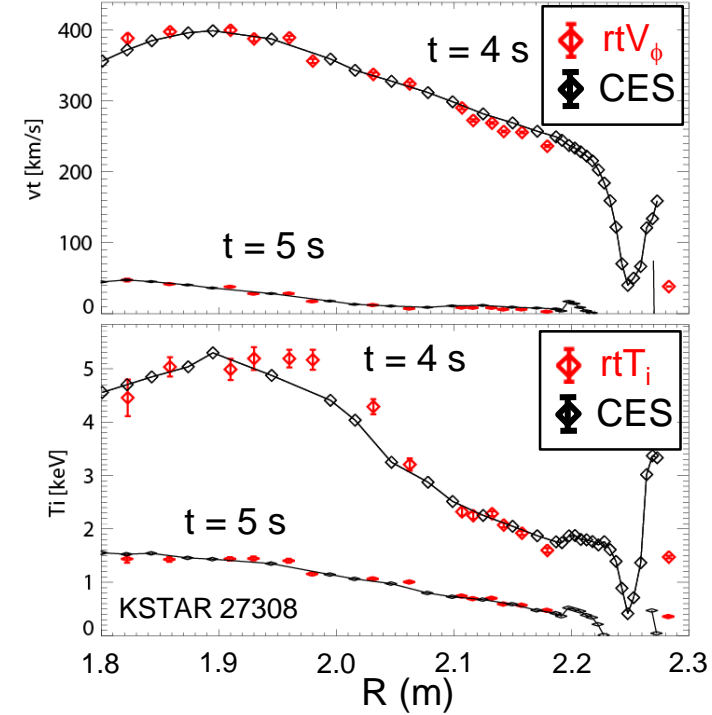
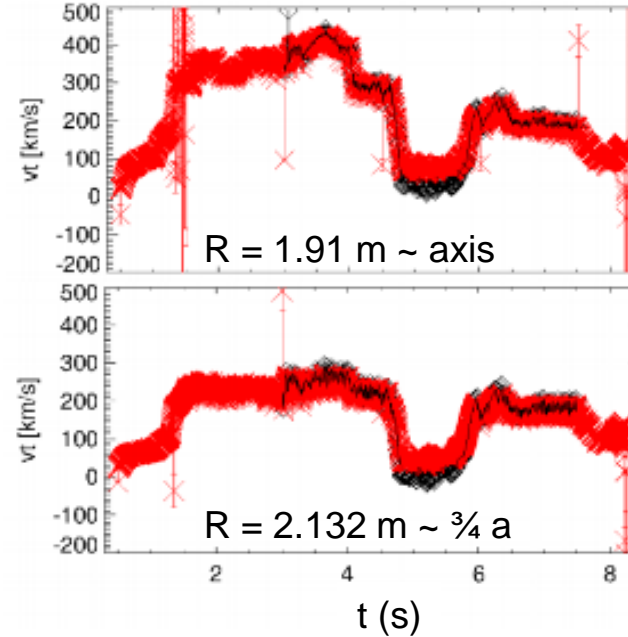
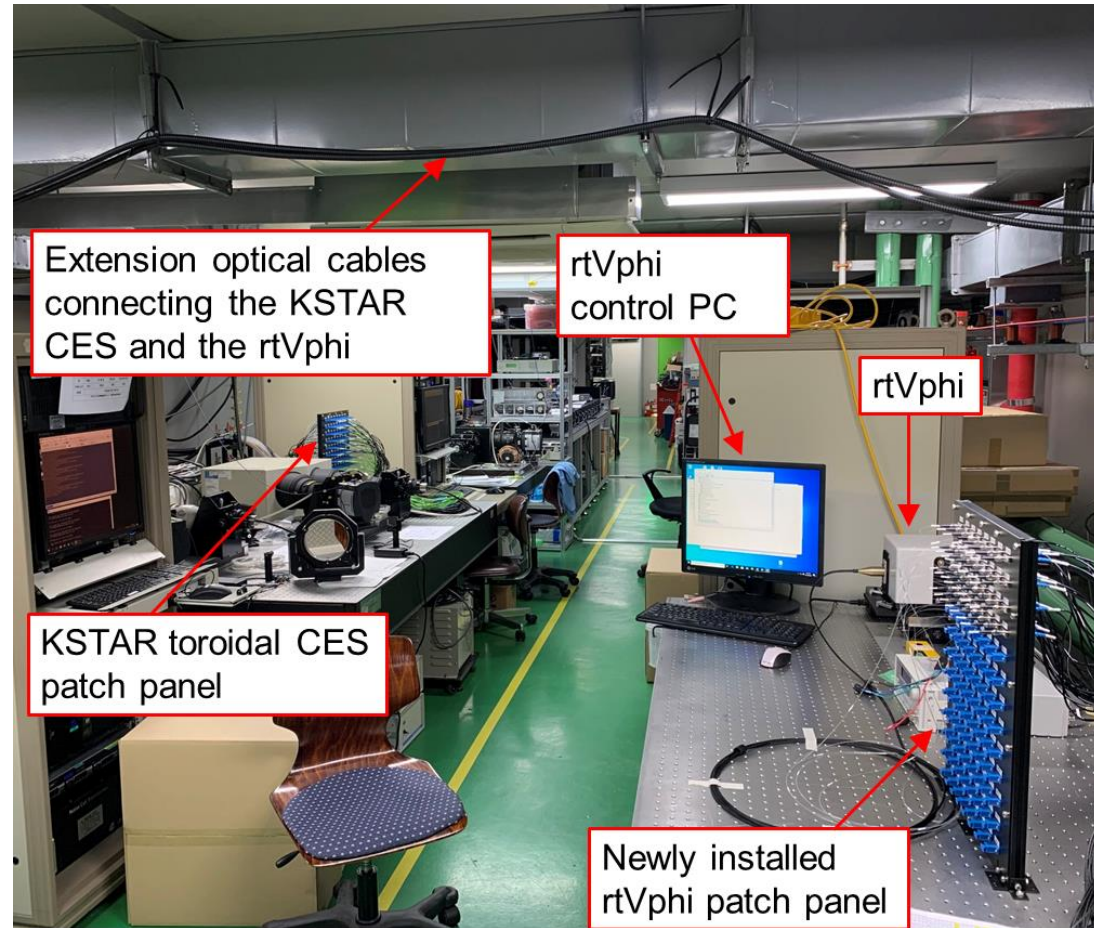


# Initial real-time toroidal velocity, ion temperature diagnostic ( $rtV_\phi$ ) shows very good agreement with KSTAR CES system

## KSTAR real-time $V_\phi$ , $T_i$ diagnostic

### $rtV_\phi$ time evolution (2 channels)

### $rtV_\phi$ , $rtT_i$ radial profiles



### $rtV_\phi$ data

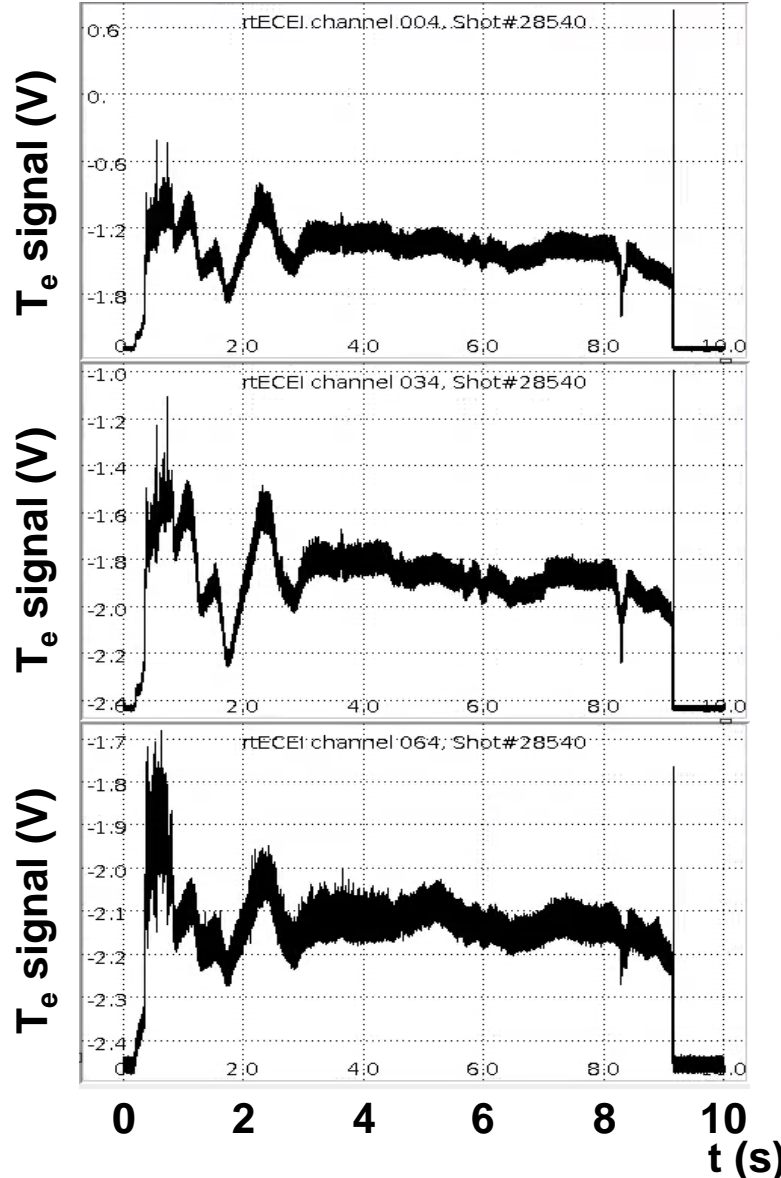
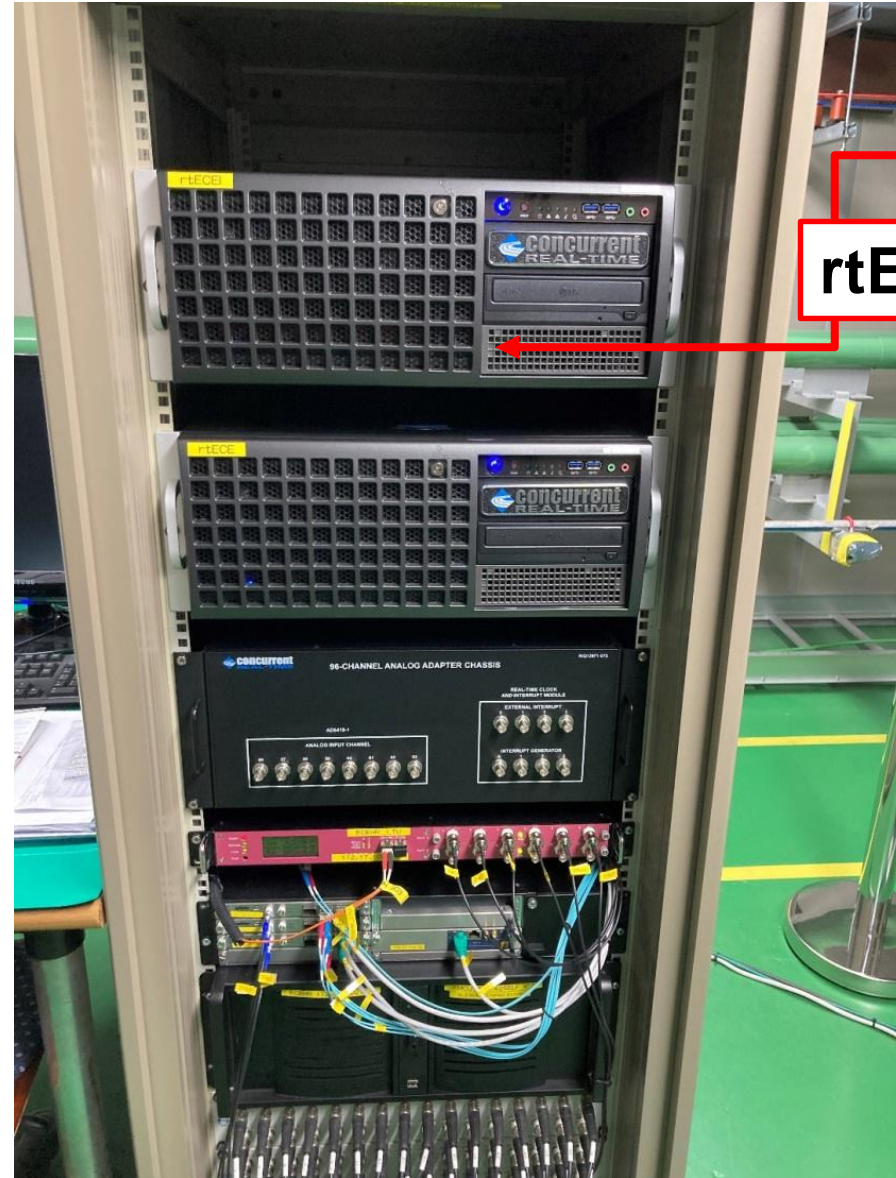
- First light taken for 32 radial channels
- Reduced to 16 radial channels at 1 kHz
- Offline CES analysis at 100 Hz

□ Newly-designed, final system to be installed for operation in 2022

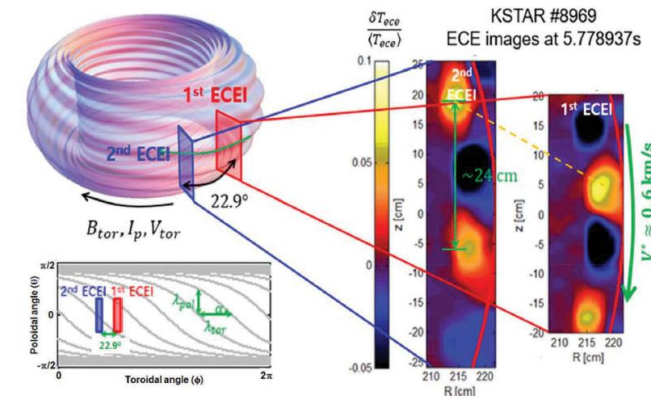
M. Podesta, J. Yoo (PPPL),  
Y.S. Park (CU), W.H. Ko (KFE)

□  $rtV_\phi$  and offline CES system share sightlines

# The first real-time ECEI data on KSTAR was taken as well in 2021 run campaign



- ❑ Full 2D poloidal cross-section acquired in r/t - 192 channels!
- ❑ 3 of 192 channels shown

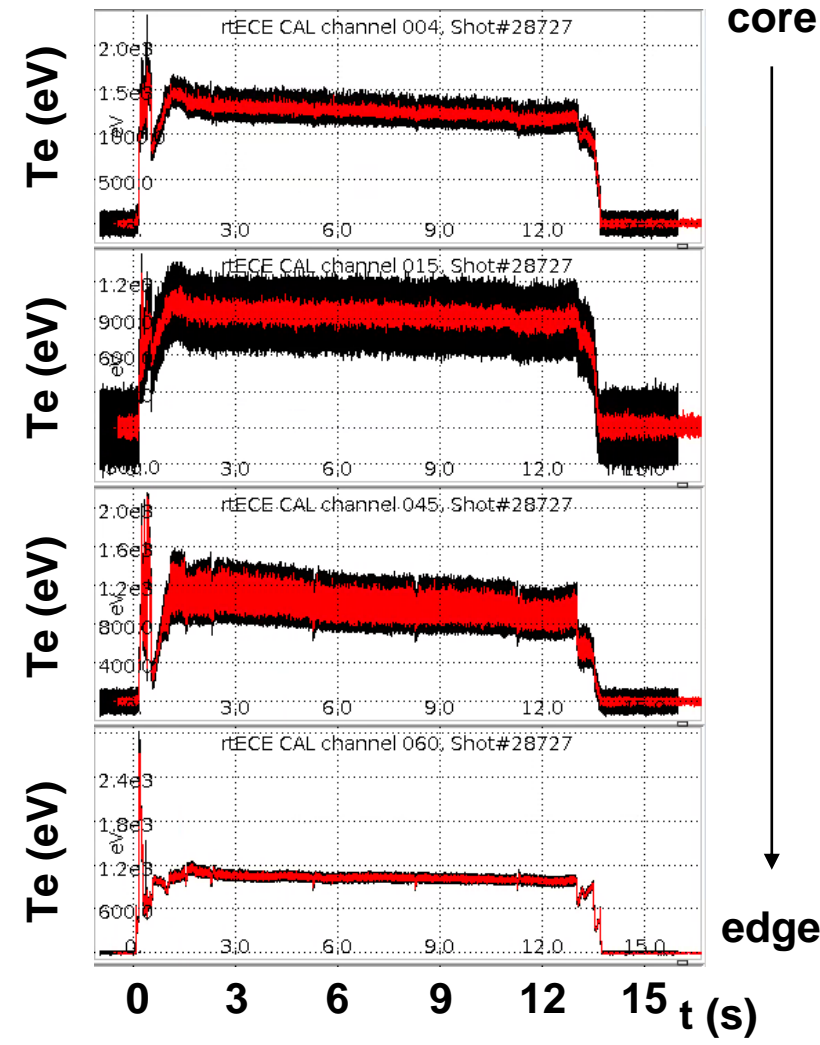
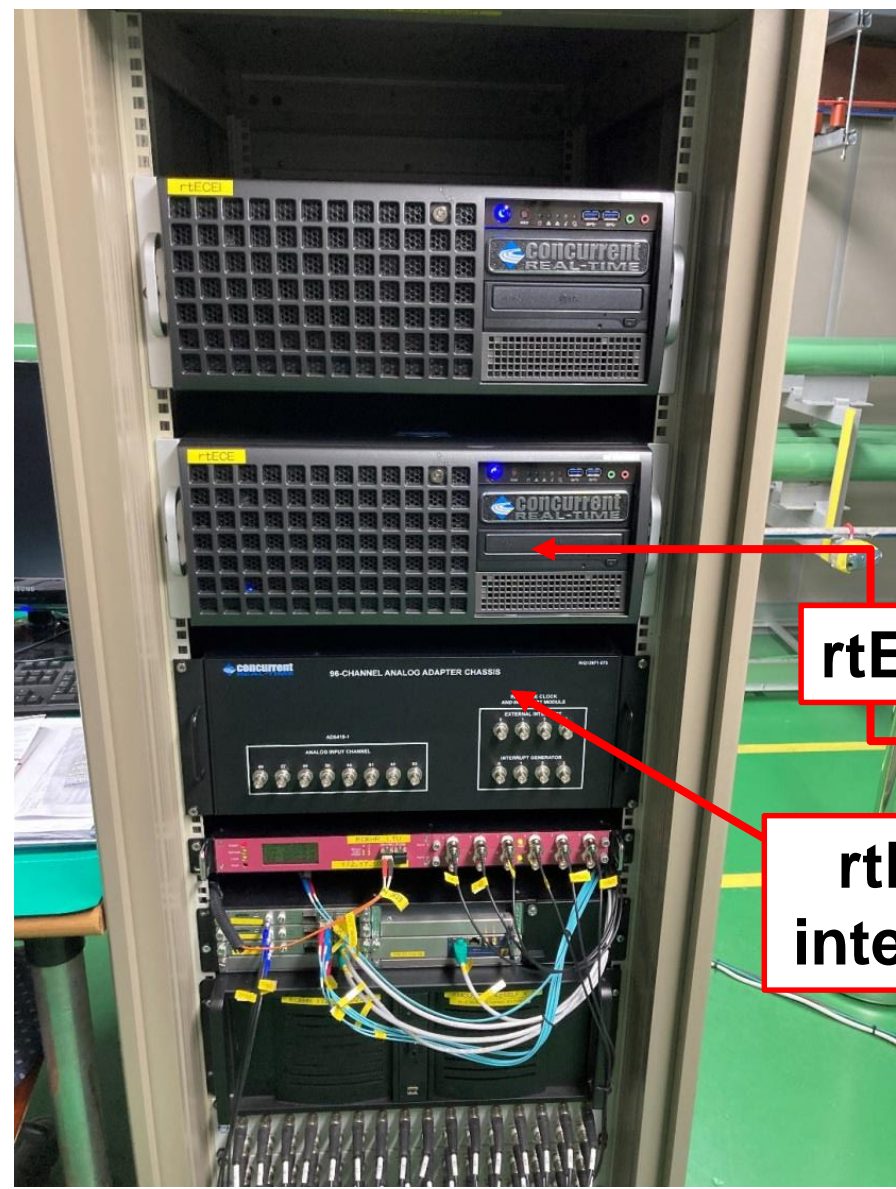


H.K. Park, Adv. in Physics: X, 4:1, 1633956 (2019)

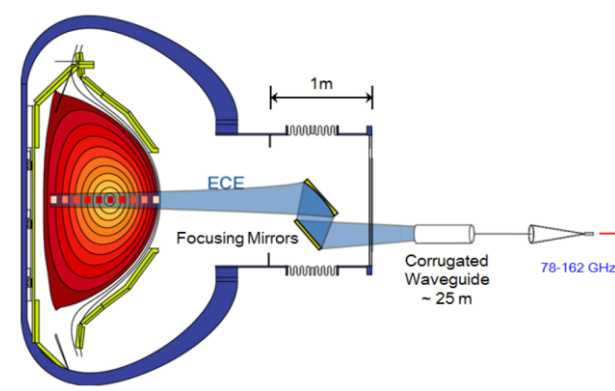
# The first real-time DECAF module in KSTAR PCS recently measured $T_e$ profile (in 2021 run campaign)

First real-time ECE data ( $T_e(R)$ )  
(red: real-time; black: off-line)

- ❑ R/t acquisition of heterodyne radiometer system
- ❑ 4 of 76 channels shown
- ❑ Real-time signal compensated and calibrated



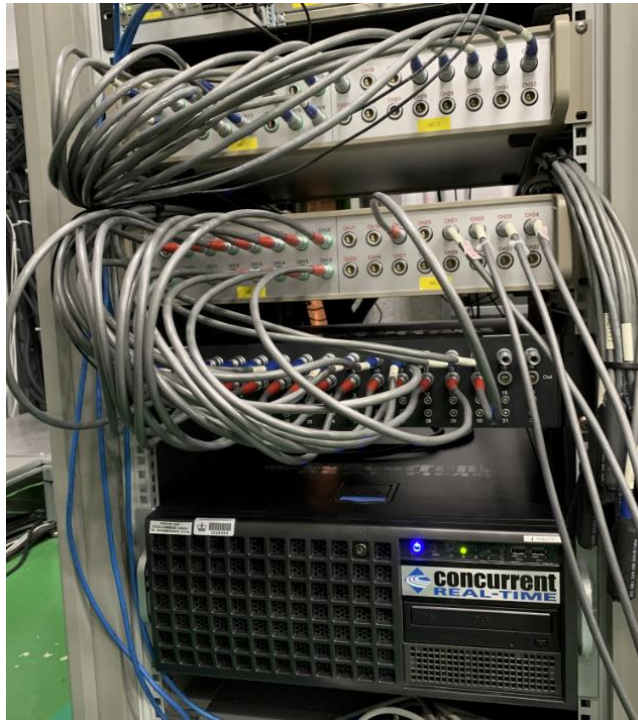
core  
↓  
edge



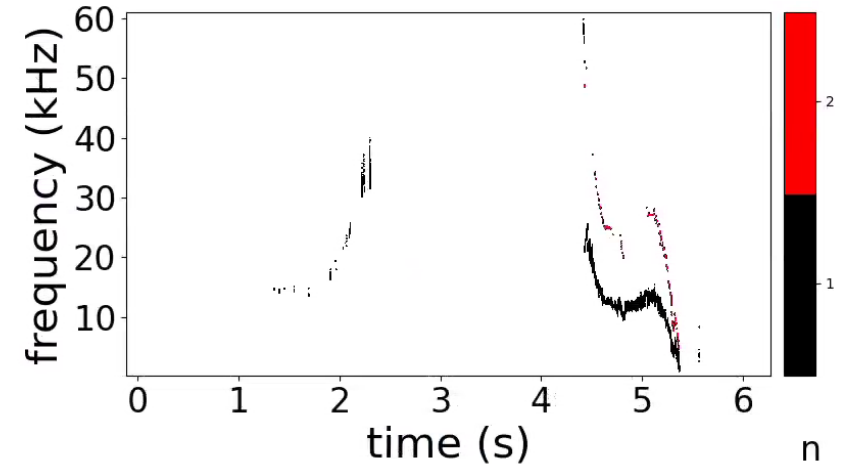
S.H. Jeong, K.D. Lee, et al.,  
RSI 81 (2010) 10D922

# Real-time MHD system on KSTAR computed real-time FFTs for first time in 2021 for real-time DECAF application

- Real-time MHD analysis computer installed on KSTAR
  - Connected to plasma control system (PCS)
  - Real-time FFT analysis taken in 2021 – comparison to offline

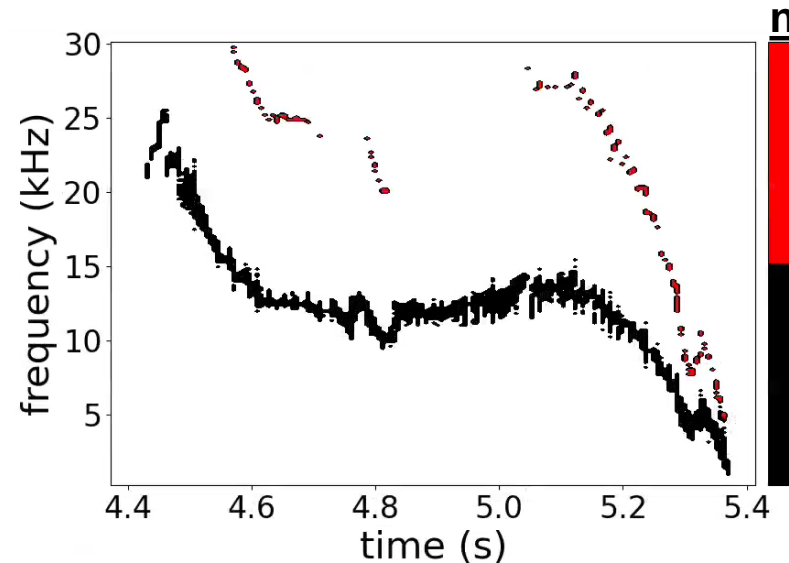


Magnetic probe array toroidal mode spectrogram (offline)

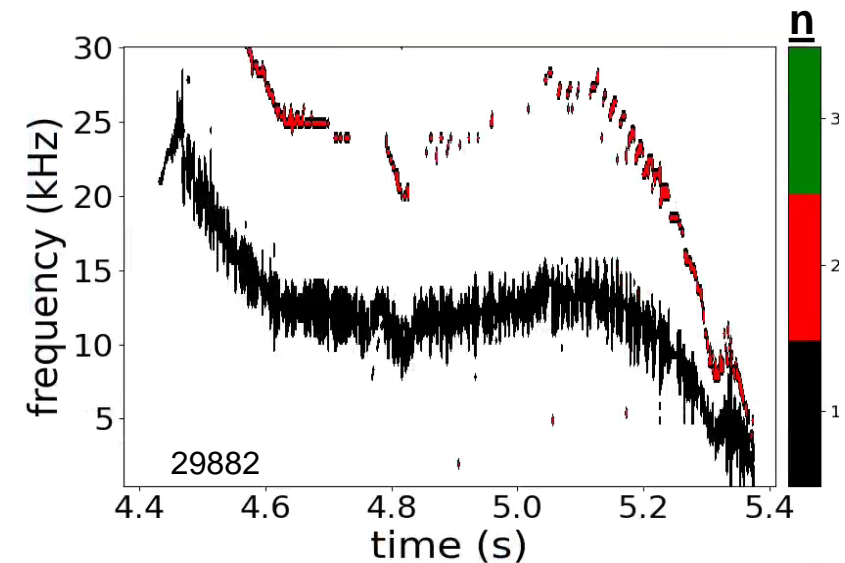


J. Riquezes (CU)

DECAF spectrogram (offline FFTs)

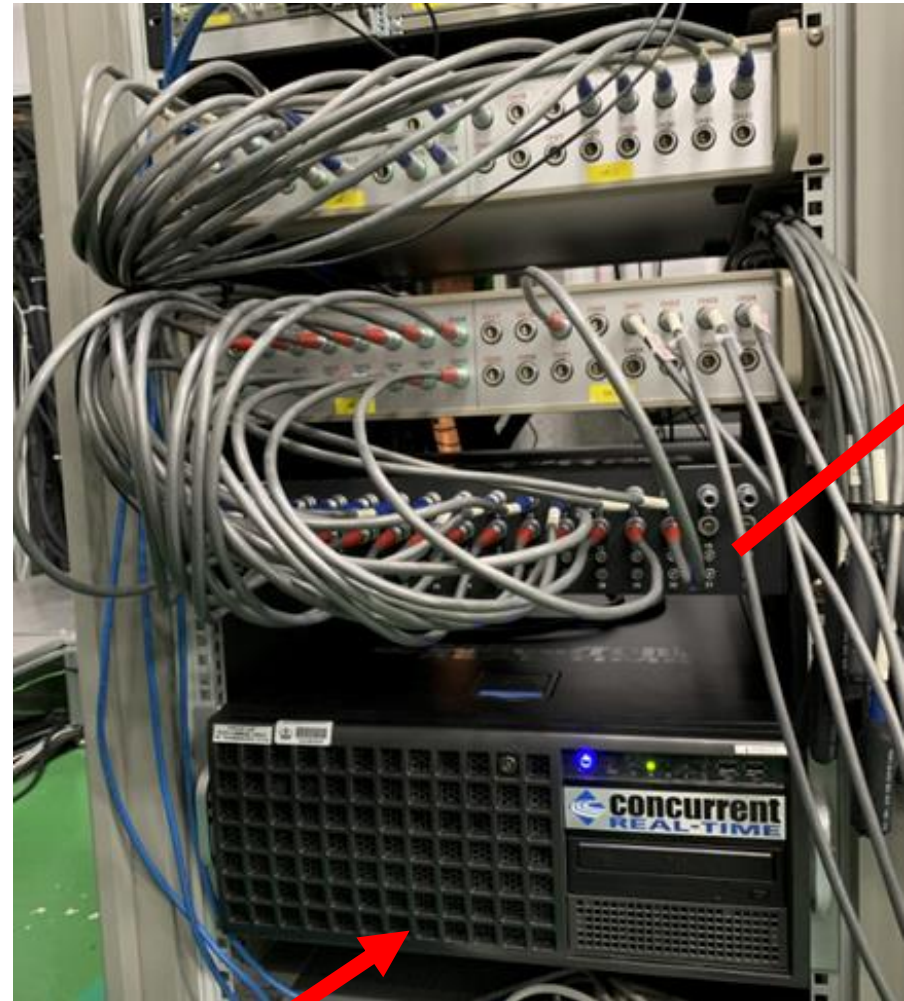


DECAF spectrogram (real-time FFTs)



# NSTX-U real-time MHD system implementation is part of our present grant research

## KSTAR rtMHD system



KSTAR real-time MHD computer, DAQ

## KSTAR buffer chassis (diagnostic interface box)



- Started discussions on NSTX-U system design
  - Diagnostic discussion with Eric F. and Stefano M.
  - Initial implementation / PCS interfacing discussion with Greg. T. and Frank H.
  - Discussion with Dan B. of in-common interfacing

## NSTX-U High-n system

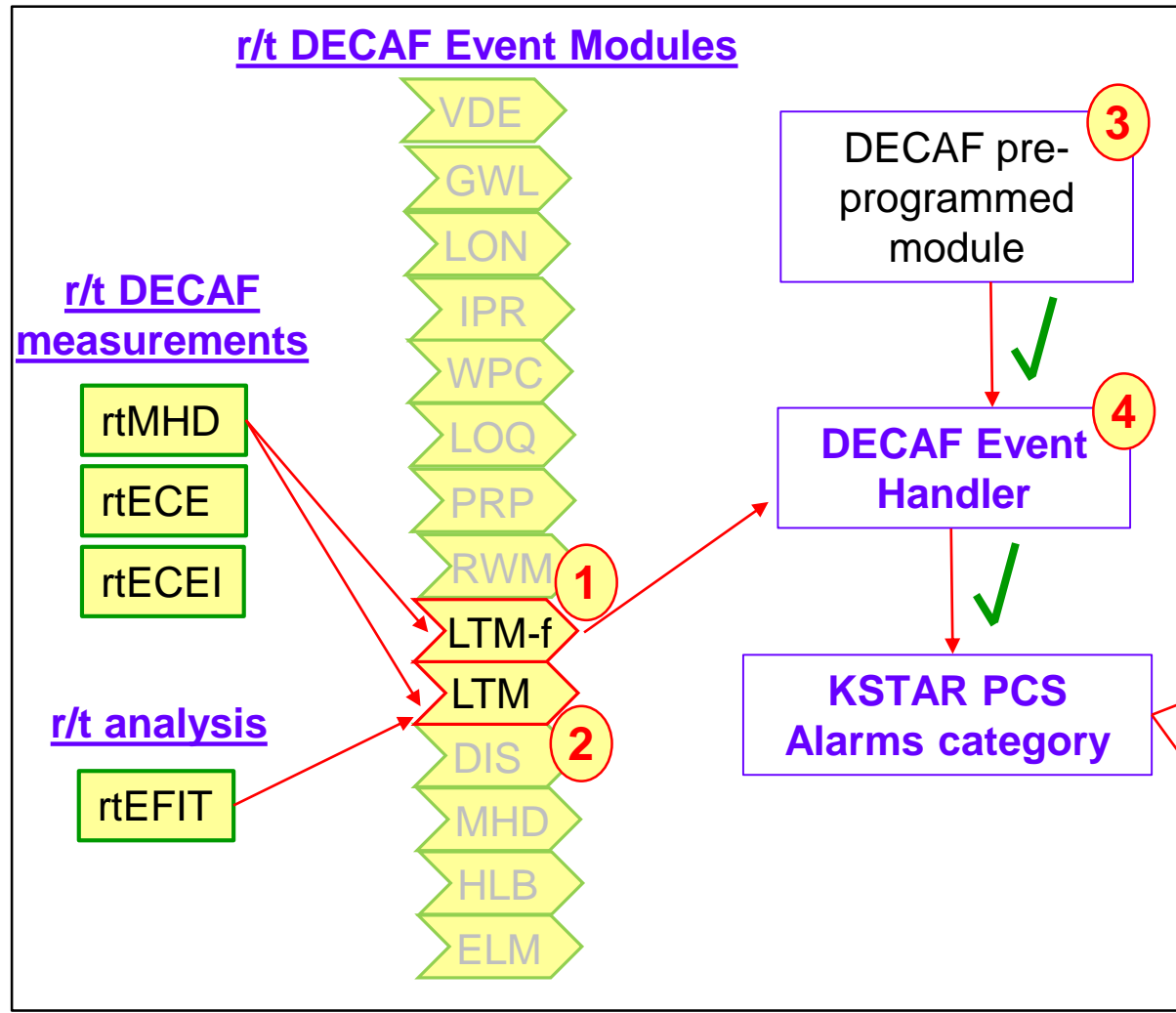


LEMO cables from high-n array mag probes

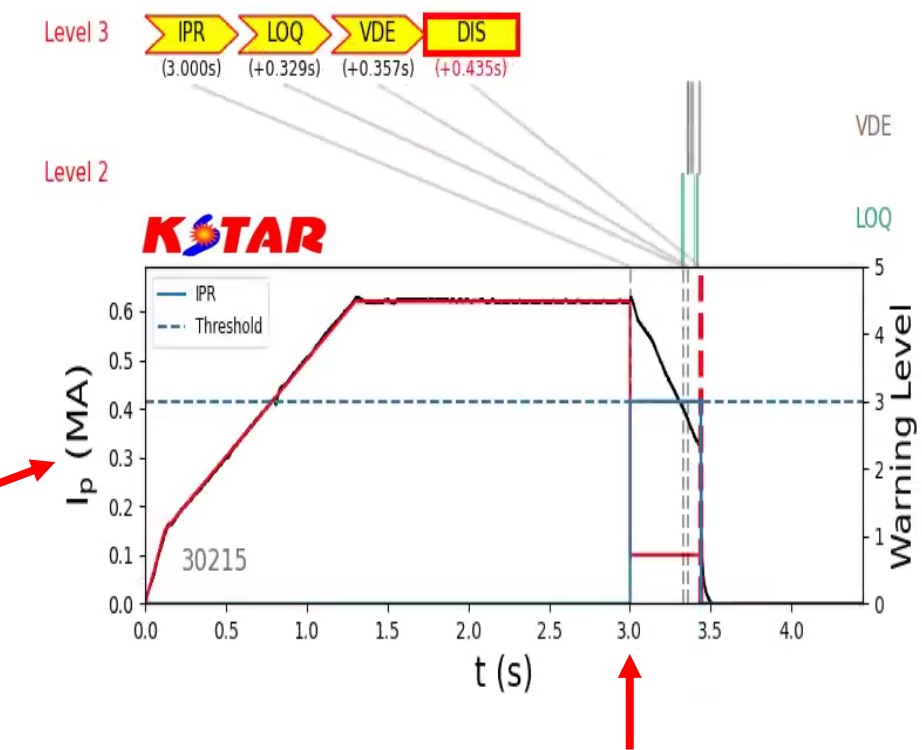
# r/t DECAF initial deployment: four real-time software elements were installed and tested in 2021 experiment

① - ④

## KSTAR PCS



- Offline and real-time DECAF codes follow similar design; DECAF events added as modules
- Demonstrated plasma shutdown through rtDECAF message



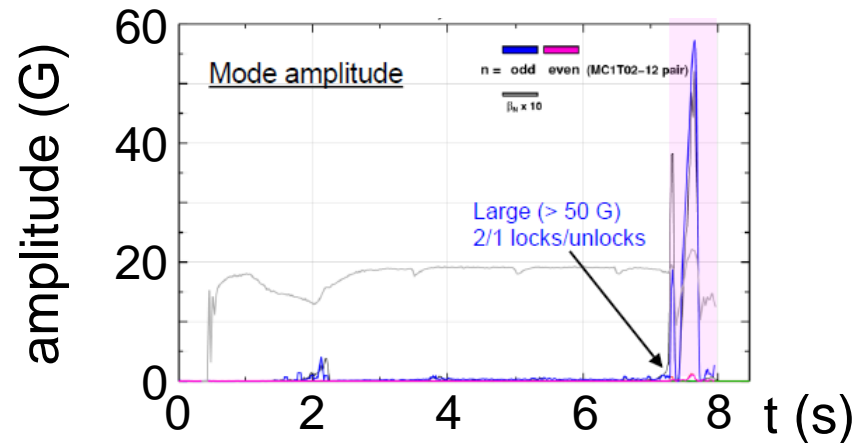
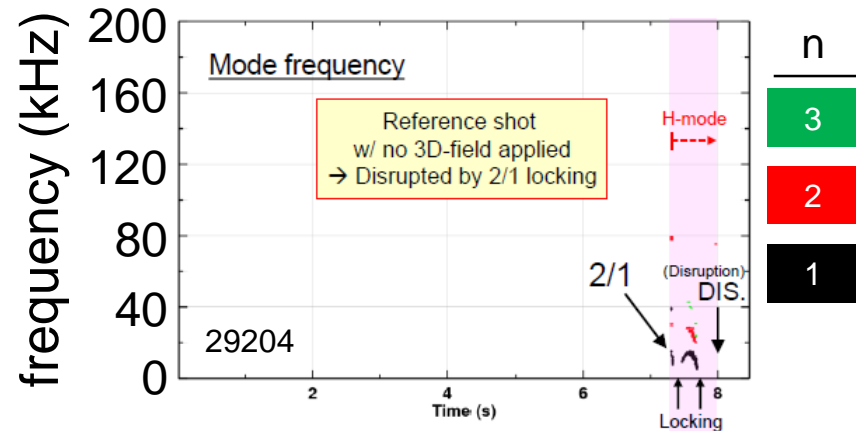
Controlled shutdown triggered

See M. Boyer, this meeting (related plasma control collaboration)

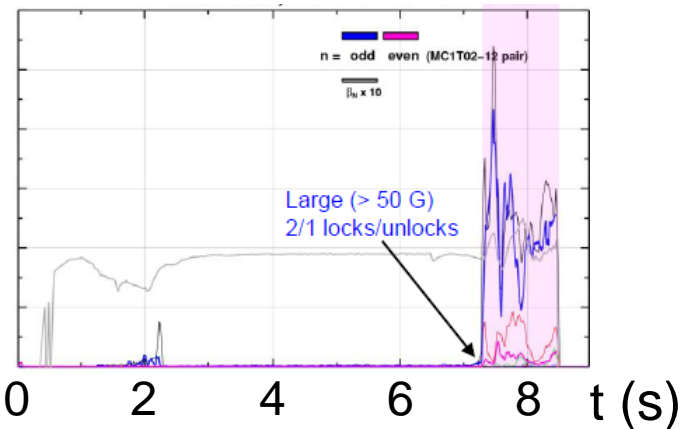
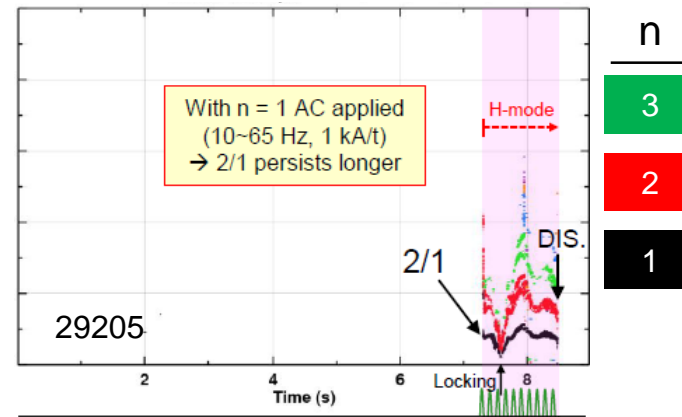
# New disruption avoidance actuator: applied entrainment field successful in preventing naturally-occurring 2/1 NTM locking (2021 experiment)

Magnetic spectrograms

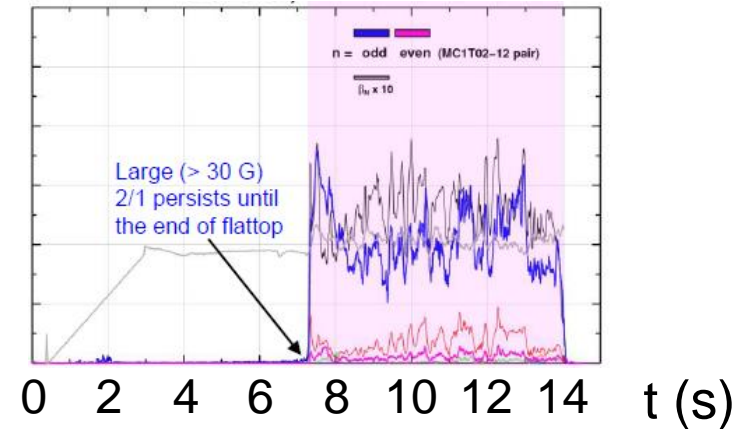
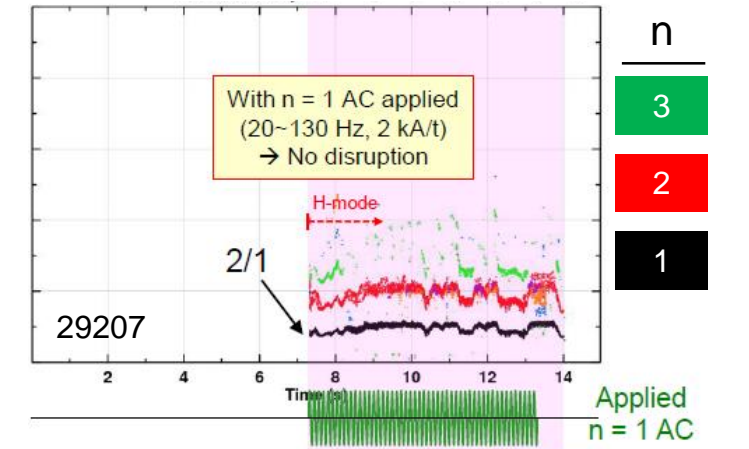
Natural locked NTM disruption



AC field lengthens shot duration



Disruption avoided with applied AC field



NOTE: applied AC field frequency is  $\ll$  mode rotation (analysis continues)

# Expanding Columbia U. Team at PPPL is conducting an international effort on disruption prediction / avoidance

- ❑ Eight CU scientists and students based at PPPL
  - ❑ Including 2 students
  - ❑ New full-time post-doc/student for NSTX-U grant
- ❑ Innovative high beta, long-pulse, non-inductive superconducting tokamak plasma research on KSTAR
- ❑ Compact, high beta spherical tokamak plasma research on MAST-U and NSTX-U

**Full access to databases of 6 world-leading tokamaks**  
(and expanding to more devices...)

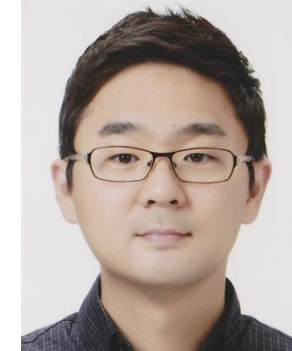
**We are hiring post-doctoral researchers and presently offering one student GRA! → Email: [sabbagh@pppl.gov](mailto:sabbagh@pppl.gov)**



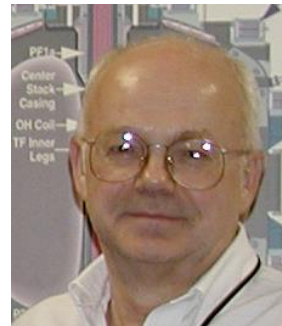
S.A. Sabbagh



J.W. Berkery



Y.S. Park



J.M Bialek



V. Klevarova



J. Butt

**STUDENTS**



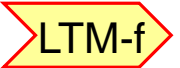
J. Riquezes



M. Tobin



# DECAF disruption prediction and avoidance research continues and has expanded to real-time implementation on KSTAR

- ❑ Multi-device, integrated approach to disruption prediction and avoidance that meets disruption predictor requirement metrics
  - ❑ Physics-based “event chain” yields key understanding of evolution toward disruptions needed for confident extrapolation of forecasting, control
  - ❑ Full multi-machine databases. Performance  $\sim 10^4$  shots : 91.2% true positive rate → keep improving!
  - ❑ Supporting physics analysis, experiments run to create, validate models, expand operating space
- ❑ DECAF producing early warning disruption forecasts
  - ❑ On transport timescales: → guide disruption avoidance by profile control
  - ❑ Research continues / expands disruption forecasting performance analysis (→ ITER  $\sim 98\%+$  level)
- ❑ DECAF expansion to real-time implementation (KSTAR)
  - ❑ Real-time acquisition of magnetics (MHD) r/t FFT analysis,  $V_\phi$ ,  $T_i$ ,  $T_e$ ,  $\delta T_e$ , (B pitch angle,  $\delta B$  coming)
  - ❑ Implemented, tested initial DECAF disruption events, forecasting models in real-time (e.g. )
- ❑ New disruption avoidance actuator demonstrated on KSTAR using 3D applied field

**We are hiring post-doctoral researchers and offering a student GRA! → Email: [sabbagh@pppl.gov](mailto:sabbagh@pppl.gov)**

# Supporting Slides Follow

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# DECAF related presentations at the APS DPP 2021 Meeting

- ❑ **Mon AM:** J.W. Berkery et al. (BP11.00016): Equilibrium Reconstructions, Stability Calculations, and Disruption Event Characterization of Plasmas in the MAST and MAST Upgrade Spherical Tokamaks
- ❑ **Tue PM:** V. Klevarova et al. (JP11.00059): Implementation of MHD-mode Induced Disruption Forecaster into the DECAF Code
- ❑ **Wed 3 PM:** S. A. Sabbagh et al. (PO09.00006): Tokamak Disruption Event Characterization and Forecasting Research and Expansion to Real-Time Application in KSTAR
- ❑ **Wed 3:12 PM:** J. D. Riquezes et al. (PO09.00007): Torque balance analysis of rotating MHD for disruption prediction and avoidance in KSTAR
- ❑ **Wed PM:** A. Piccione, et al. (PP11.00142): “Resistive Wall Mode Stability Forecasting in NSTX through Balanced Random Forests and Counterfactual Explanations
- ❑ **Thu AM:** J. Butt et al. (TP11.00109): Edge-Localized Mode Detection and Correlation with Rotating MHD modes for Disruption Event Characterization and Forecasting
- ❑ **Thu AM:** Y. Jiang et al. (TP11.00111): Kinetic Equilibrium Reconstruction of KSTAR and the Impact on Stability Analysis of High Performance Plasmas