

Disruption Event Characterization and Forecasting (DECAF) in Tokamaks

S.A. Sabbagh¹, J.W. Berkery¹, Y.S. Park¹, J.H. Ahn¹, Y. Jiang¹, J.D. Riquezes¹, R.E. Bell², M.D. Boyer², A.H. Glasser³, J. Hollocombe⁴, J. Kim⁵, A. Kirk⁴, J. Ko⁵, W. Ko⁵, L. Kogan⁴, B. LeBlanc², J.H. Lee⁵, Y.K. Oh⁵, F. Poli², S.D. Scott², A. Thornton⁴, L. Terzolo⁵, S.W. Yoon⁵, S.J. Wang⁵, Z.R. Wang²

¹*Department of Applied Physics, Columbia University, New York, NY*

²*Princeton Plasma Physics Laboratory, Princeton, NJ*

³*Fusion Theory and Computation, Inc., Kingston, WA*

⁴*Culham Centre for Fusion Energy, UKAEA, Abingdon, UK*

⁵*National Fusion Research Institute, Daejeon, Republic of Korea*



60th APS Division of
Plasma Physics Meeting

6 November 2018

Portland, OR

MAST-U

KSTAR

NSTX-U



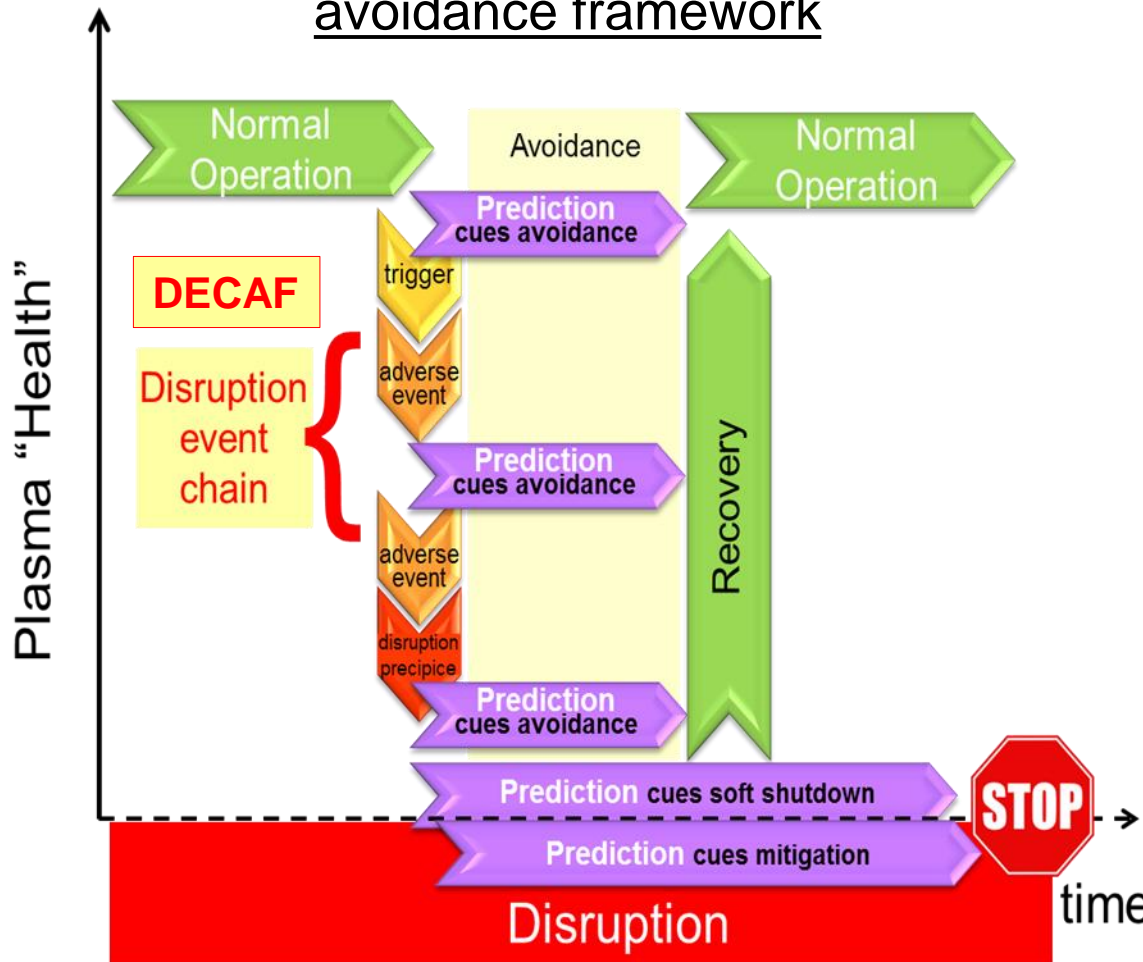
A broadened disruption prediction and avoidance approach is progressing for ITER and future tokamaks

- ❑ Motivation: Disruption prediction/avoidance is a critical need
 - ❑ Why? A disruption stops plasma operation, might cause device damage
 - ❑ A highest priority DOE FES (Tier 1) initiative - **present “grand challenge”** in tokamak stability research:
 - Can be done! (JET tokamak: < 4% disruptions with carbon wall)
 - ITER disruption allowance: < 1 - 2% (energy + E&M loads); << 1% (runaways)

- ❑ **Talk Outline**
 - ❑ Disruption predictor requirement metrics
 - ❑ Disruption Event Characterization and Forecasting (**DECAF**) approach
 - ❑ Physical models in DECAF, continued progress toward early prediction
 - ❑ Initial multiple-device, large database analysis
 - ❑ Present evolution of disruption forecasting performance

DECAF is a logical, physics-based paradigm that meets all disruption predictor requirement metrics

DECAF in disruption prediction / avoidance framework

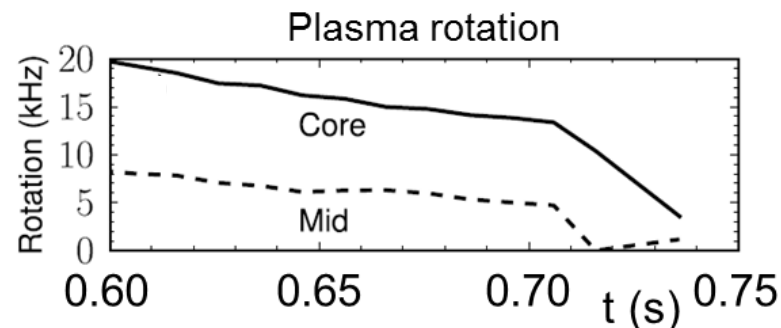
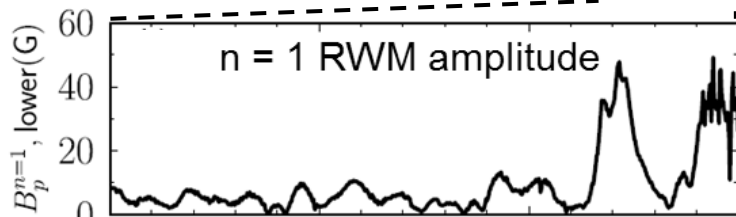
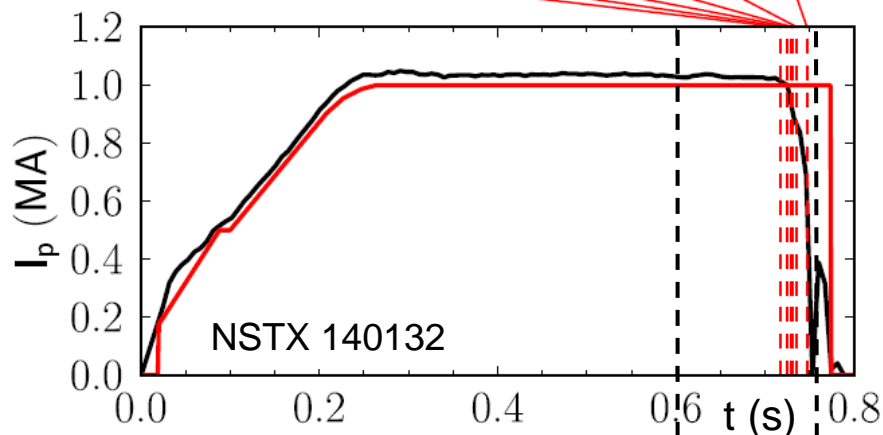
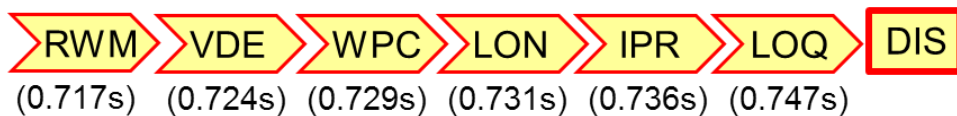


❑ Disruption predictor must

- ✓ Predict SPECIFIC pre-disruptive phenomena → link to control
- ✓ Provide CONTINUOUS variable quantifying proximity (& can GENERATE triggers)
- ✓ Provide SUFFICIENT LEAD TIME for mitigation or avoidance
- ✓ Be EXTRAPOLABLE to new device (e.g. ITER) prior to operation
- ✓ Be REAL-TIME calculable

D. Humphreys, et al., PoP 22 (2015) 021806

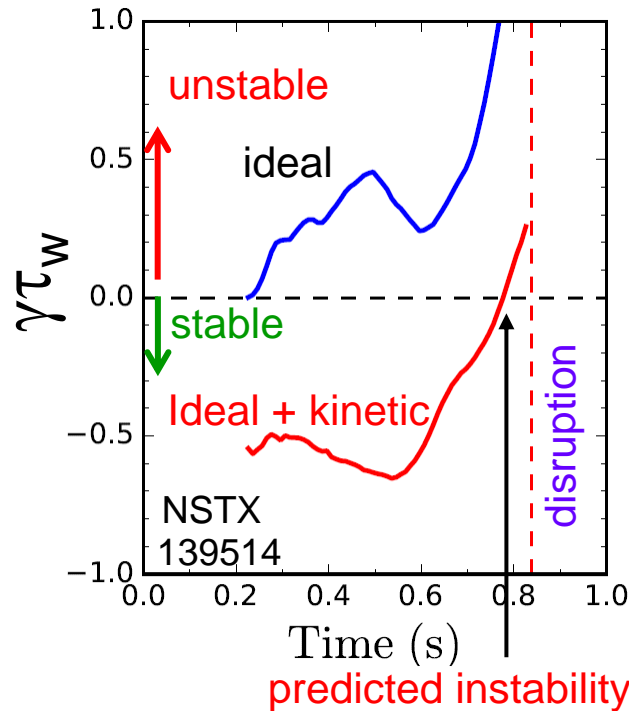
DECAF determines disruption triggers and automatically generates event chains



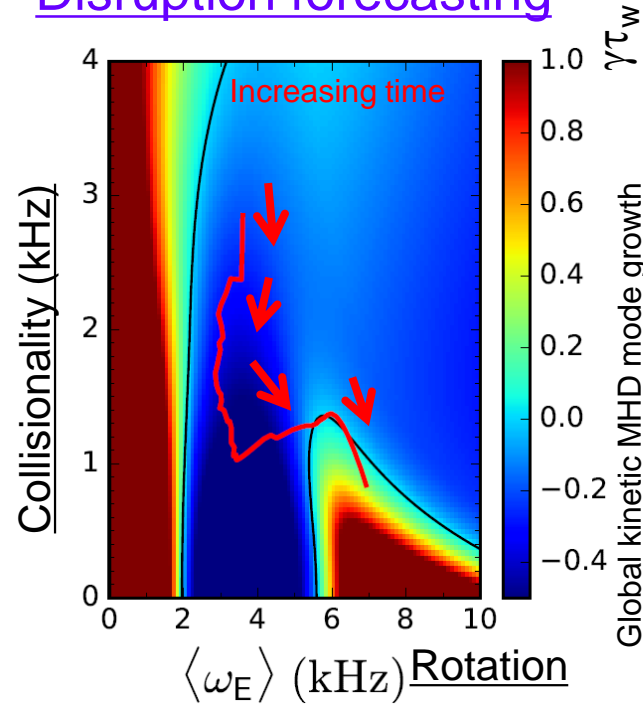
- ❑ Global MHD mode trigger
- ❑ Warning time: 30 ms
- ❑ Absolute: Just sufficient time for disruption mitigation in ITER
- ❑ Normalized: ~ 6 RWM growth times in NSTX – far longer time (~ s) in ITER
- ❑ **Events (in this chain)**
 - ❑ RWM resistive wall mode
 - ❑ VDE vertical instability
 - ❑ WPC wall proximity control
 - ❑ LON low density warning
 - ❑ IPR not meeting I_p request
 - ❑ LOQ low q warning
 - ❑ DIS disruption (current quench)

Reduced kinetic MHD model in DECAF provides **early forecast** of instability boundary to global MHD modes

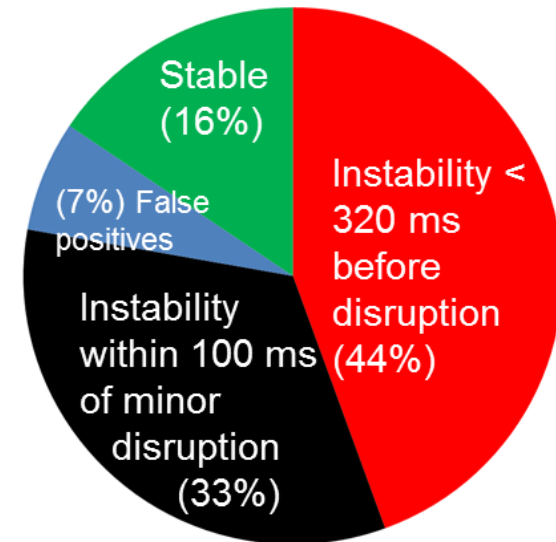
Norm. growth rate vs. time



Disruption forecasting



Predicted instability statistics

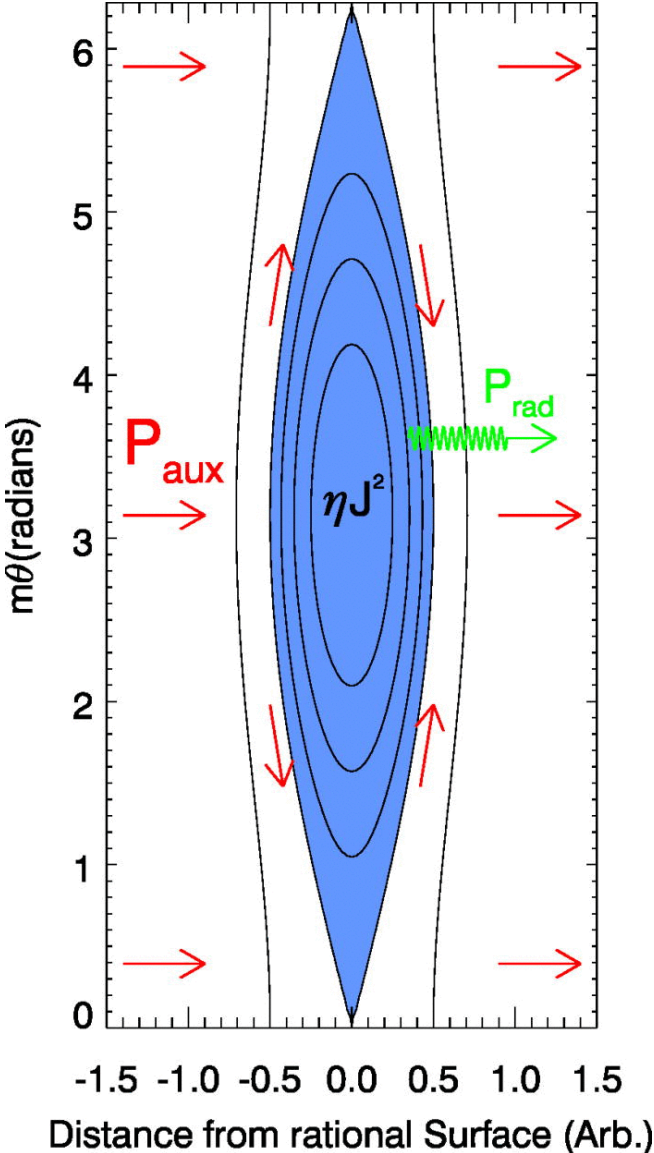


- ❑ Full physics model (years of effort) reduced
 - ❑ Stability contours CHANGE for each time point
 - ❑ Allows real-time stability and mode growth rate prediction

- ❑ 84% of shots are predicted unstable (**stringent evaluation**)
- ❑ 44% predicted unstable < 320 ms (approx. $60\tau_w$) before current quench
- ❑ 33% predicted unstable within 100ms of a minor disruption

J.W. Berkery, S.A. Sabbagh, R. Bell, *et al.*, Phys. Plasmas **24** (2017) 056103

Recently a density limit model has been examined in DECAF based on power balance in an island

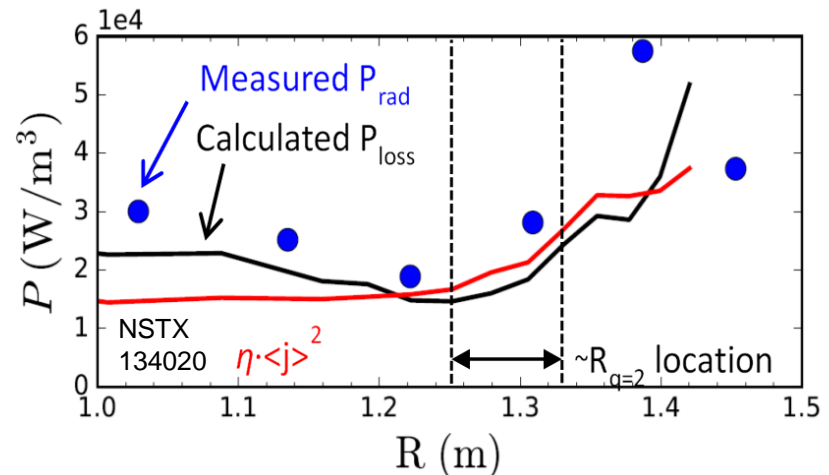


Local island power balance limit

- Power balance in island between Ohmic heating and radiated power loss
- If radiated power at the island exceeds the input power ($P_{loss} > P_{input}$), island grows

Power density balance: $P_{loss} < P_{input}$

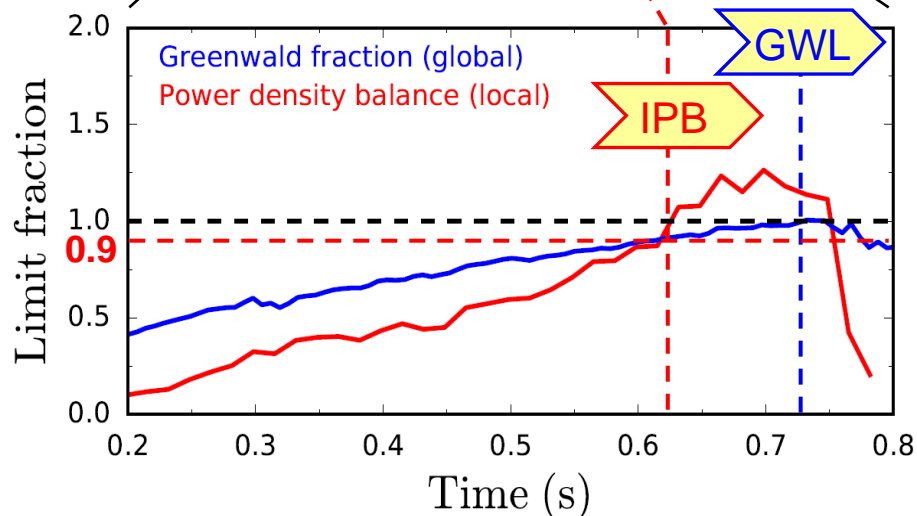
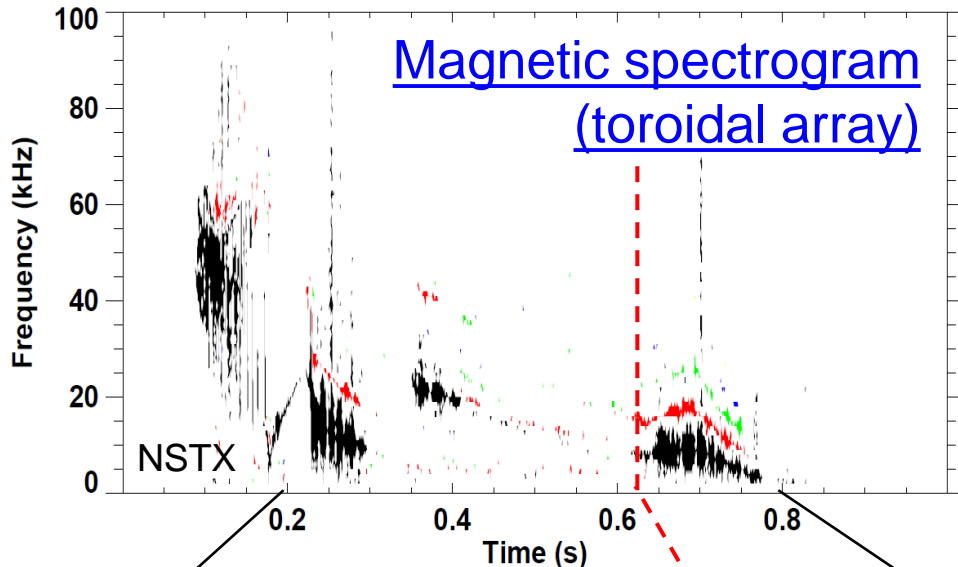
$$n_e n_D L_D(T_e) + \sum n_e n_Z L_Z(T_e) < \eta j^2$$



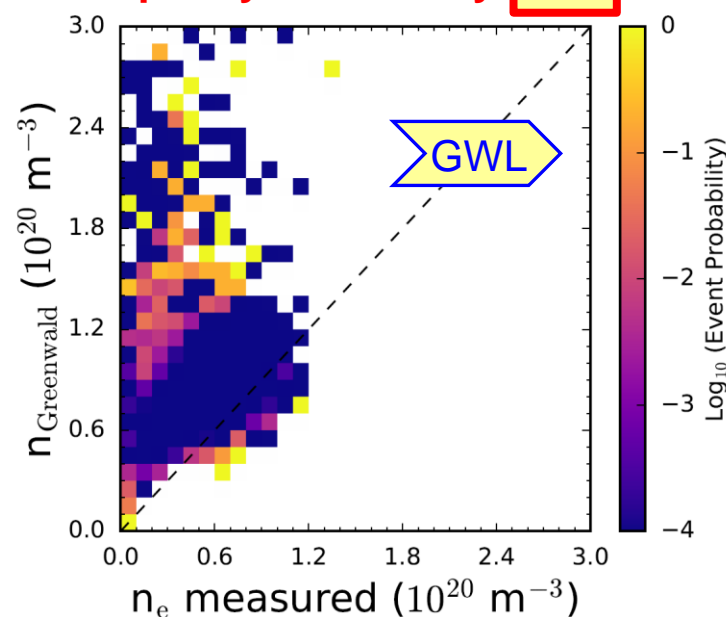
D. Gates et al., Phys. Rev. Lett. **108** 165004 (2012)

DECAF density limit analysis started: global, local density limits examined, correlation of MHD onset near limits

Shot 134020 $\omega B(\omega)$ spectrum for toroidal mode number: 1 2 3 4 5



Disruptivity vs. density DIS



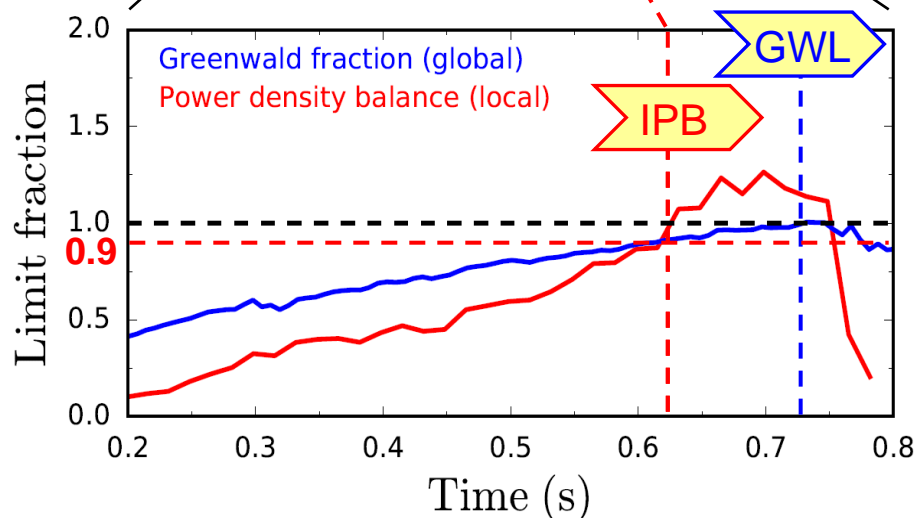
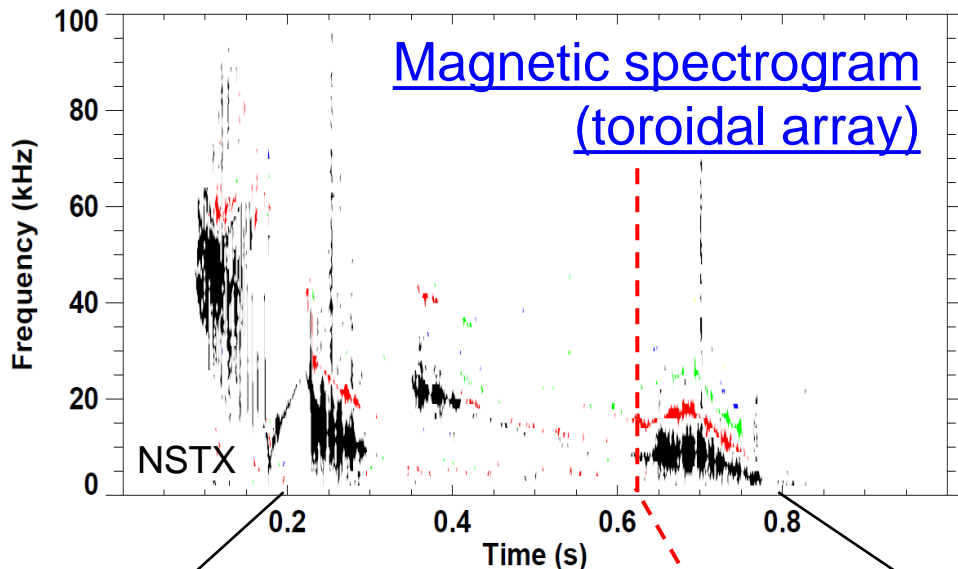
- Greenwald limit **GWL**
 - Near 0.9 when mode starts (range 0.75 – 1.05)
- Rad. island power balance **IPB**
 - Near 1.0 when mode starts (range 0.60 – 1.50) ← **next step: reduce range**

See CP11.00095: J.W. Berkery

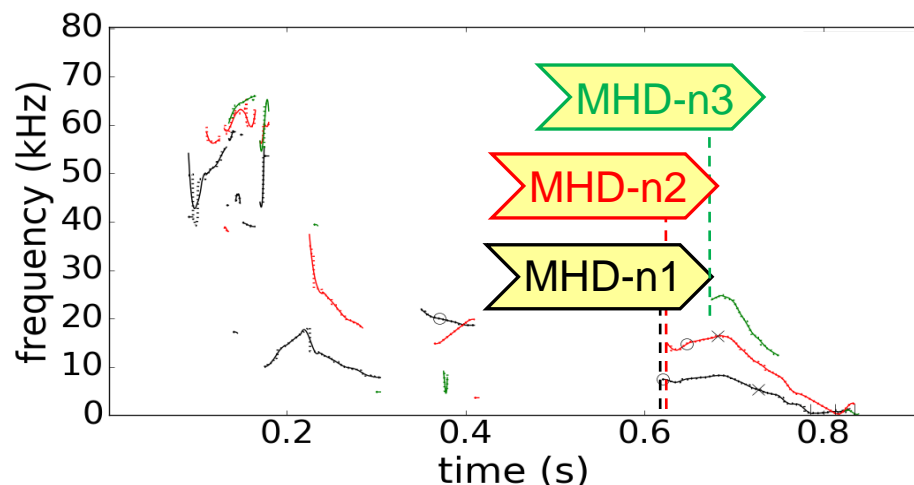
More powerful automated MHD event objects have been developed for DECAF

Shot 134020 $\omega B(\omega)$ spectrum

for toroidal mode number: 1 2 3 4 5



DECAF automated MHD events

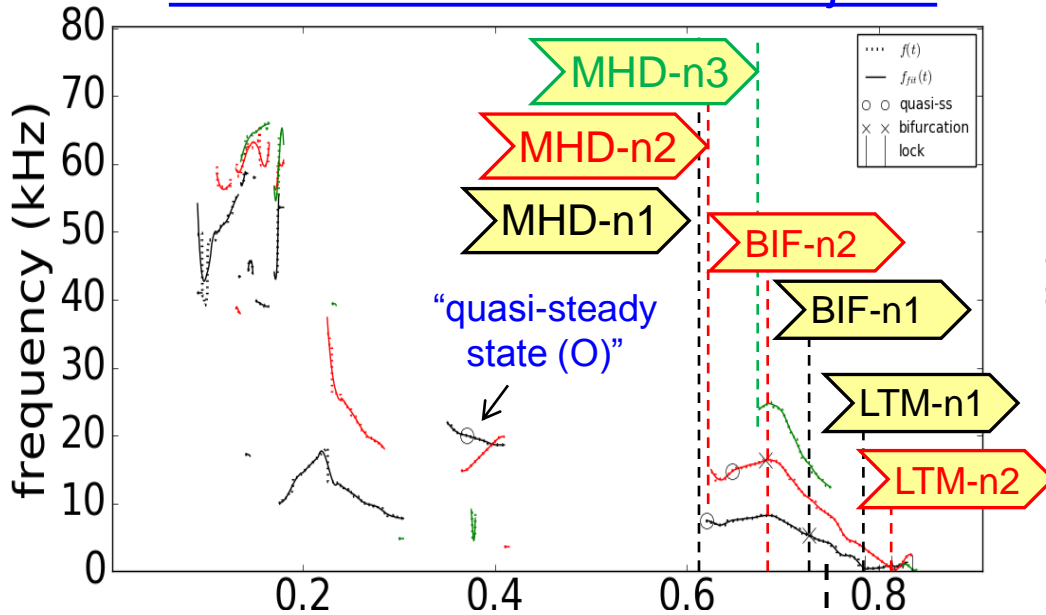


- ❑ More capable MHD event objects required for analysis of wider tokamak databases
- ❑ DECAF MHD events now include
 - ❑ Mode number (n) discrimination
 - ❑ Full history of mode evolution, including bifurcation and locking
 - ❑ Many disruption warning criteria

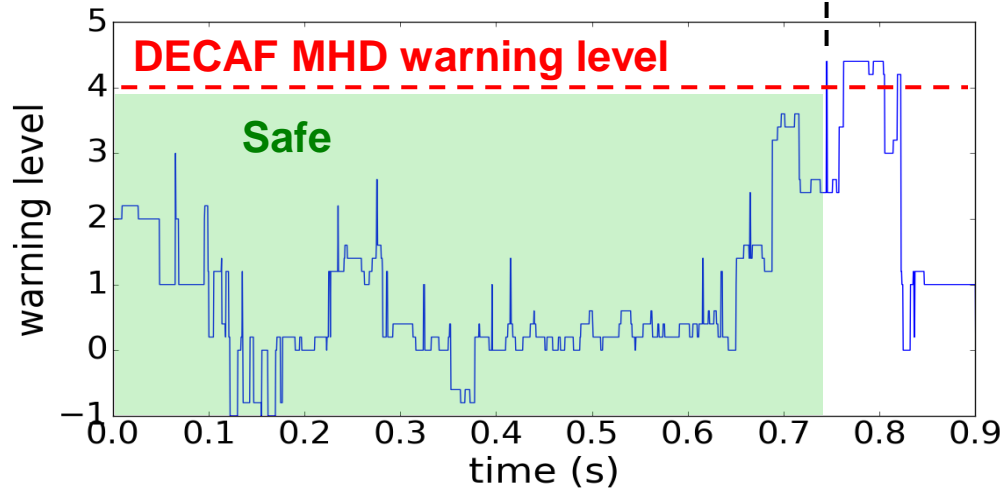
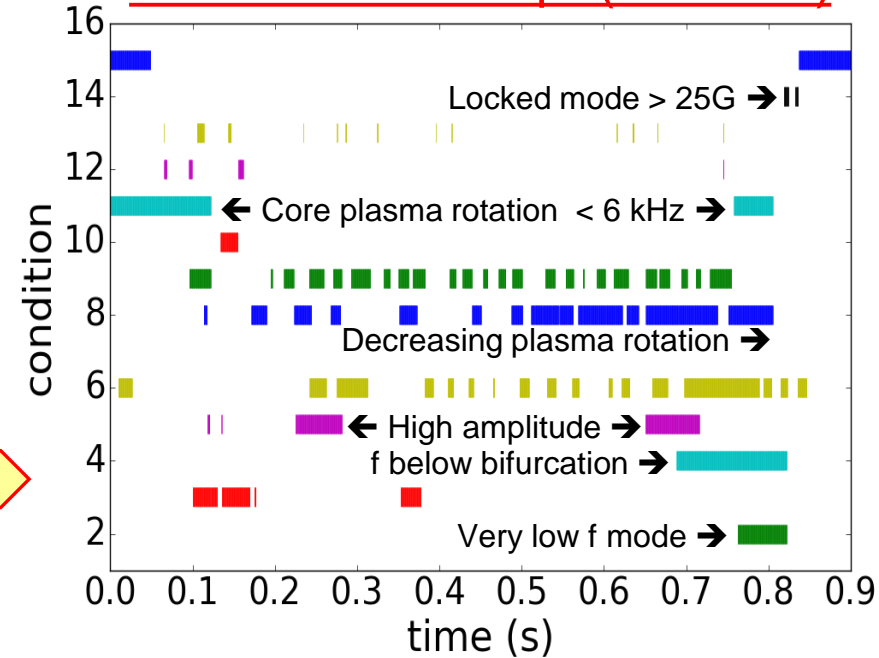
See CP11.00110: J.D. Riquezes

New DECAF MHD events utilize history of 15 criteria to define time evolving disruption warning level

DECAF automated MHD objects



DECAF “heat map” (for MHD)



- Key notables of MHD warning
 - “Safe”/“unsafe” MHD periods found
 - Early, slow warning level evolution
 - Locked mode amplitude important, but warning comes in very late
 - Mode frequency below bifurcation, decreasing plasma rotation key

Progress on DECAF now moving to processing of multi-machine databases

Analysis

- Kinetic equilibrium / stability analysis on KSTAR; planned for MAST

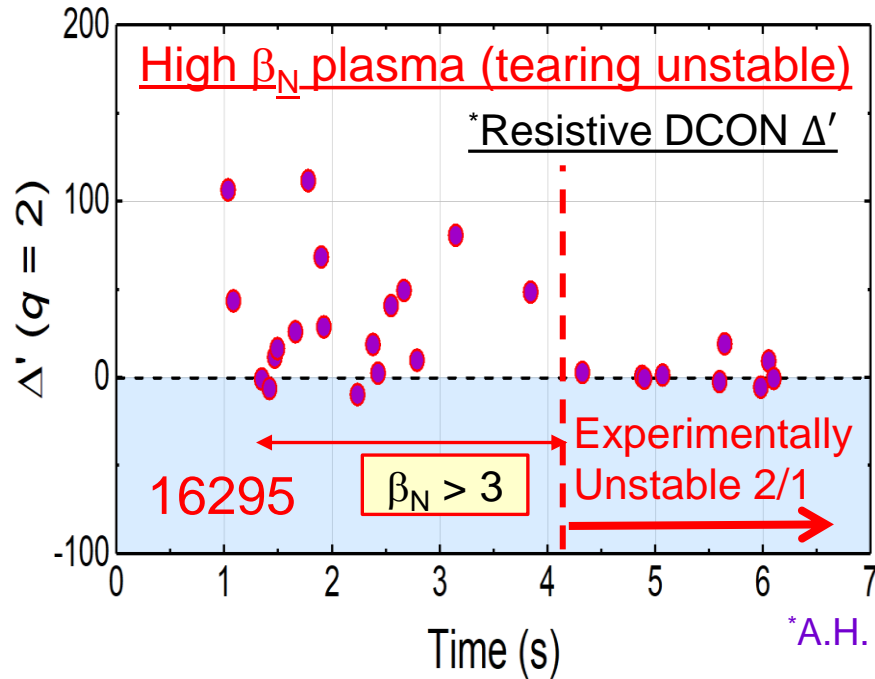
Device / Capability	KSTAR	MAST	NSTX	DIII-D	TCV
Full database access (type)	Yes (MDSplus)	Yes (UDA)	Yes (MDSplus)	Yes (MDSplus)	Yes (MDSplus)
Database analysis	continuing	continuing	continuing		started
Equilibrium analysis	Kinetic + MSE	scheduled	Kinetic + MSE	available	
Stability	Ideal, Resistive Kinetic MHD	scheduled	Ideal, kinetic MHD (resistive)	Ideal, kinetic MHD	
shot*seconds (for kinetic analysis)	1,886 (2016+2017)	2,667 (est) (M5 - M9 runs)	2,000 / year (est)		

DECAF database started

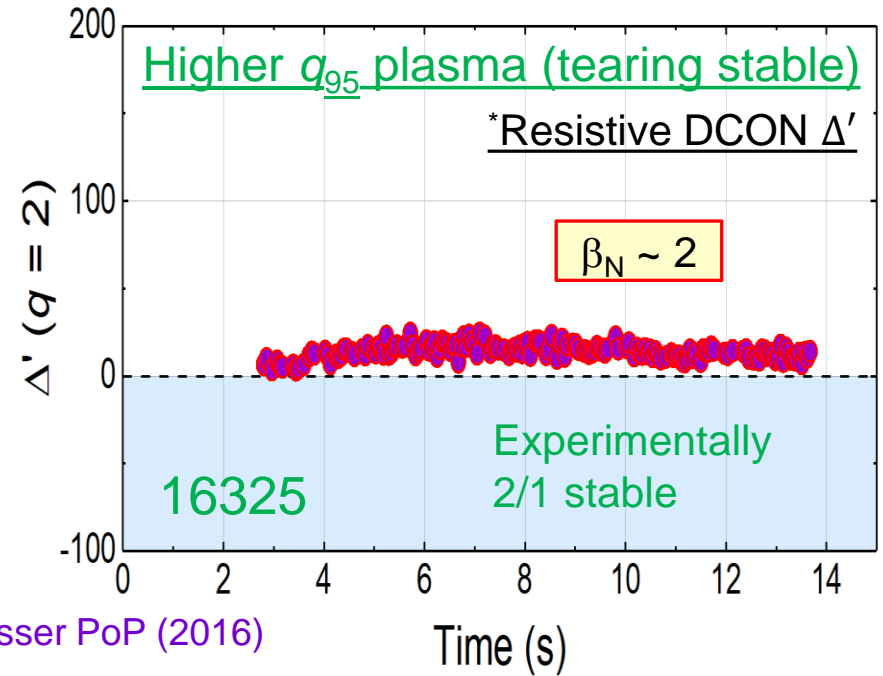
- Requires storage of DECAF analysis

Aim to add ASDEX-U next, then JET and C-Mod databases

Tearing mode stability examined in KSTAR plasmas varied β_N , q_{95} (supports future DECAF models)



*A.H. Glasser PoP (2016)



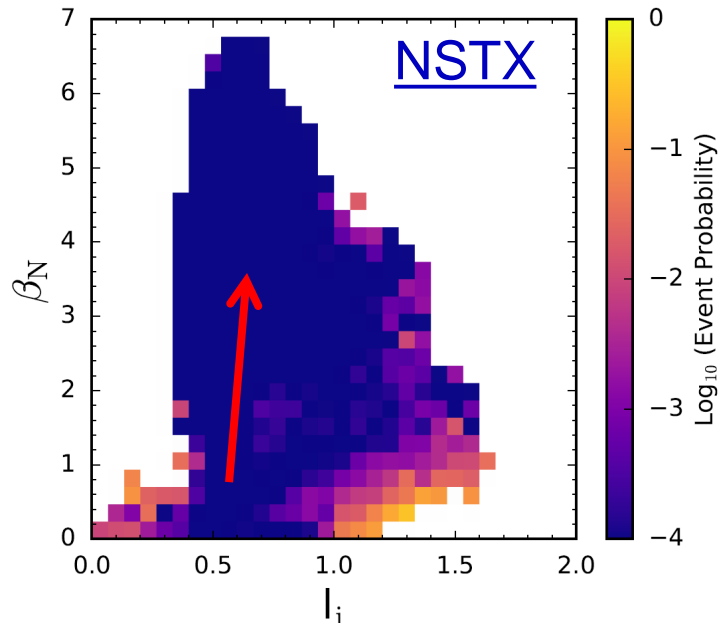
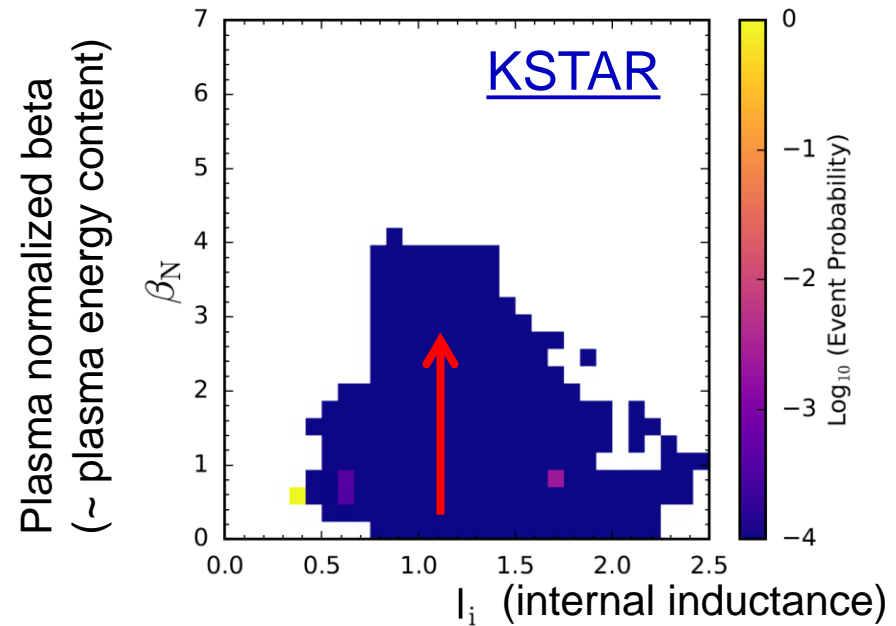
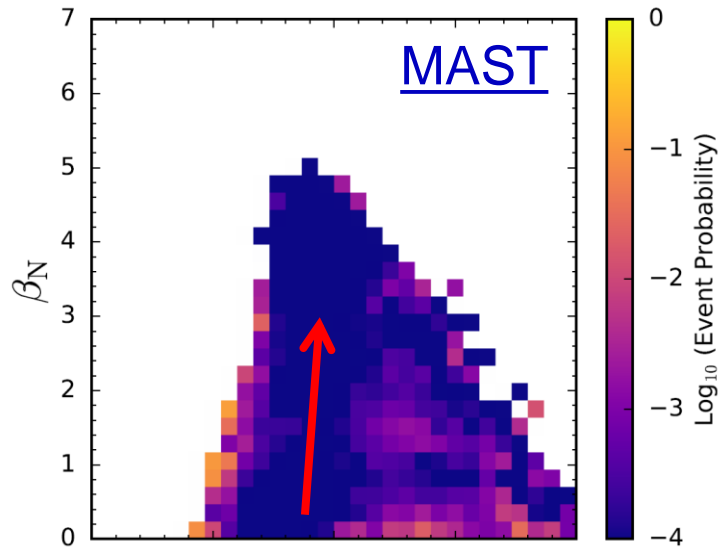
- ❑ Classical tearing stability index, Δ' , computed at $q = 2$ surface using outer layer solutions
- ❑ At higher q_{95} , Δ' is mostly positive predicting unstable classical tearing mode
 - Indicates neoclassical effects, additional physics are needed to produce stability
- ❑ Time evolution of ideal MHD stability also computed with DCON to support DECAF

See POSTER version of talk (next session) for more

See CP11.00100: Y.S. Park

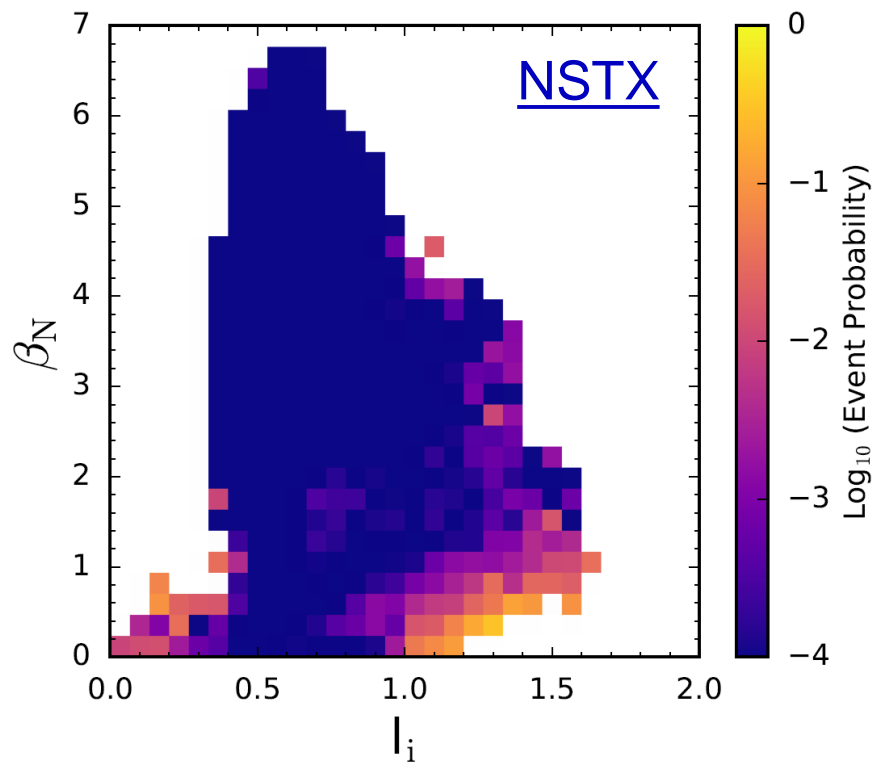
See CP11.00099: Y. Jiang

Initial DECAF analysis of large databases further supports result that **disruptivity doesn't increase with β_N**



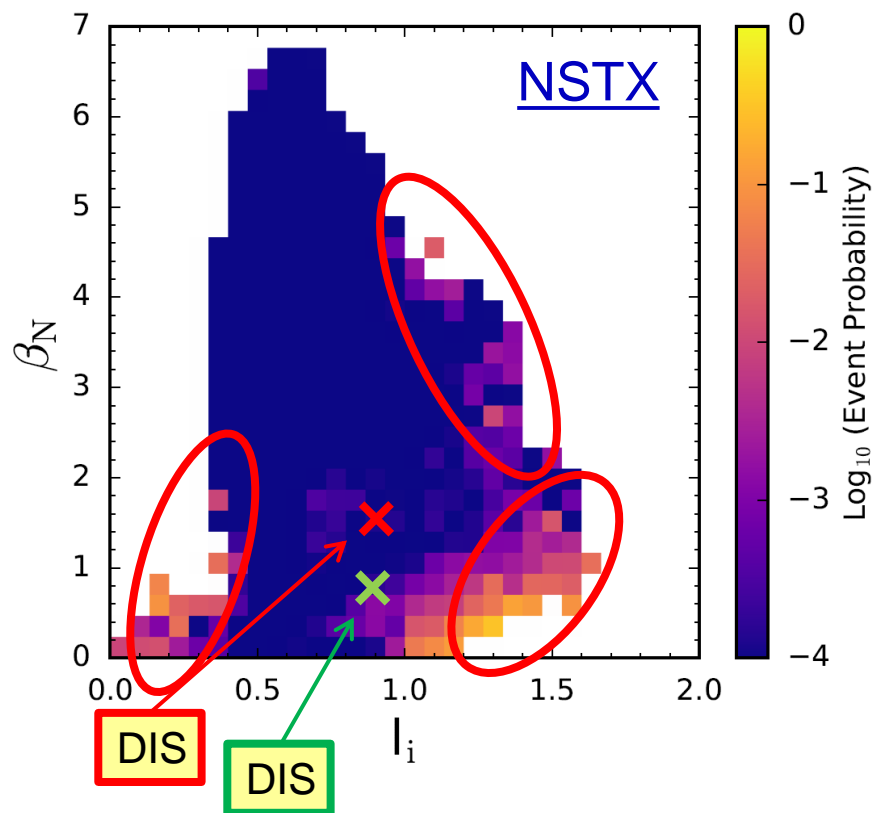
- ❑ DECAF analysis of **DIS** event alone
 - ❑ Similar to a “standard” disruptivity analysis
 - ❑ Analyzed at 10 ms intervals (> million tests)
- ❑ Analysis during steady plasma current
 - ❑ MAST: 8,902 plasmas analyzed
 - ❑ NSTX: 10,432 plasmas analyzed
 - ❑ KSTAR: 1,309 plasmas analyzed

DECAF provides early disruption warning and understanding of disruption event chain beyond disruptivity plots



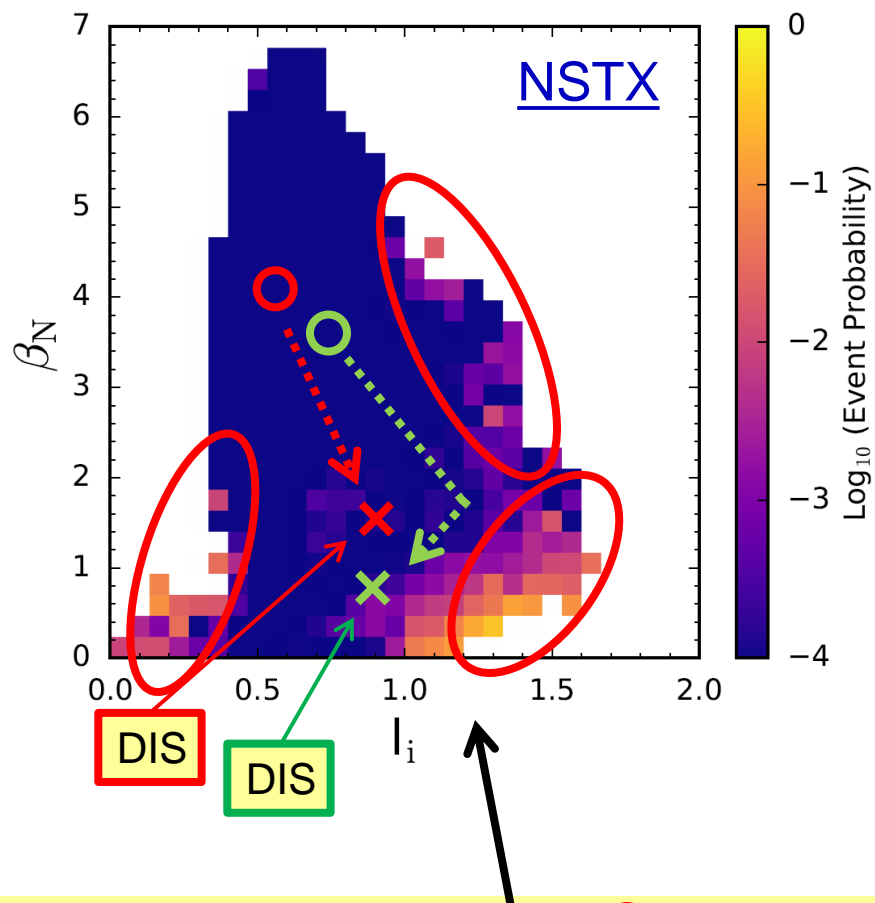
- Example: What are the most important regions to study on this plot?

DECAF provides early disruption warning and understanding of disruption event chain beyond disruptivity plots





- ❑ Example: What are the most important regions to study on this plot?
- ❑ Studies usually focus on the high disruption probability regions
- ❑ What causes the disruptions? (low β_N , mid- I_i ???)
- ❑ Problem → plasma conditions can change significantly between first problem detected and when disruption happens

DECAF provides early disruption warning and understanding of disruption event chain beyond disruptivity plots

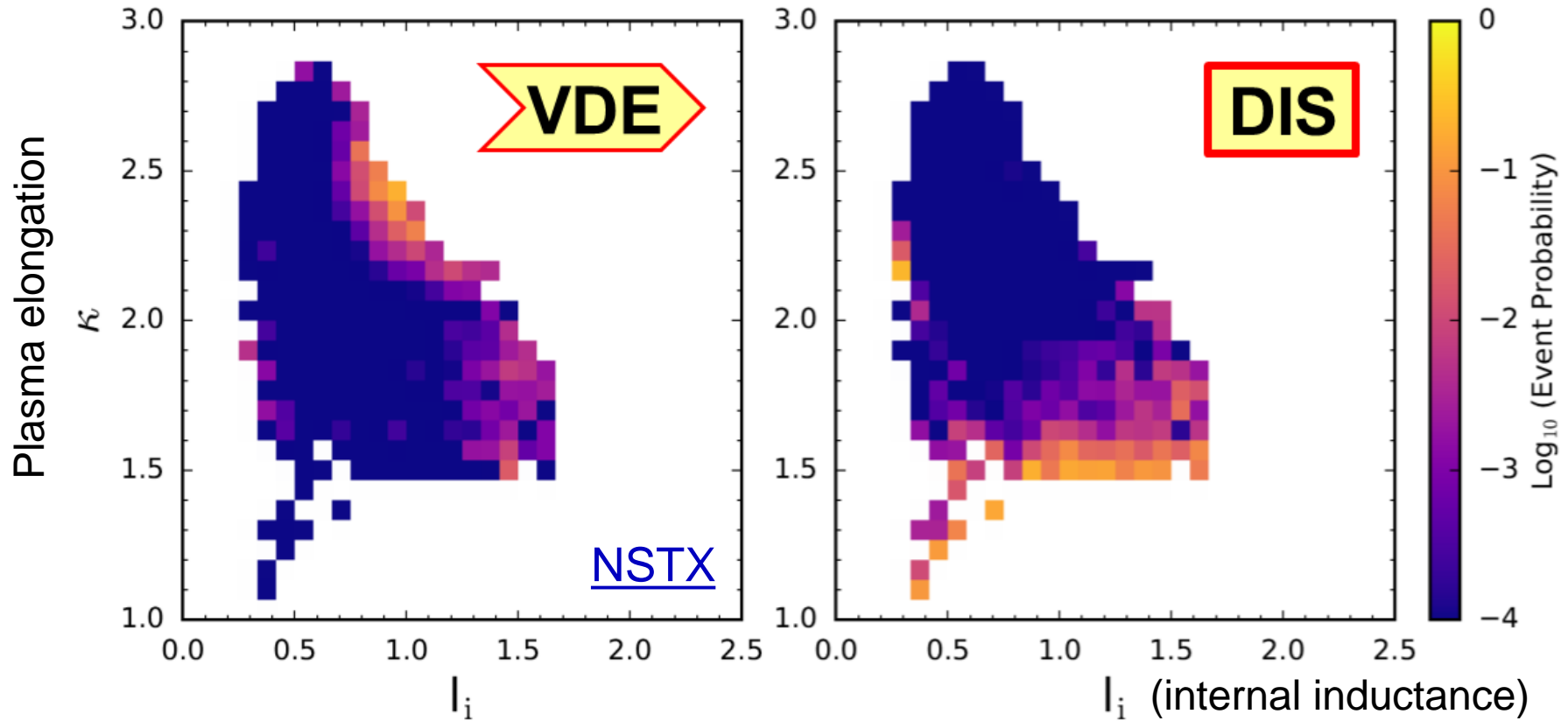


- Example: What are the most important regions to study on this plot?
- Studies usually focus on the high event probability regions
- What causes the disruptions? (low β_N , mid- I_i ???)
- Problem → plasma conditions can change significantly between first problem detected and when disruption happens

□ Answer: the circles   mark the key region to study!

- DECAF shows the plasmas suffer several “events” that are started in this region, and end up far from that region when they disrupt (at the crosses  )

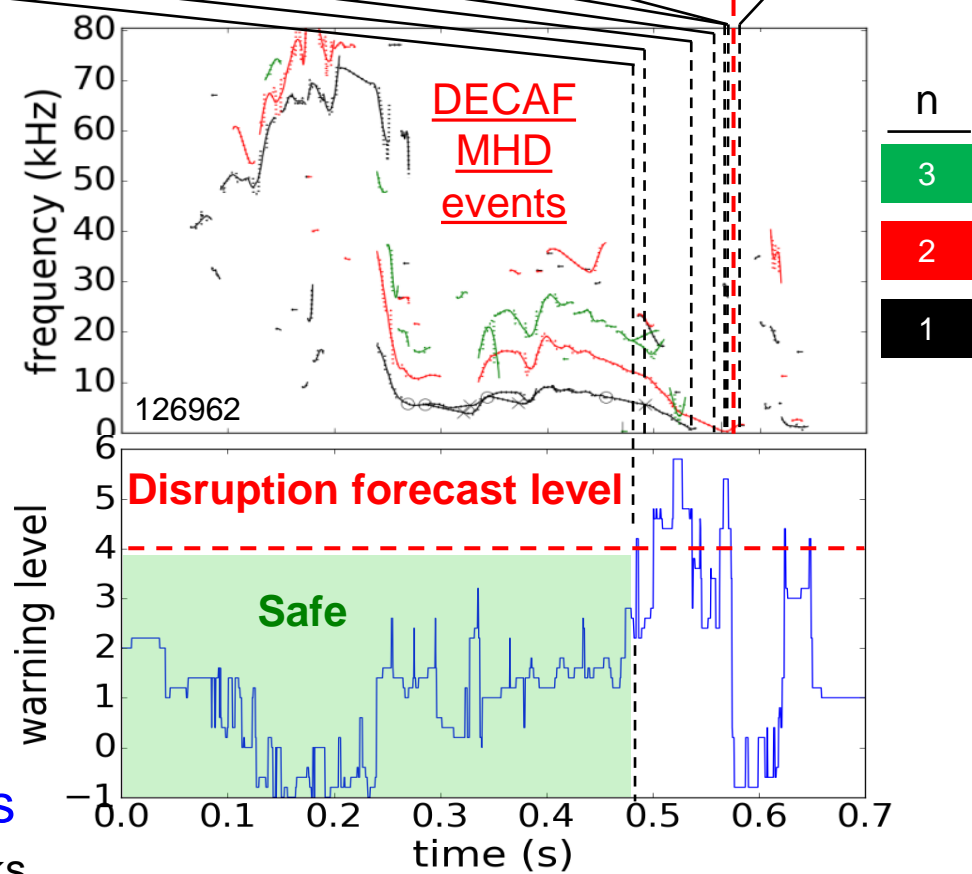
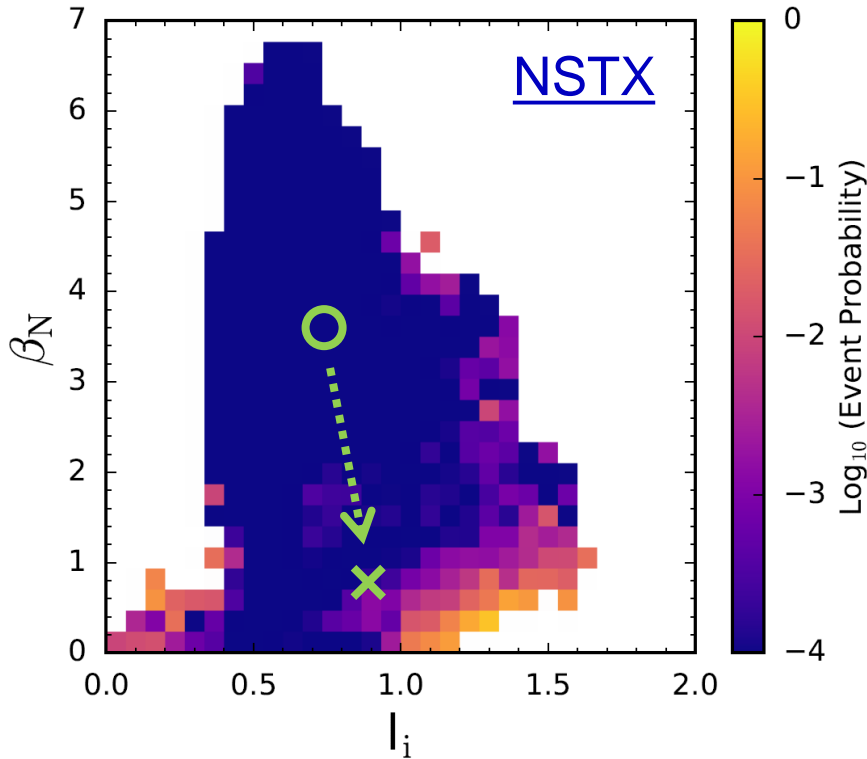
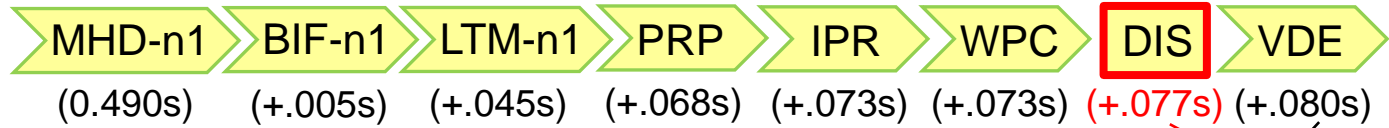
Example: DECAF shows plasma parameters of VDE event can occur far from those of DIS event



- Largest portion of detected VDE events appear at (I_i, κ) with very small portion of DIS events detected

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

DECAF event chain

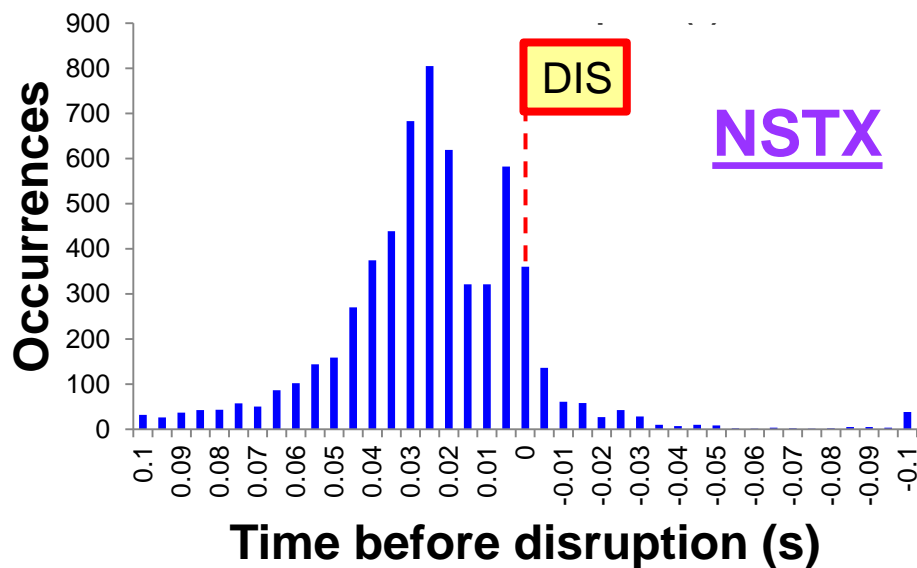
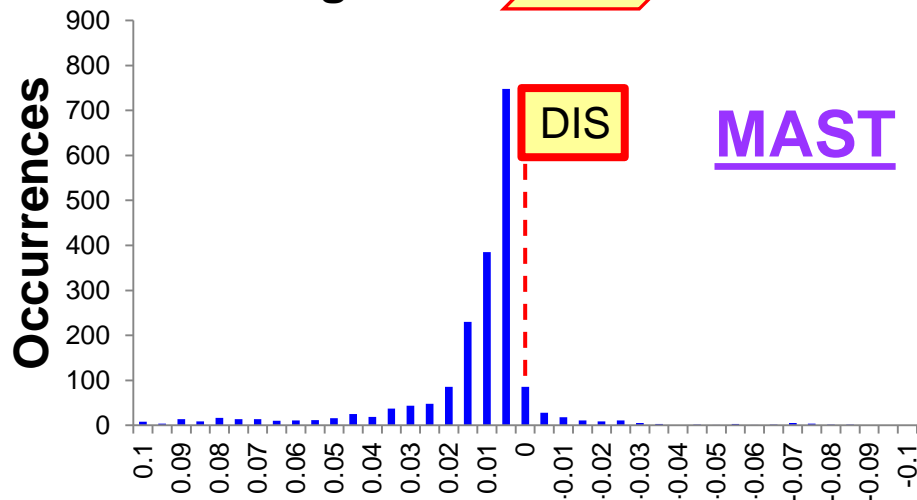


DECAF event chain reveals physics

- Rotating MHD slows, bifurcates, and locks
- Then, plasma has an H-L back-transition (pressure peaking warning PRP) before **DIS**
- Early warning gives the potential for disruption avoidance by plasma profile control

DECAF event analysis of large databases of different devices shows physical distinctions

Histogram of  event



Databases

- MAST: 8,789 shots
(3,360 shots*seconds)
- NSTX: 10,094 shots
(6,400 shot*seconds)

Loss of vertical stability control occurs closer in time to disruption in MAST compared to NSTX

- May be due to presence of copper stabilizing plates in NSTX

Understanding aids in DECAF extrapolation to new devices

Limited event chain analysis of large databases evolves initial performance of disruption prediction

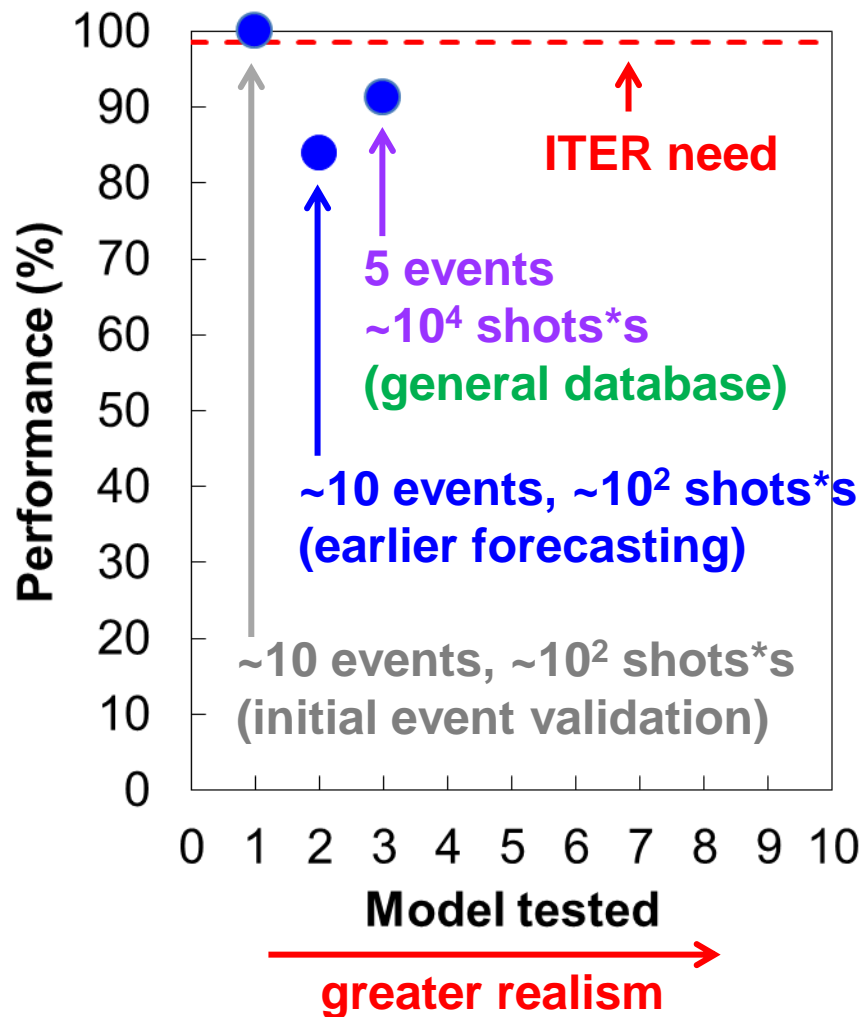
- ✓ First test on large, general database
- Analysis with only 5 DECAF events tested for 10,094 discharges with disruptions (NSTX)
 - Events used: VDE, GWL, LOQ, IPR, DIS

□ Performance (Model 3)

- 91.2% true positives (warning occurs)
- 8.7% false negatives (no warning)
 - Somewhat high number of false negatives expected: only 5 DECAF events are used in this large database analysis

- In 5,909 shots, vertical instability  was part of the disruption chain

DECAF Disruption Forecasting Performance Evolution



Rapidly-expanding DECAF code provides a new paradigm for disruption prediction research

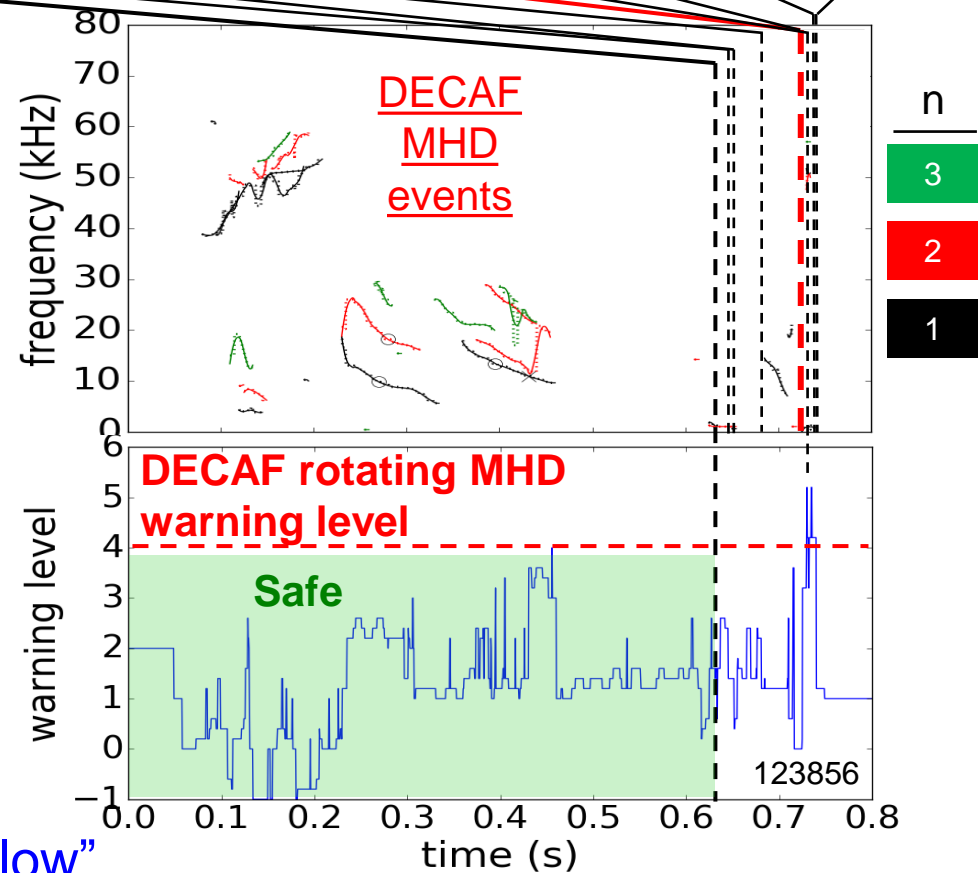
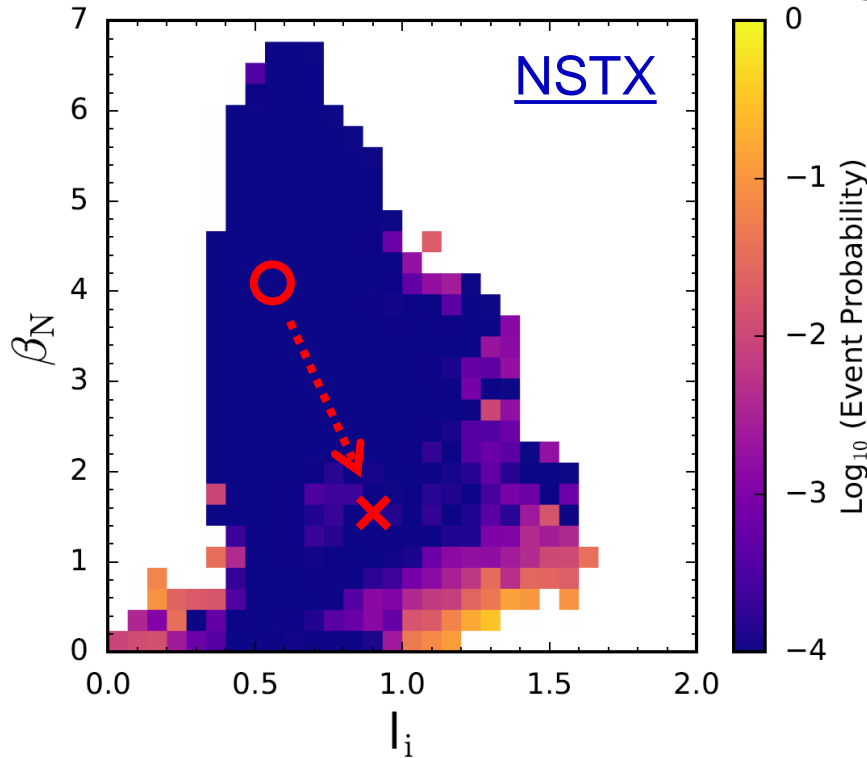
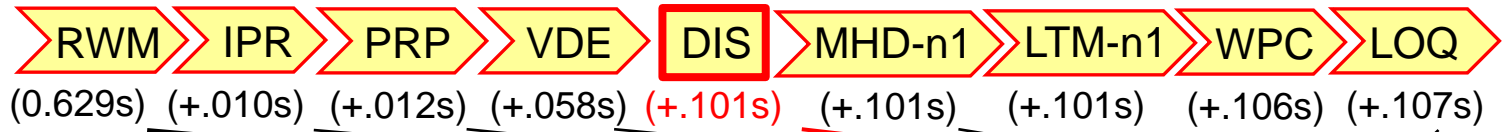
- ❑ Multi-faceted, integrated approach to disruption prediction and avoidance that meets disruption predictor requirement metrics
 - ❑ Physics-based approach yields key understanding of evolution toward disruptions needed for confident extrapolation of forecasting
 - ❑ Physics-based DECAF events can guide disruption avoidance by control
 - ❑ Full multi-machine databases used (full databases needed!)
 - ❑ Open to all methods of data analysis (physics, machine learning, etc.)
- ❑ DECAF is now producing early warning disruption forecasts
 - ❑ On transport timescales: potential disruption avoidance by profile control
- ❑ Next steps
 - ❑ Expand number of DECAF events evaluated in large database analysis
 - ❑ Continue / expand disruption prediction performance analysis (→ ITER)
 - ❑ Implement DECAF disruption prediction models in real-time (→ KSTAR)

We are hiring post-doctoral researchers! → Email: sabbagh@pppl.gov

Supporting Slides Follow

Global MHD modes can also be “slow” and **warnings** for disruptions, potentially allowing avoidance

DECAF
event chain



Global MHD (RWM) can also be “slow”

- Rotating MHD warning level **decreases** after 0.46s → **DANGEROUS** for RWM onset!
- H – L back transition (**PRP**) drags out time to disruption (> 100 ms – **transport timescale**)

DECAF code based on initial successful research/results is now advancing to a new level

DECAF brief highlights of prior results

- First automated event chain analysis (followed deVries' manual work)
- Excellent performance on smaller, targeted databases (NSTX)
 - Ex.: DIS, WPC, IPR, LOQ, RWM events found 100%, VDE event 91%
 - Computed events accurately represented experiment (~ 10 events)
 - Physics model forecasted global MHD disruptions with ~ 85% reliability

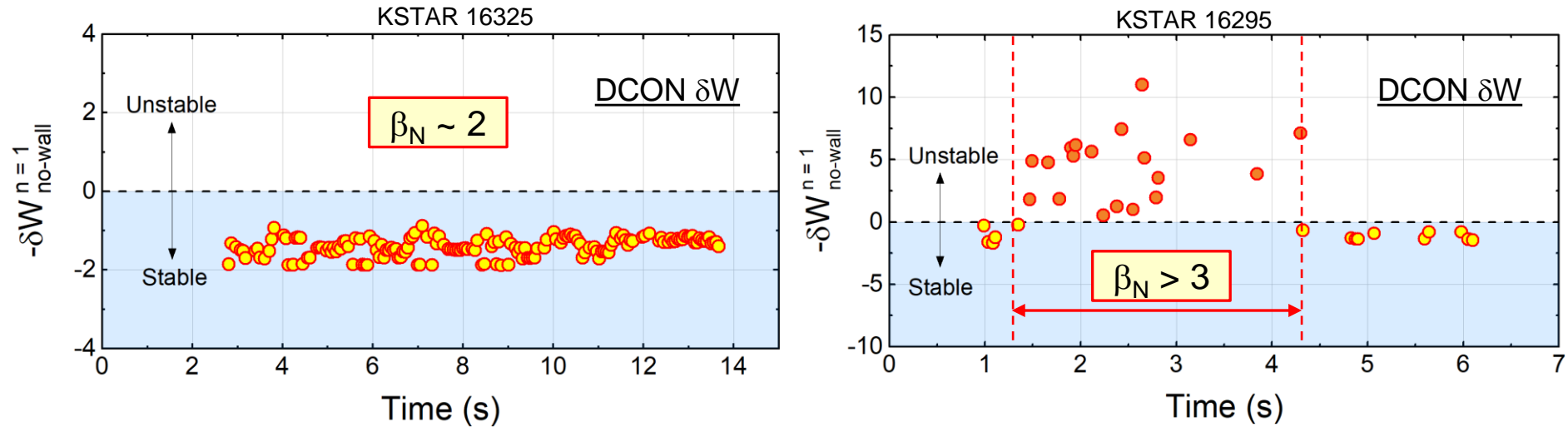
- Disruption chains often repeated, e.g.: 

J.W. Berkery, S.A. Sabbagh, R. Bell, *et al.*, *Phys. Plasmas* **24** (2017) 056103

Recent progress

- Density limit model based on radiating island power balance being tested
- New MHD events in DECAF allow forecasting on transport timescales
- Linear resistive MHD analysis as first step to theory-based forecasting
- Analysis of disruption chains from general databases
- Multi-machine database analysis and disruption prediction with small number of verified events

DCON stability calculation shows high β_N equilibria are subject to $n = 1$ ideal instability



DCON computed ideal MHD $n = 1$ δW with no-wall

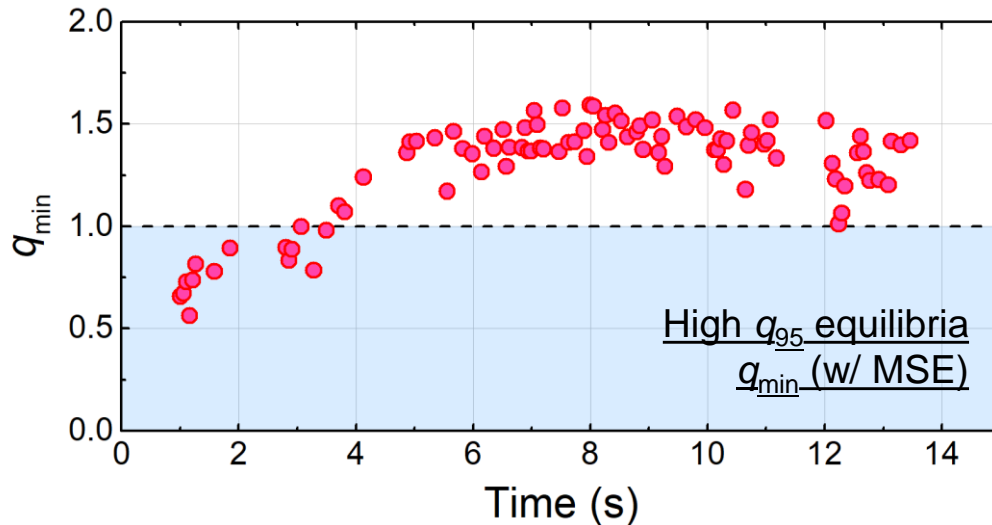
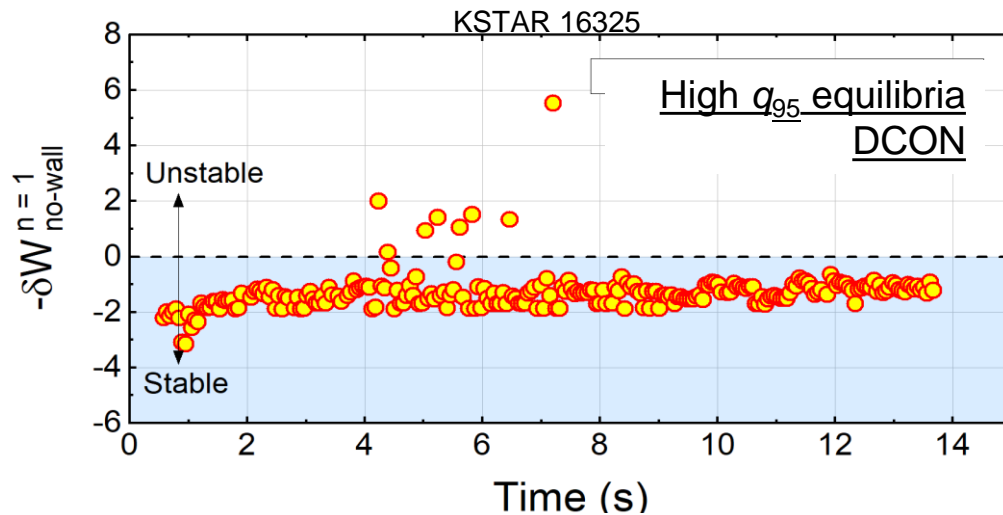
- ❑ Equilibria at lower $\beta_N \sim 2$ is consistently stable to $n = 1$ ideal modes in DCON
- ❑ Unlike the lower β_N case, DCON calculates unstable $n = 1$ mode with no-wall ($\beta_N > \beta_N^{\text{no-wall}}$) at the achieved high $\beta_N > 3$
- ❑ The small deviations in the reconstructed profiles in the high β_N phase is responsible for reduced equilibrium convergence and the scatter in δW

See CP11.00100: Y.S. Park

See CP11.00099: Y. Jiang

A.H. Glasser, Phys. Plasmas **23** (2016) 072505

Higher q_{95} plasma has greater ideal $n = 1$ no-wall stability computed in DCON



□ Unlike higher β_N plasma, equilibria is mostly stable to $n = 1$ ideal modes in DCON

□ Note generally smooth evolution of stability criterion – reached with improved kinetic equilibria

□ The q -profile at higher B_T evolves higher q_{min} above 1

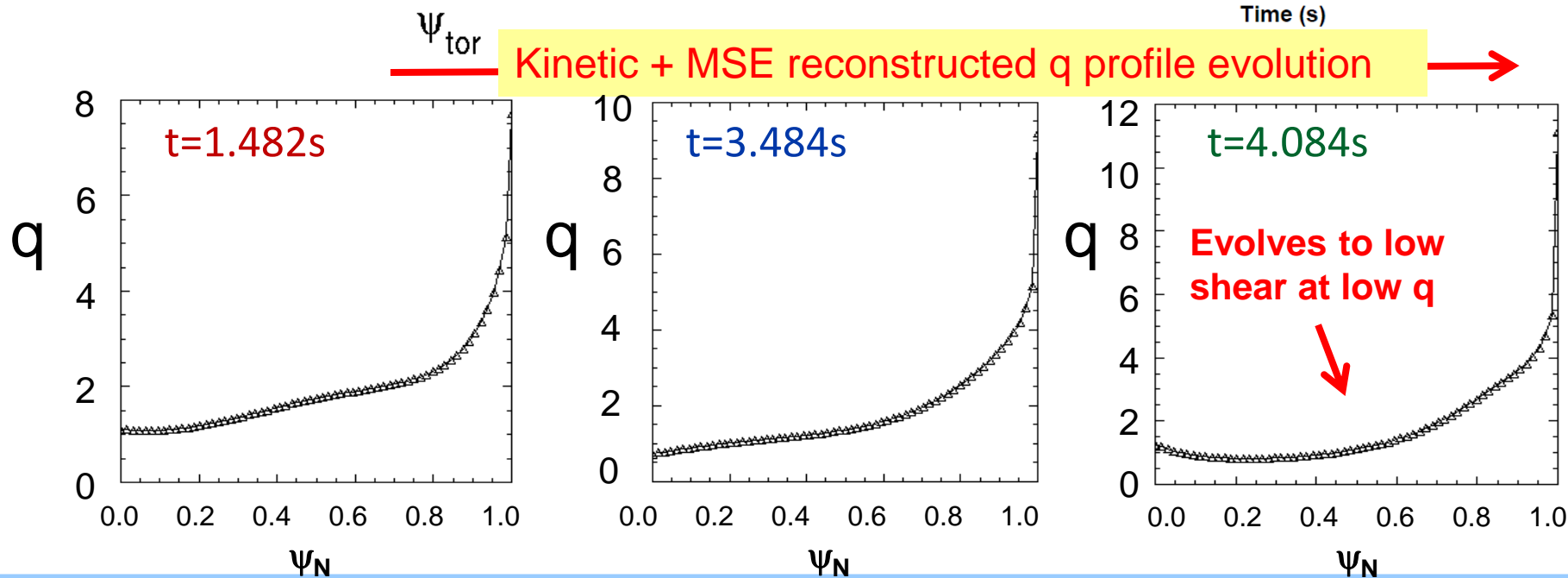
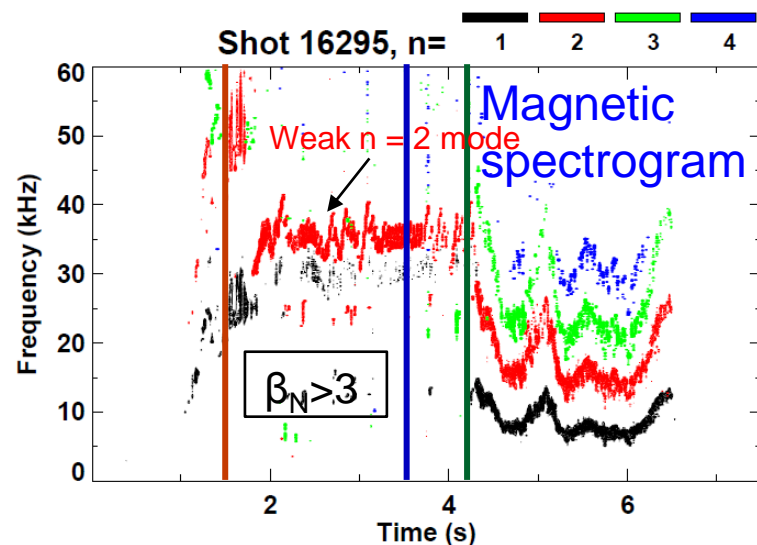
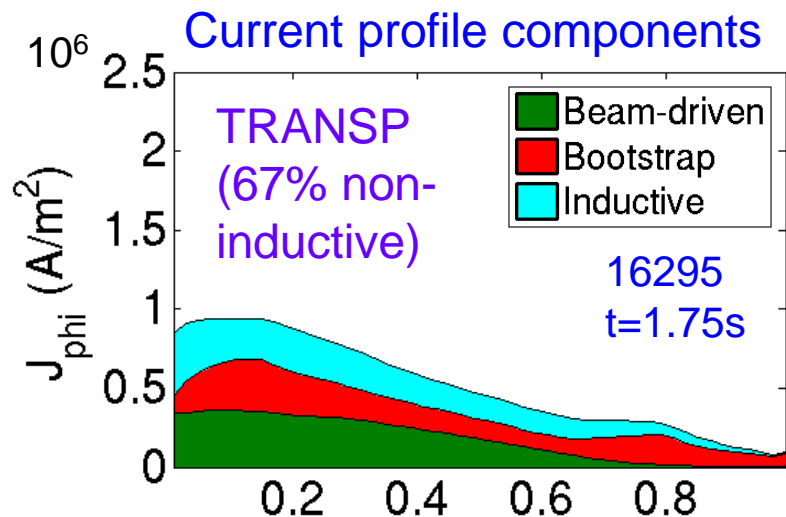
□ Sawteeth disappear

□ Reconstructed lower q shear at higher values of q does not lead to $n = 1$ instability in DCON

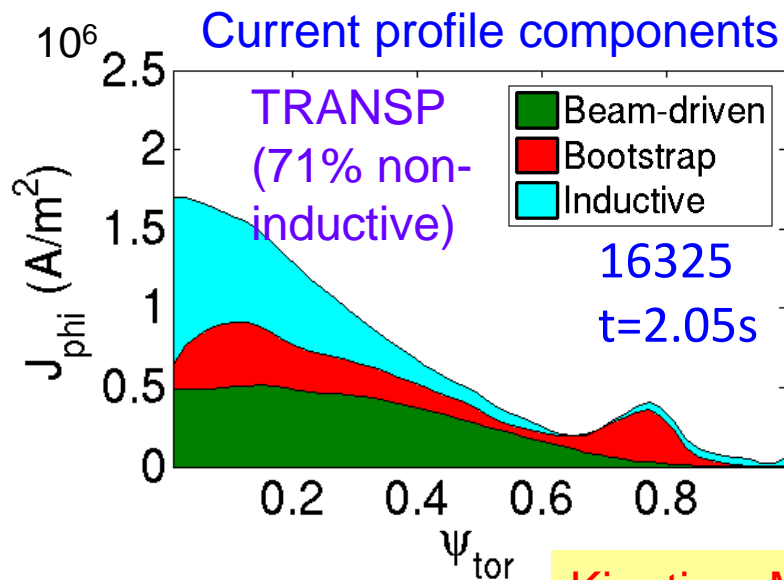
See CP11.00100: Y.S. Park

See CP11.00099: Y. Jiang

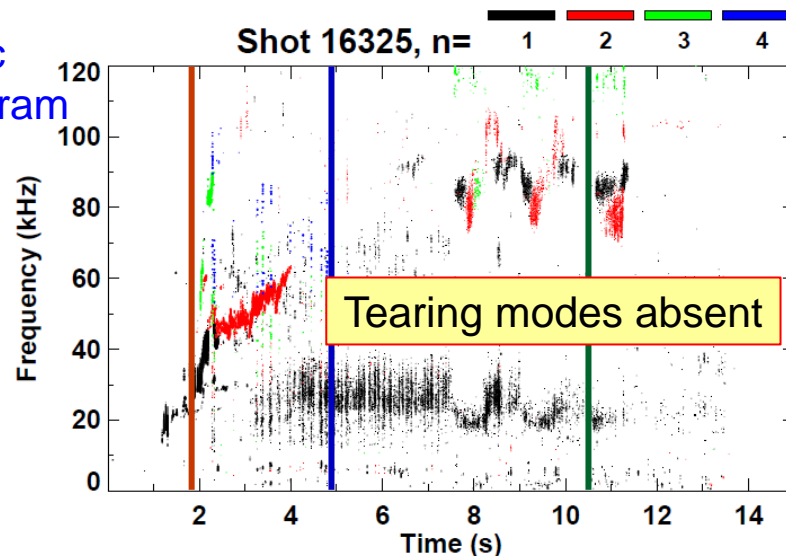
A broad non-inductive current fraction profile leads to low shear at low q in high β_N plasma



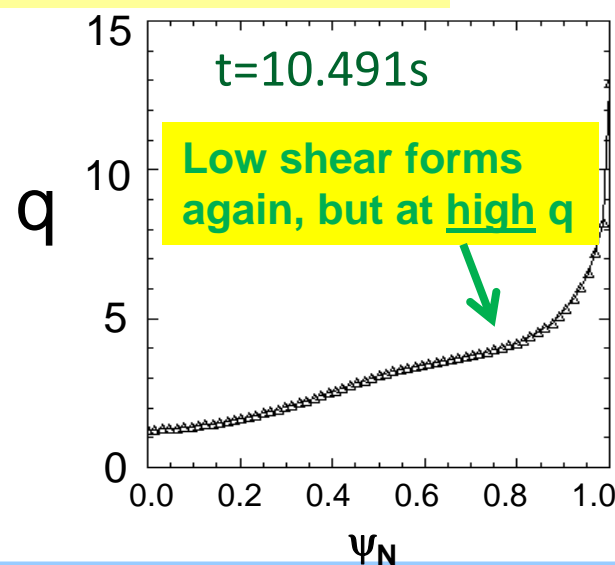
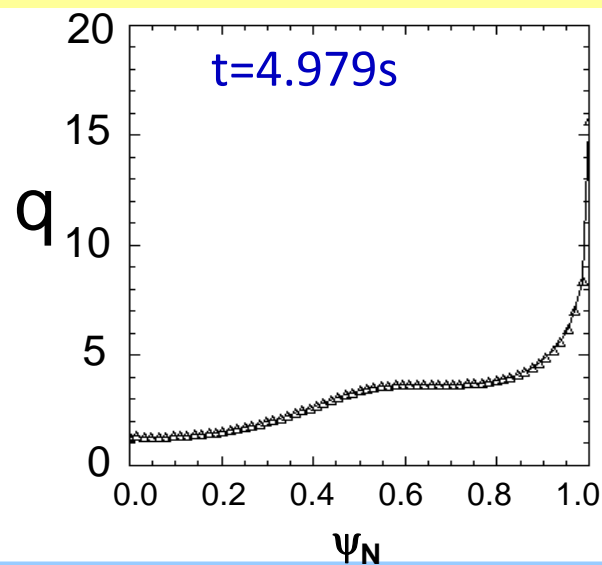
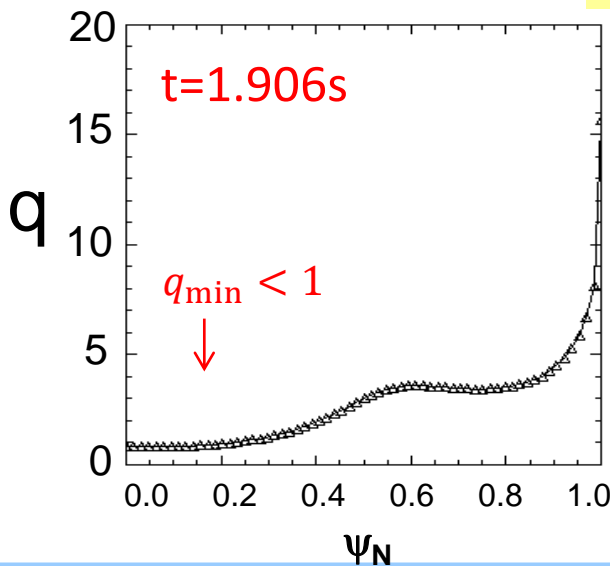
Kinetic EFIT reconstructed again shows evolution to low-sheared q-profiles but now at high q



Magnetic spectrogram



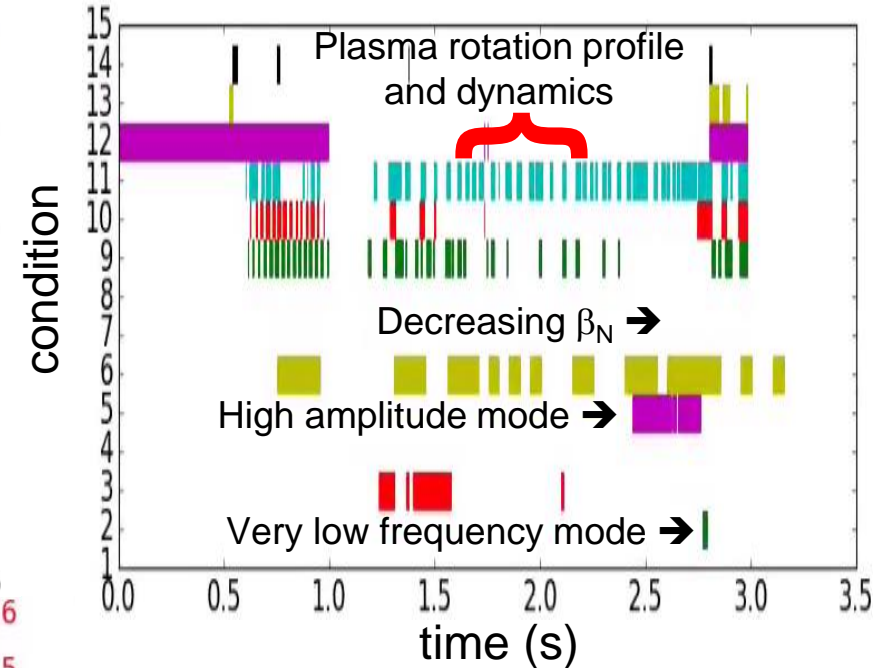
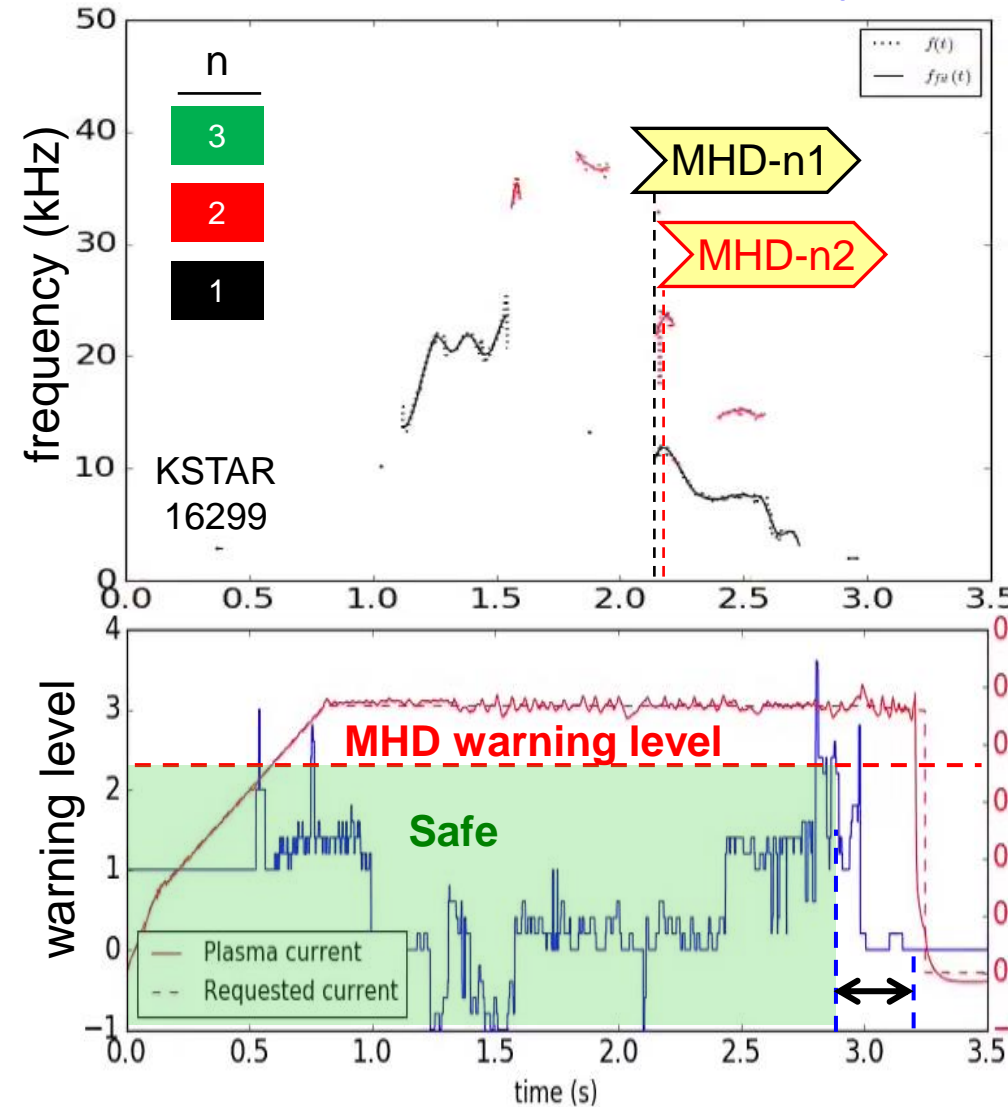
Kinetic + MSE reconstructed q profile evolution



New DECAF MHD events are now being tested on KSTAR to define evolving disruption warning level

DECAF automated MHD objects

DECAF "heat map" (for MHD)

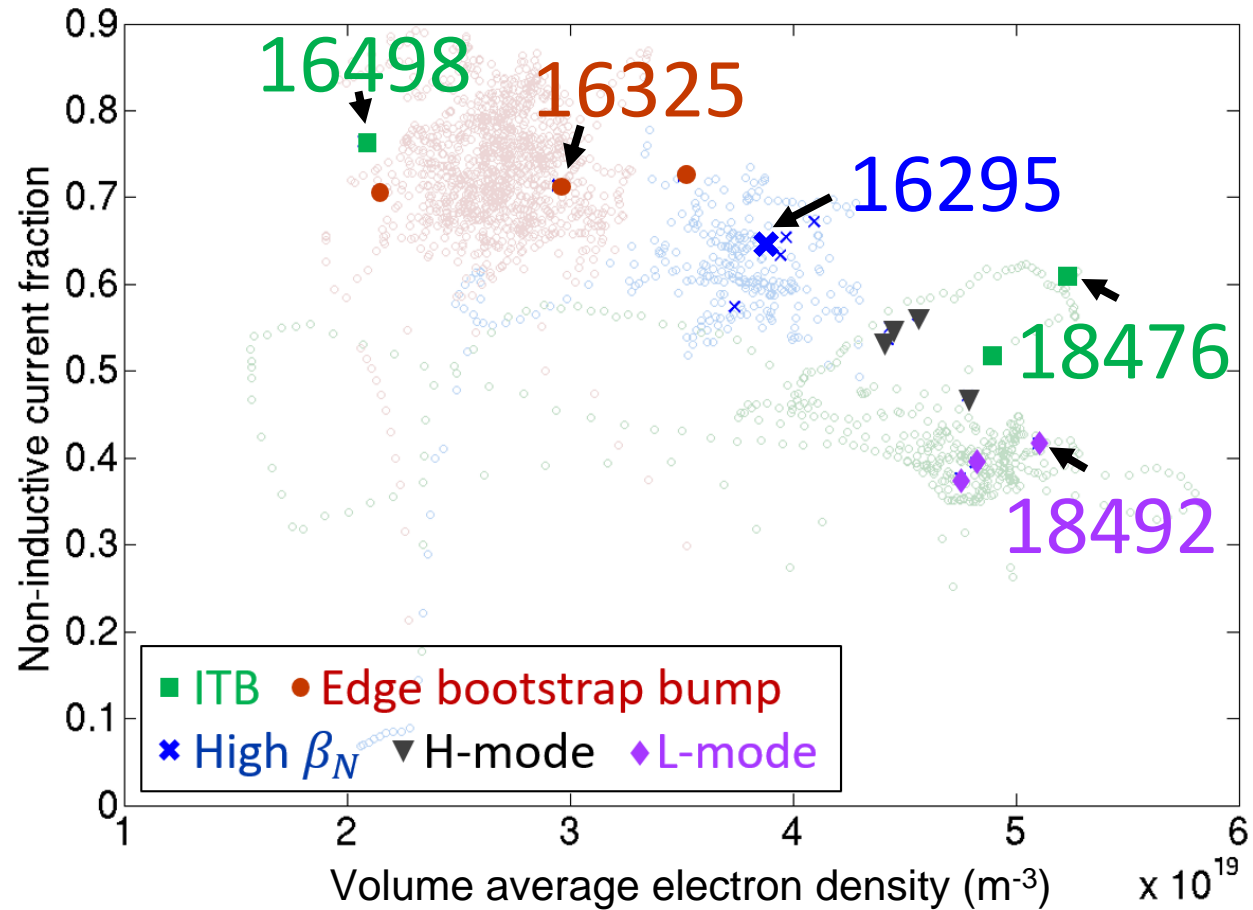


- Mode locking at reduced plasma rotation
- Key notables of MHD warning
 - "Safe"/"unsafe" MHD periods
 - Early disruption warning (300 ms) → on transport timescale

See CP11.00110: J.D. Riquezes

Kinetic reconstructions focused first on KSTAR plasmas with high-non-inductive fraction; NICF exceeds 75%

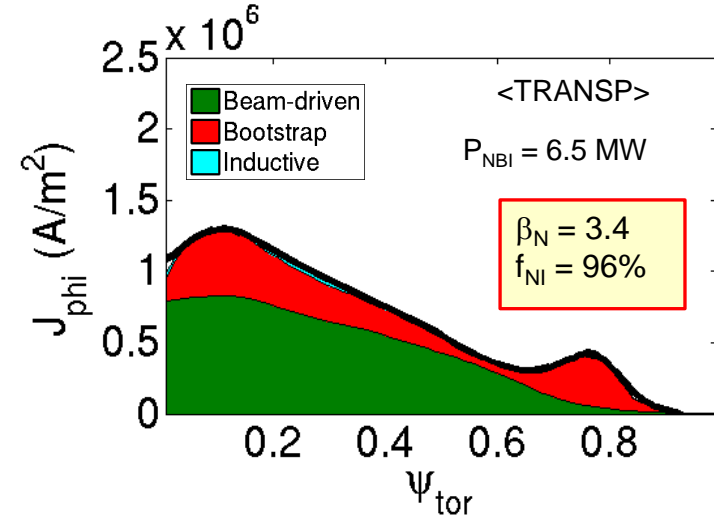
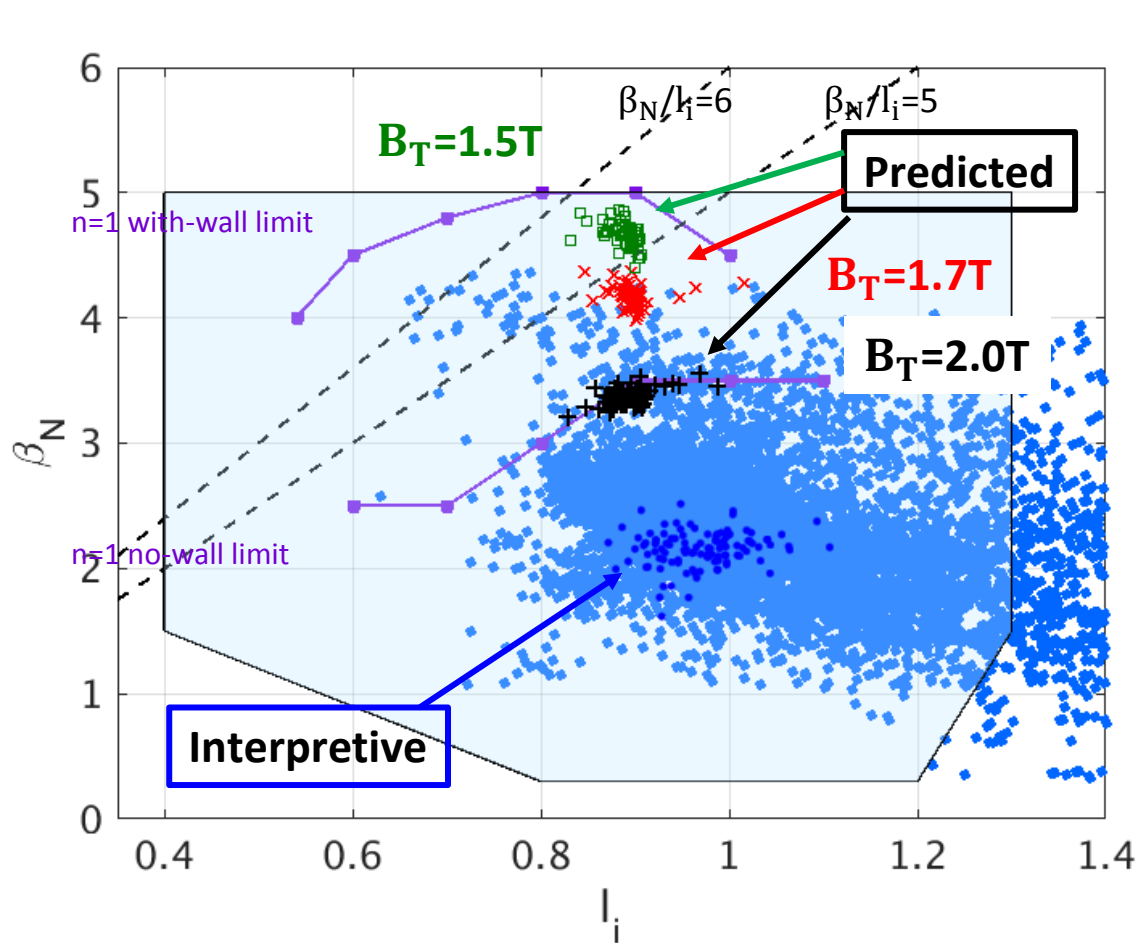
- TRANSP analysis of experimental plasmas
- Non-inductive fraction
 - Beam-driven
 - Bootstrap
- Non-inductive fraction is key for stable high beta steady state operation



See CP11.00102: J.H. Ahn

Predictive TRANSP analysis shows KSTAR design target $\beta_N \sim 5$ can be approached with $f_{NI} \sim 100\%$

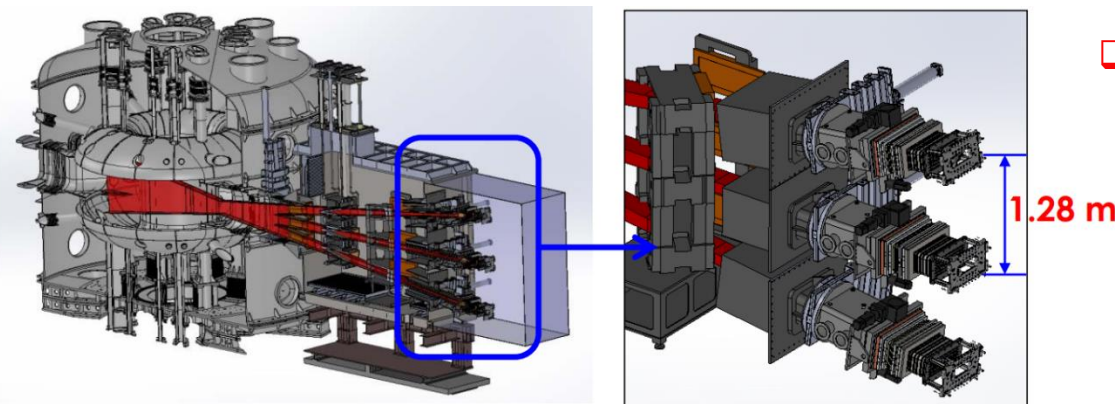
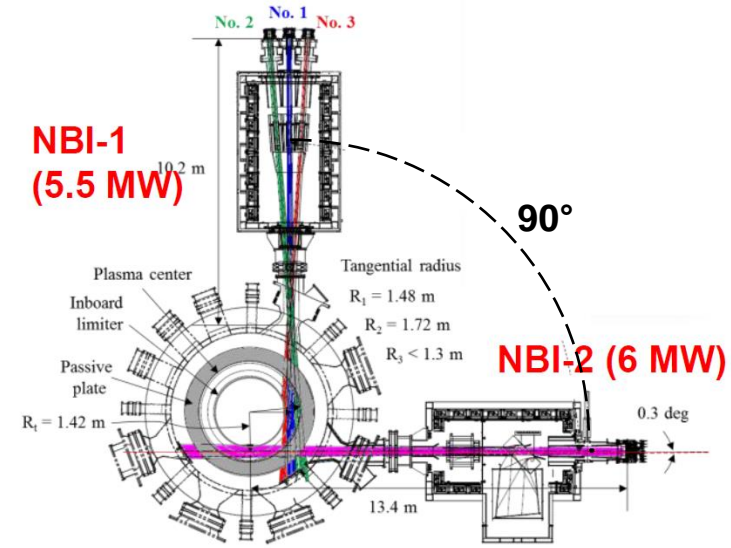
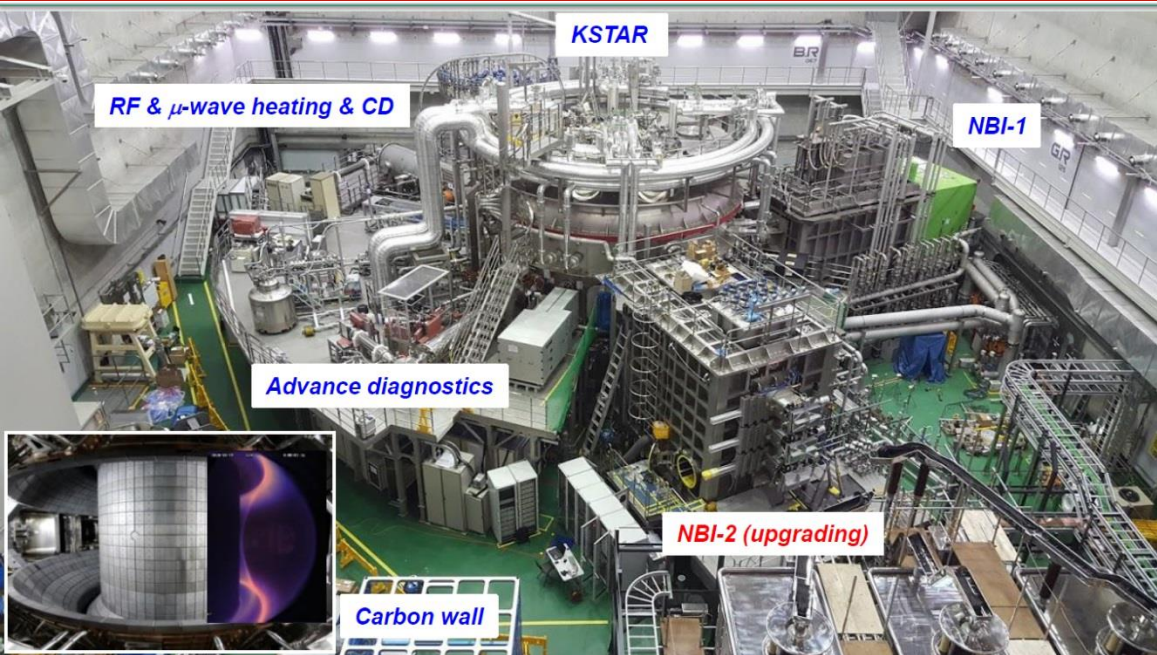
- “Predict-first” analysis used to design high- β , 100% non-inductive current fraction (NICF) experiments for present KSTAR run campaign



- Up to 75% NICF already reached in similar plasmas
- NBI \rightarrow 6.5 MW (4 sources)
- By altering I_P and B_T values, $\beta_N > 4$, up to KSTAR design target 5 can be achieved with 100% NICF

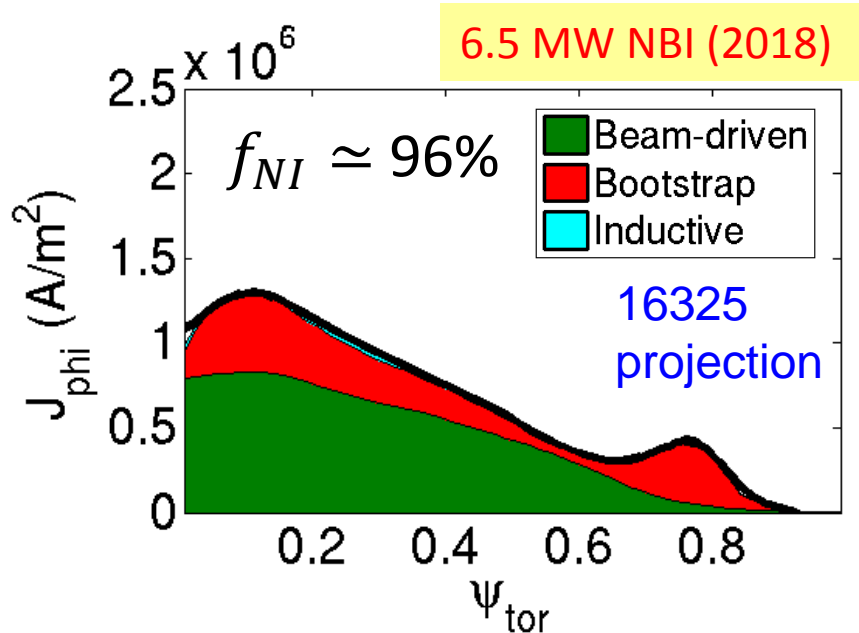
See CP11.00102: J.H. Ahn

New 2nd NBI system is installed in KSTAR aims to be available for 2018 run campaign



- ❑ Geometry of 2nd NBI system is included in TRANSP model
 - ❑ 2018 : upward-slanted source
 - ❑ 2019+ : all 3 sources available
- $P_{NBI} \approx 1.5 \text{ MW/source}$

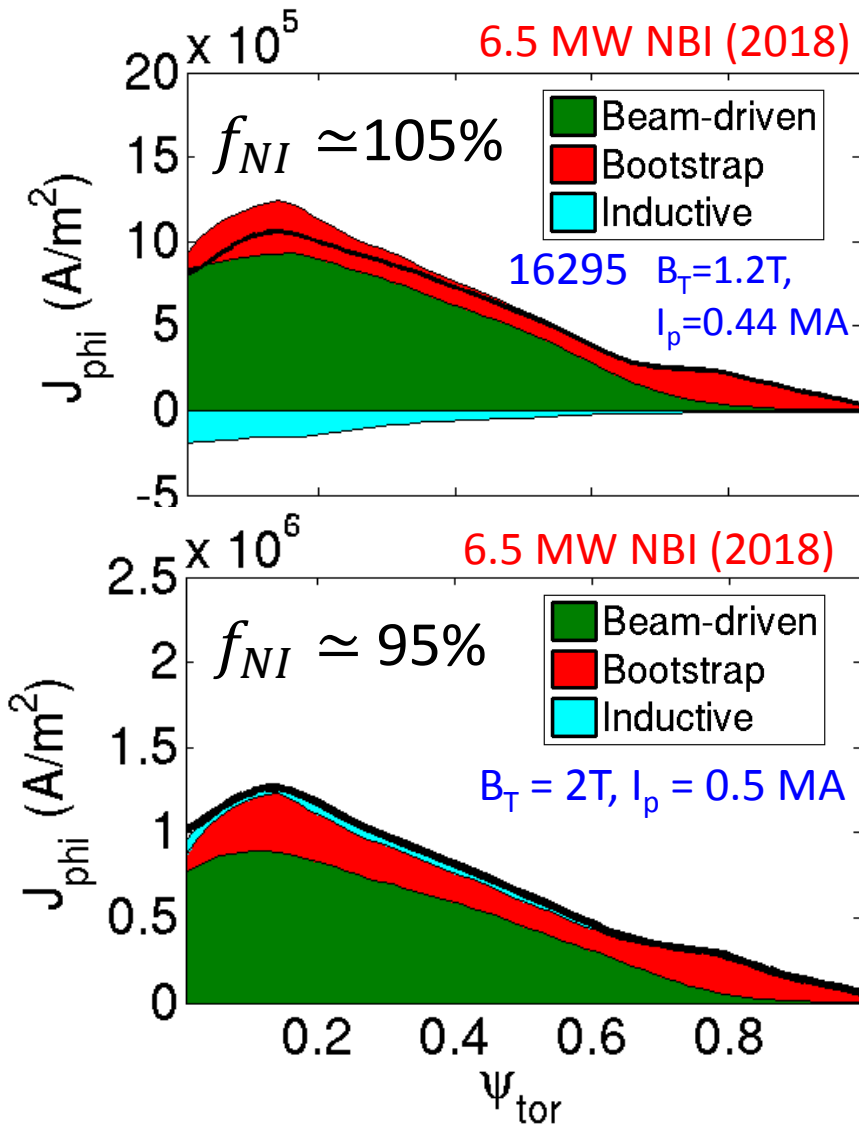
Predictive transport capability (TRANSP) allows “predict-first” projections for upcoming runs



TRANSP 16325	2016 actual	2018 NBI	2019 NBI
NIC fract. (%)	71%	96%	130%
β_N	2.7	3.4	4.4
I_i	0.9	0.91	0.95
$T_i(0)$ (keV)	4.5	5.5	7.2
$T_e(0)$ (keV)	4.6	3.3	3.3
$n_e(0)$ (10^{20}m^{-3})	5.2	5.6	5.5
$f_{\text{Greenwald}}$	0.5	0.5	0.5
H_{98y2}	1.25	1.25	1.25

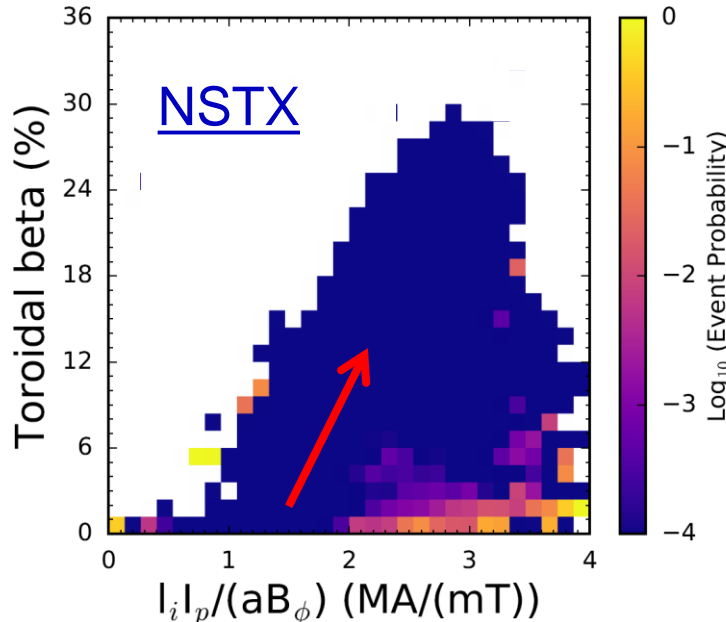
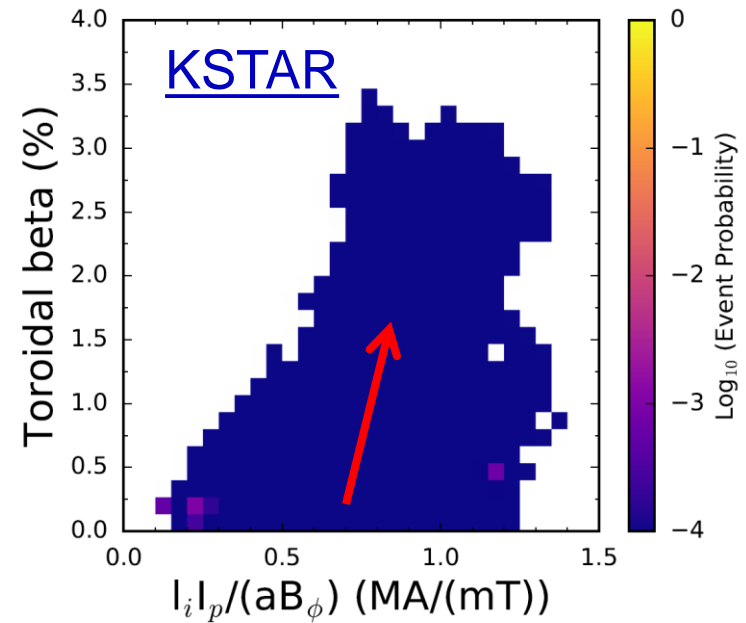
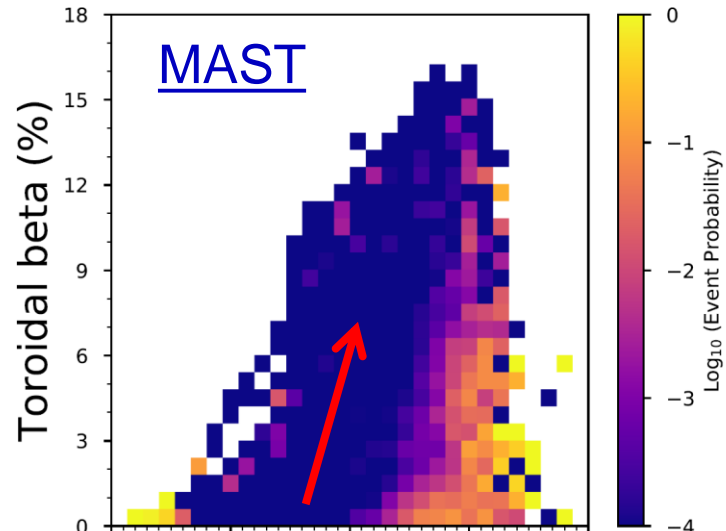
- ❑ Project from existing KSTAR plasmas
 - ❑ Set fraction of Greenwald density and confinement factor ITER H_{98y2}
 - ❑ Neoclassical ion transport, electron transport set to match H_{98y2}
 - ❑ KSTAR 1st and 2nd NBI systems are modeled (incl. aiming angles); power levels set realistically based on MSE needs, etc.

Transport analysis projections allow for variations of plasma parameters to meet targets



TRANSP 16295 (B_T ; I_p)	2016 actual (1.2T)	2018 NBI (1.2T)	2018 NBI (2T, 0.5 MA)	2019 NBI
NIC fract. (%)	67%	105%	95%	126%
β_N	3.5	5.4	3.5	4.4
I_i	0.9	0.83	0.95	0.84
$T_i(0)$ (keV)	3.6	4.8	5.4	7.3
$T_e(0)$ (keV)	2.3	2.8	3.2	3.3
$n_e(0)$ ($10^{19}m^{-3}$)	6.0	4.8	5.6	5.6
$f_{Greenwald}$	0.6	0.5	0.5	0.5
H_{98y2}	1.25	1.25	1.25	1.25

Initial analysis of large databases further supports published result that **disruptivity doesn't increase with plasma β**



- ❑ DECAF analysis of **DIS** event
 - ❑ Similar to a “standard” disruptivity analysis
 - ❑ Shots analyzed at 10 ms intervals
- ❑ Analysis during I_p flat-top
 - ❑ MAST: 8902 plasmas analyzed
 - ❑ NSTX: 10,432 plasmas analyzed
 - ❑ KSTAR: 1309 plasmas analyzed