

Layered low-pass magnetic sensor compensations for real-time mode identification in tokamaks

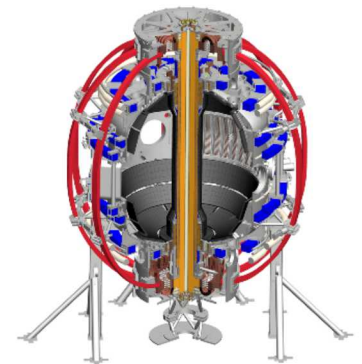
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Presentation outline

- Demonstration and tuning of layered low-pass (LLP) compensations:
 - LLP algorithm goals and merits
 - Numerical formulation
 - NSTX-U compensation example
 - Determining the compensation coefficients (DC3D/AC3D, DC2D, AC2D)
- Cross-machine portability and algorithmic improvements:
 - Demonstration of vacuum field pickup compensation on DIII-D
 - Improving AC2D compensations with chirped PF coil training shots
- Mode identification:
 - Numerical formulation
 - NSTX-U mode identification example (both offline and real-time)
 - DIII-D mode identification example (offline)

Features of the layered low-pass compensation algorithm

- What is the layered low-pass (LLP) compensation algorithm?
 - The goal is to remove all vacuum field pickup (both DC and AC) from 3D magnetic sensor difference pairs → isolates plasma-generated fields
 - AC pickup is compensated by low-pass filtering (LPF) the loop voltage that the coils apply to passive conducting structures
 - Use multiple LPF time constants → multiple low-pass ‘layers’
 - After isolating the plasma-generated fields, conduct mode identification:
 - Facilitates locked mode detection and dynamic mode control
 - Generalized python implementation facilitates cross-machine portability
- Merits of the LLP algorithm:
 - The same compensation techniques are applied to all vacuum field sources (i.e., both 2D coils and 3D coils)
 - Compensation is very fast (seconds to execute per sensor array)
 - Conducted entirely in the time domain → tailor-made for real-time

Numerical formulation of the layered low-pass algorithm

- Compensation coefficients, G , capture the contribution from each source, S , to a given signal, δB
- DC sources are either a coil current or the average local magnetic field
- AC sources represent currents induced in passive structures
- AC sources are approximated as low-pass filtered (LPF) driving voltages (either $\partial_t I_{\text{coil}}$ or V_{loop})
- Multiple low-pass time constants, τ , are applied to each AC source to account for superposed currents
→ **'Layered low-pass' approach**

$$\delta B_{\text{comp}}^i = \delta B_{\text{raw}}^i - \delta B_{\text{DC}}^i - \delta B_{\text{AC}}^i$$

$$\delta B_{\text{DC}}^i \equiv \sum_j^{N_{\text{DC}}} G_{\text{DC}}^{ij} S_{\text{DC}}^j$$

$$\delta B_{\text{AC}}^i \equiv \sum_j^{N_{\text{AC}}} \sum_k^{N_{\tau}} G_{\text{AC}}^{ijk} S_{\text{AC}}^{jk}$$

$$S_{\text{DC}}^j = \begin{cases} I_{\text{coil}}^j & , \text{ DCTF/PF/3D} \\ \langle B_{\text{P/R}} \rangle & , \text{ BP2D/BR2D} \end{cases}$$

$$S_{\text{AC}}^{jk} = \begin{cases} \text{LPF} \left(\partial_t I_{\text{coil}}^j \mid \tau_{\text{AC}}^k \right) & , \text{ ACTF/PF/3D} \\ \text{LPF} \left(V_{\text{loop}}^j \mid \tau_{\text{AC}}^k \right) & , \text{ ACVL} \end{cases}$$

Layered low-pass compensation levels

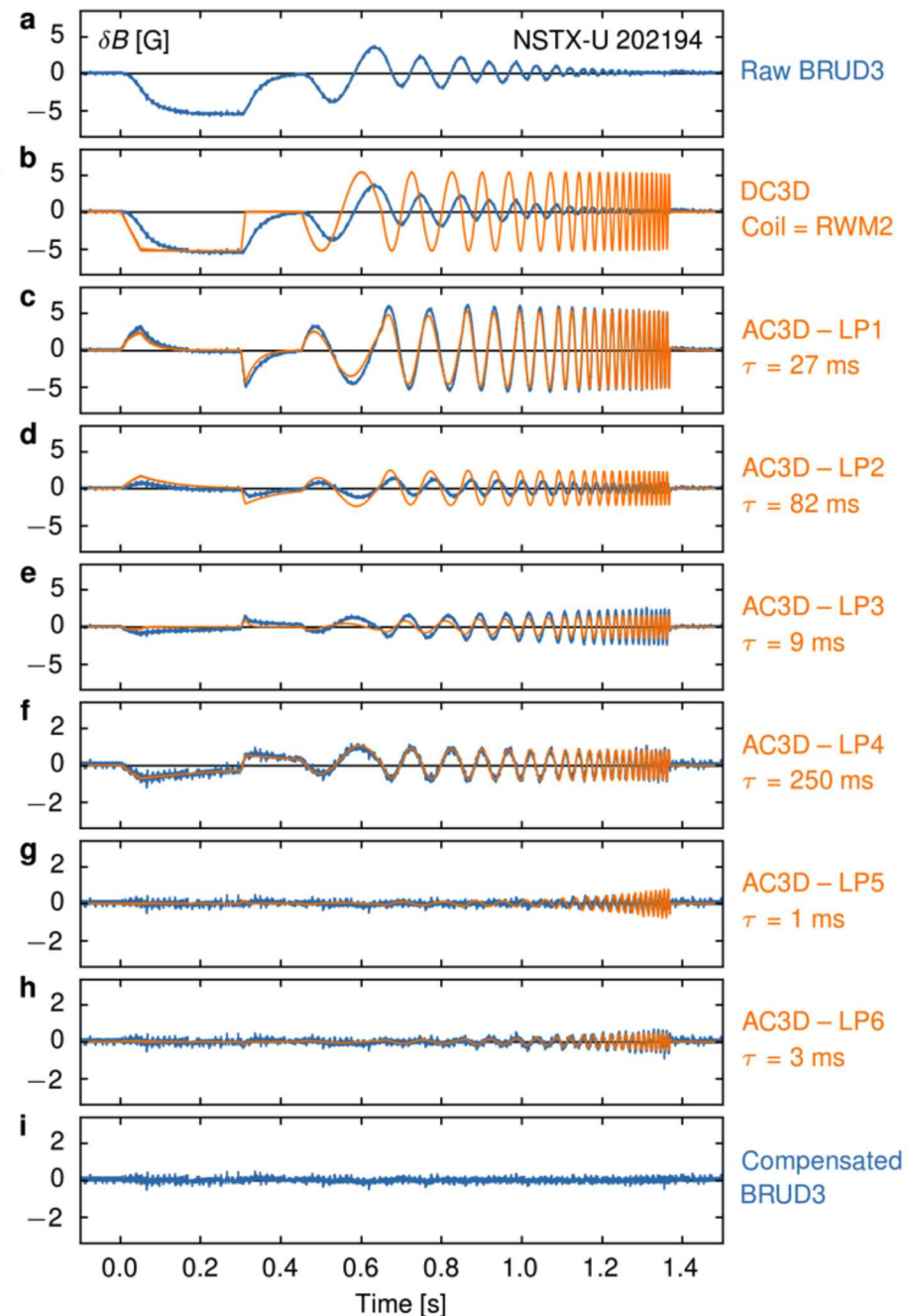
Compensation	Description
DCTF	Direct pickup from the main toroidal field coil
DCPF	Direct pickup from the axisymmetric poloidal field coils
DC3D	Direct pickup from the non-axisymmetric field coils
BP2D / BR2D	Axisymmetric magnetic field compensation to account for sensor gain mismatches
ACTF	Indirect pickup from currents induced by the main toroidal field coil
ACPF	Coil-current-based compensation for indirect pickup from currents induced by the axisymmetric poloidal field coils
ACVL	Loop-voltage-based compensation for indirect pickup from currents induced by the axisymmetric PF coils and by the plasma
AC3D	Indirect pickup from currents induced by non-axisymmetric coils

Diagram of 3D coils and sensors in NSTX-U and DIII-D

Place holder

Example of layered low-pass sensor compensation

- a** A chirped current pulse on the RWM2 coil in NSTX-U generates a vacuum response on the BRUD3 radial field sensor difference pair
- b** Removing just the DC3D contribution amplifies rather than cancels the AC3D response
- c-h** Six low-pass (LP) layers with LPF time constants of $\tau = 1\text{--}250$ ms successfully compensate out the AC3D response
- i** The original ~ 5 G response is compensated down to the noise threshold (< 0.1 G)



Determining the LLP coefficients: DC3D & AC3D

- Acquire a ‘training shot’ for the j^{th} 3D coil (such as the RMW2 example from the previous slide)
- Construct a source matrix, \mathbf{S} , with one row for each time point of the training data and one column for each source term ($N_t \times N_\tau + 1$)
- Construct a coefficient vector, \mathbf{g} , of length $N_\tau + 1$ that holds the compensation coefficients
- Construct a data vector, \mathbf{b} , of length N_t that holds the training data from the i^{th} sensor

Take the pseudo-inverse of \mathbf{S} (\mathbf{S}^+) to identify the coefficients, \mathbf{g} , that best fit the training data, \mathbf{b} :

$$\mathbf{b}_{3D}^i = \mathbf{S}_{3D}^j \cdot \mathbf{g}_{3D}^{ij}$$

$$\mathbf{g}_{3D}^{ij} = (\mathbf{S}_{3D}^j)^+ \cdot \mathbf{b}_{3D}^i$$

$$\mathbf{S}_{3D}^j = \begin{bmatrix} S_{\text{DC3D}}^j(t_1) & S_{\text{AC3D}}^{j1}(t_1) & \dots & S_{\text{AC3D}}^{jN_\tau}(t_1) \\ \vdots & \vdots & \ddots & \vdots \\ S_{\text{DC3D}}^j(t_{N_t}) & S_{\text{AC3D}}^{j1}(t_{N_t}) & \dots & S_{\text{AC3D}}^{jN_\tau}(t_{N_t}) \end{bmatrix} \quad \mathbf{g}_{3D}^{ij} = \begin{bmatrix} G_{\text{DC3D}}^{ij} \\ G_{\text{AC3D}}^{ij1} \\ \vdots \\ G_{\text{AC3D}}^{ijN_\tau} \end{bmatrix} \quad \mathbf{b}_{3D}^i = \begin{bmatrix} \delta B_{\text{raw}}^i(t_1) \\ \vdots \\ \delta B_{\text{raw}}^i(t_{N_t}) \end{bmatrix}$$

Optimizing the LPF τ values maximizes LLP performance, but optimization only needed when using relatively few layers

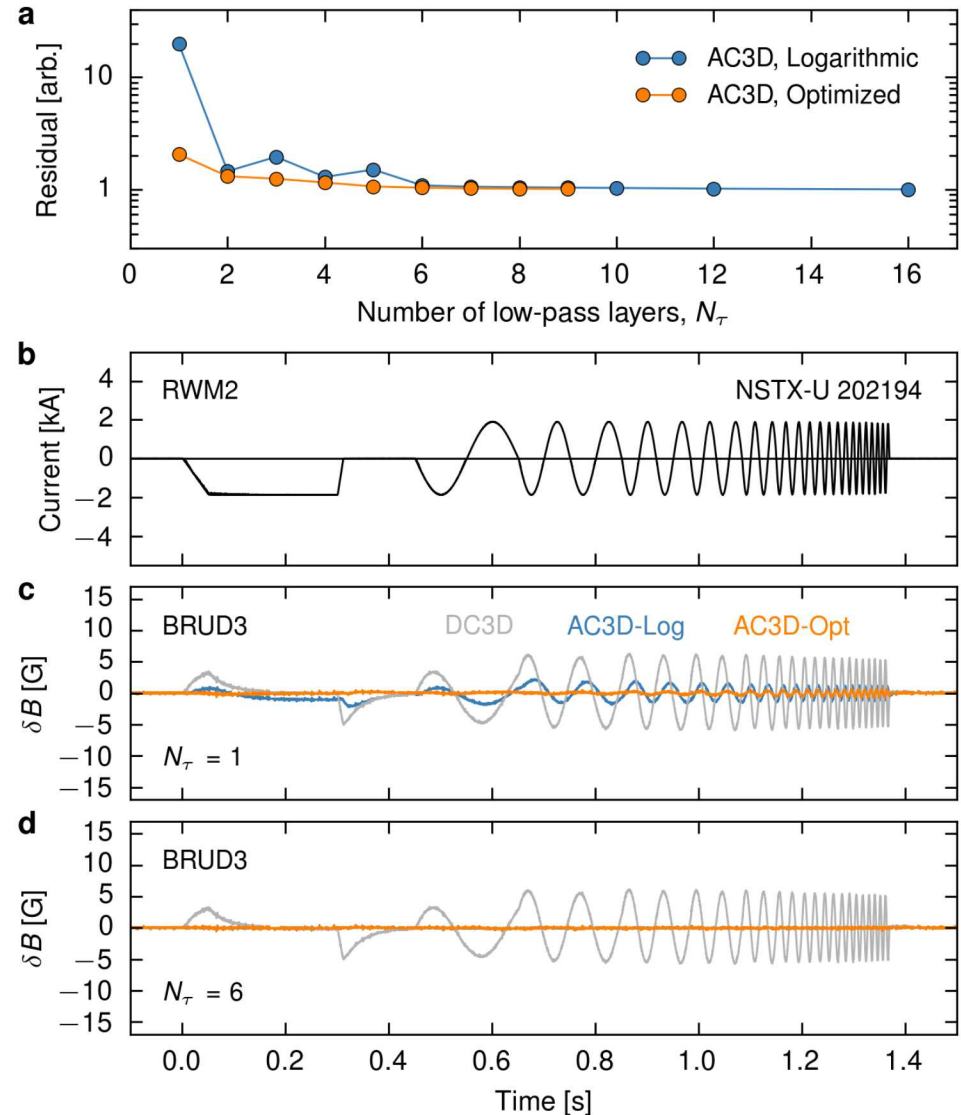
a Residual of compensated data for logarithmically distributed and optimized τ values versus the number of low-pass layers, N_τ

Here, τ optimization improves LLP performance for $N_\tau < 6$

b RWM2 coil current for the training shot, NSTX-U 202194

c Comparison of LLP performance for optimized vs. logarithmically distributed τ values with $N_\tau = 1$

d Comparison of LLP performance for optimized vs. logarithmically distributed τ values with $N_\tau = 6$



Mismatched sensor gains in sensor difference pairs require additional DC axisymmetric field compensation

- Assemble a DC2D source matrix where each row (except the last row) represents a single-coil training shot
- If the sensor gains are mismatched in a sensor difference pair, then a 2D field will generate a spurious signal
- To compensate for the 2D field, include the avg. poloidal and radial fields in the **last two columns** of the DC source matrix
- Use a quiescent plasma shot in the **last row** of the DC source matrix to break the degeneracy of the pseudo-inverse
- Construct AC2D matrices as with AC3D; can combine into global \mathbf{S}_{2D} matrix

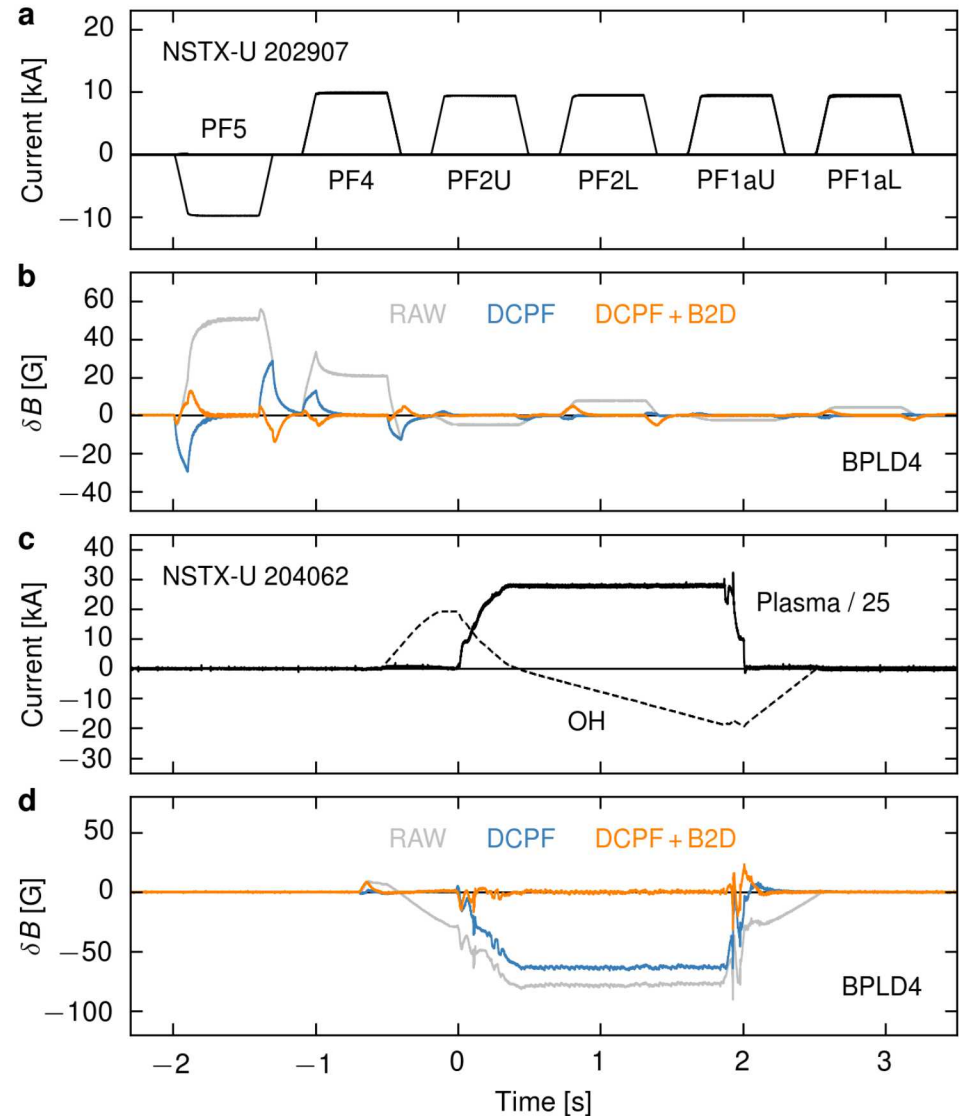
$$\mathbf{S}_{DC2D} = \begin{bmatrix} I_{TF} & 0 & \dots & 0 & \langle B_P \rangle & \langle B_R \rangle \\ 0 & I_{PF}^1 & \dots & 0 & \langle B_P \rangle & \langle B_R \rangle \\ 0 & 0 & \ddots & 0 & \langle B_P \rangle & \langle B_R \rangle \\ 0 & 0 & \dots & I_{PF}^{N_{PF}} & \langle B_P \rangle & \langle B_R \rangle \\ I_{TF} & I_{PF}^1 & \dots & I_{PF}^{N_{PF}} & \langle B_P \rangle & \langle B_R \rangle \end{bmatrix}$$

$$\mathbf{S}_{AC2D}^j = \begin{bmatrix} S_{AC2D}^{j1}(t_1) & \dots & S_{AC2D}^{jN_\tau}(t_1) \\ \vdots & \ddots & \vdots \\ S_{AC2D}^{j1}(t_{N_t}) & \dots & S_{AC2D}^{jN_\tau}(t_{N_t}) \end{bmatrix}$$

$$\mathbf{S}_{2D} = \begin{bmatrix} \mathbf{S}_{DC2D} & \vdots & \vdots & \vdots \\ \vdots & \mathbf{S}_{AC2D}^1 & \vdots & \vdots \\ \vdots & \vdots & \ddots & \vdots \\ \vdots & \vdots & \vdots & \mathbf{S}_{AC2D}^{N_{2D}} \end{bmatrix}$$

Axisymmetric field compensations (BP2D/BR2D) eliminate spurious DC field pickup due to sensor gain mismatches

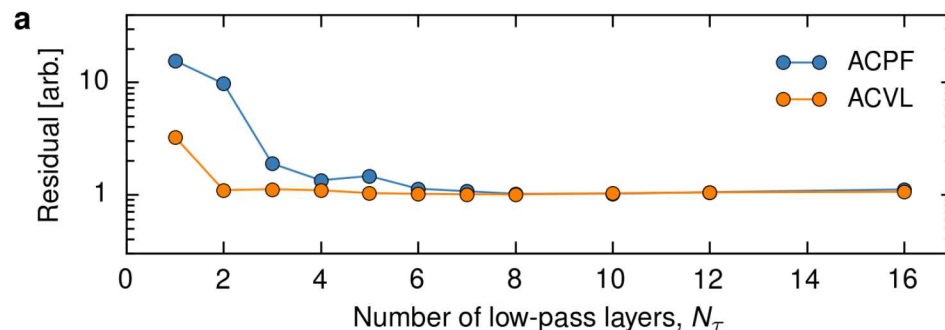
- a** Coil currents from an NSTX-U PF coil training shot
- b** DC flattop pickup in the PF coil training shot is compensated out using either the DCPF matrix or the DCPF + B2D matrix
- c** Coil and plasma current from a quiescent plasma training shot
- d** The DCPF-only compensations leave a residual signal due to the plasma-generated axisymmetric fields \rightarrow Residual eliminated by DCPF + B2D compensations



NSTX-U AC2D (ACPF / ACVL) compensations are imperfect

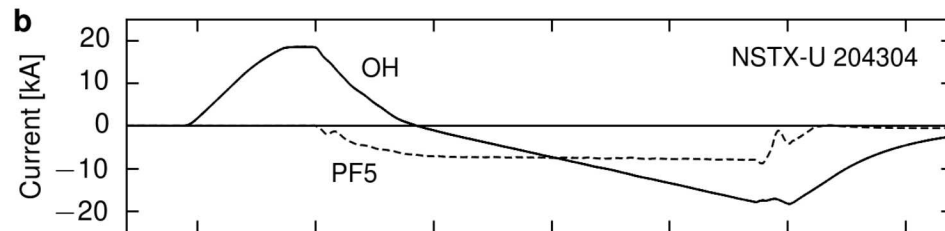
ACVL converges faster (is more efficient) than ACPF

a Residual of compensated data for ACPF ($\partial_t I_{\text{coil}}$) and ACVL (V_{loop}) compensations versus N_τ

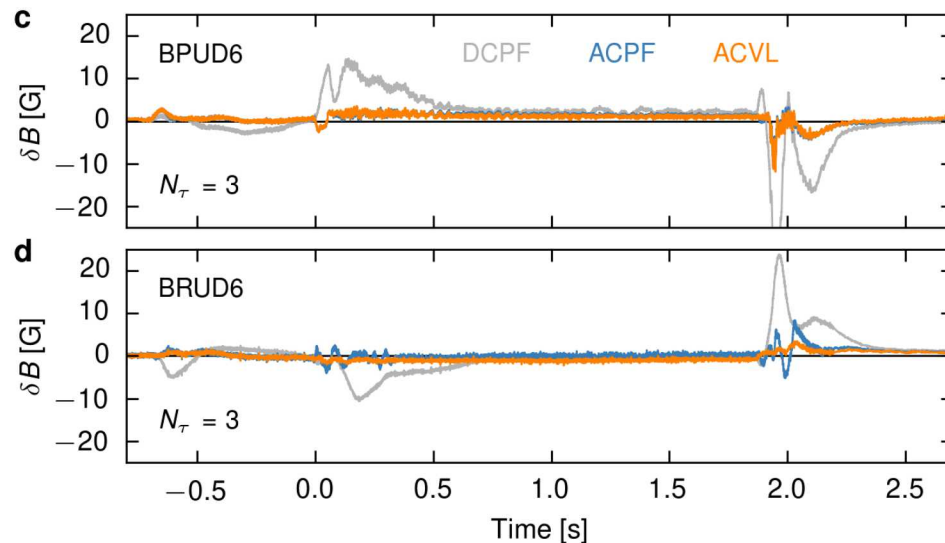


The ACVL compensations converge faster than the ACPF compensations $\rightarrow V_{\text{loop}}$ is a direct measure of inductive drive

b Coil currents in a plasma-like vacuum shot on NSTX-U



c-d Comparisons of ACPF and ACVL compensations for a B_p and a B_R sensor



Imperfect AC2D compensations due to poor training waveforms?

The LLP algorithm has excellent cross-machine portability

Example: Rotating 3D vacuum fields on DIII-D

Flexible python framework developed to facilitate cross-machine portability of LLP compensations

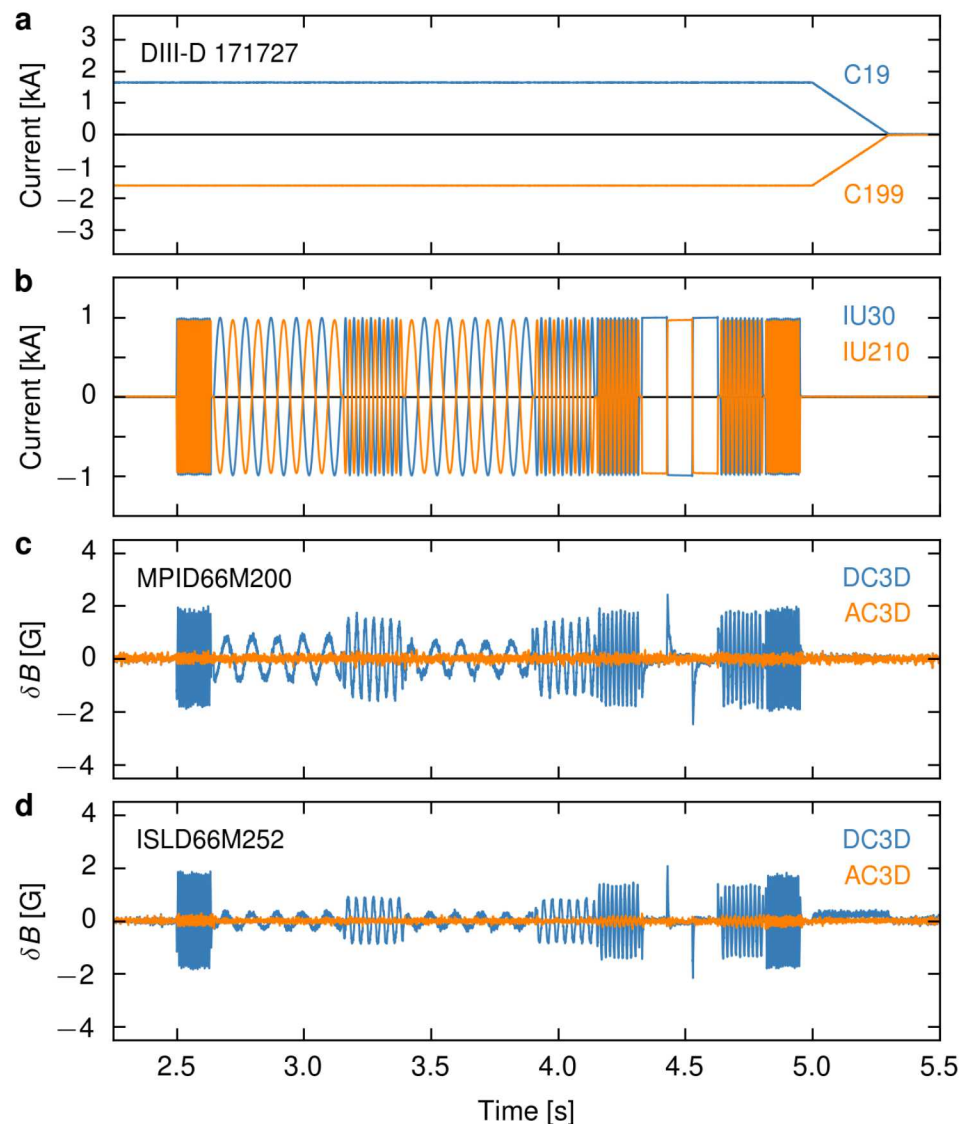
Example: Rotating 3D field vacuum shot on DIII-D (171727)

a C-coil currents (ex-vessel, 3D)

b I-coil currents (in-vessel, 3D)

c-d Comparisons of DC3D and DC3D + AC3D compensations for a B_p sensor (MPID66M) and a B_R sensor (ISLD66M)

Excellent compensations achieved with DC3D + AC3D algorithm



Chirped PF coil training shots improve the AC2D (ACPF) compensations on DIII-D

Traditional AC2D training shots rely on the rise and fall of square waves

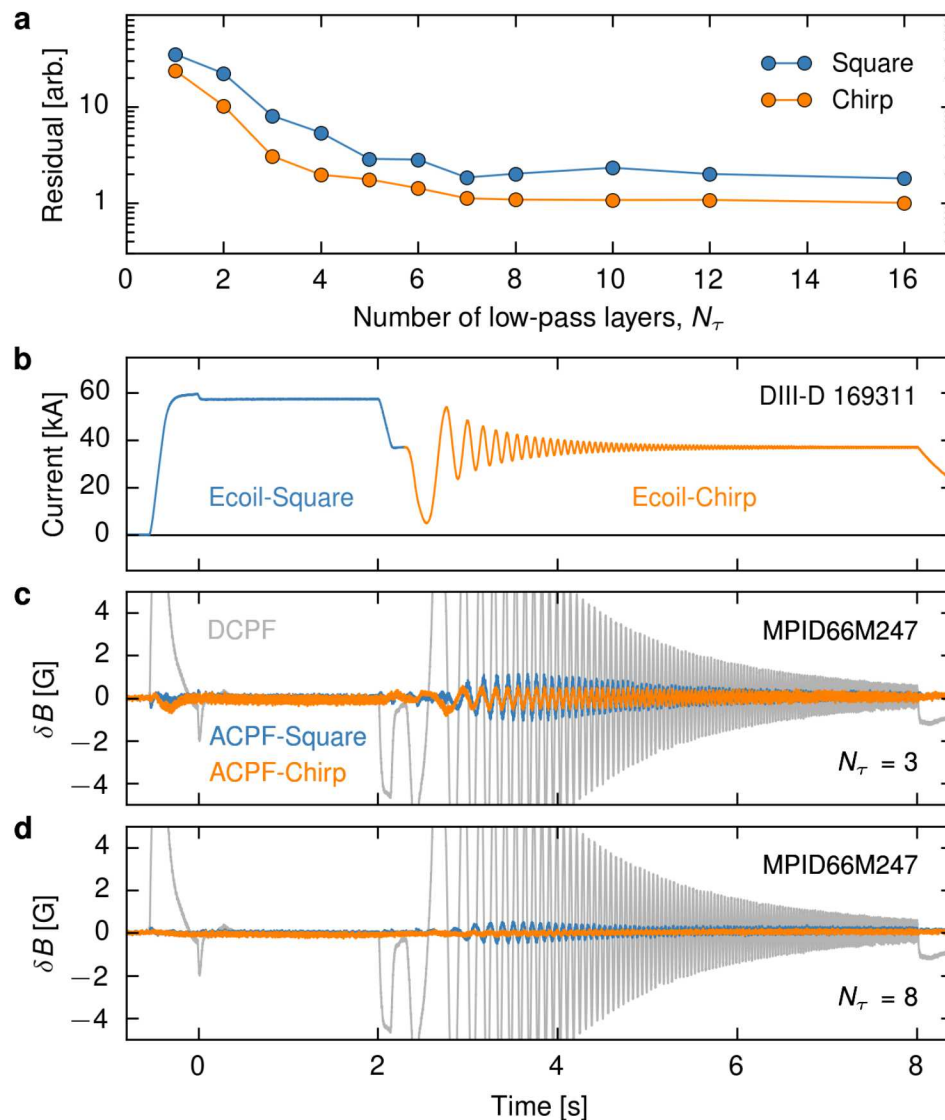
Chirped F- and E-coil shots were acquired on DIII-D to provide higher-bandwidth training data

a Residuals show that chirp-based compensations consistently outperform square wave comps.

b E-coil pulse with square wave and chirped components

c-d Square wave and chirp-based comps. for $N_\tau = 3$ and $N_\tau = 8$

Chirp-based ACPF compensations with $N_\tau = 8$ are highly effective



Mode identification from compensated data

- Fit Fourier amplitudes and phases to the data at each time point:

$$\delta B = \sum_{n=1}^{n_{\max}} |\delta B_n| \cos(n\phi - \phi_n)$$

$$|\delta B_n| = \sqrt{a_n^2 + b_n^2}$$

$$= \sum_{n=1}^{n_{\max}} [a_n \cos(n\phi) + b_n \sin(n\phi)]$$

$$\phi_n = \arctan(b_n/a_n)$$

- Define a mode ID matrix, \mathbf{M} , based on the toroidal locations of the sensor difference pairs. Take the pseudo-inverse to find the mode coefficients, \mathbf{c} :

$$M_{cn}^i = \cos(n\phi_A^i) - \cos(n\phi_B^i)$$

$$M_{sn}^i = \sin(n\phi_A^i) - \sin(n\phi_B^i)$$

$$\mathbf{d} = \mathbf{M} \cdot \mathbf{c}$$

$$\mathbf{c} = \mathbf{M}^+ \cdot \mathbf{d}$$

$$\mathbf{M} = \begin{bmatrix} M_{c1}^1 & M_{s1}^1 & \dots & M_{cn_{\max}}^1 & M_{sn_{\max}}^1 \\ \vdots & \vdots & \ddots & \vdots & \vdots \\ M_{c1}^{N_{\text{sens}}} & M_{s1}^{N_{\text{sens}}} & \dots & M_{cn_{\max}}^{N_{\text{sens}}} & M_{sn_{\max}}^{N_{\text{sens}}} \end{bmatrix}$$

$$\mathbf{c} = \begin{bmatrix} a_{n=1} \\ b_{n=1} \\ \vdots \\ a_{n=n_{\max}} \\ b_{n=n_{\max}} \end{bmatrix}$$

$$\mathbf{d} = \begin{bmatrix} \delta B_{\text{comp}}^{i=1} \\ \vdots \\ \delta B_{\text{comp}}^{i=N_{\text{sens}}} \end{bmatrix}$$

Offline and real-time mode identification in NSTX-U

Example: $n = 1$ mode locking

The 3D (RWM) coils are ramped in an $n = 1$ pattern starting at 0.7 s

The plasma locks at $t = 0.949$ s

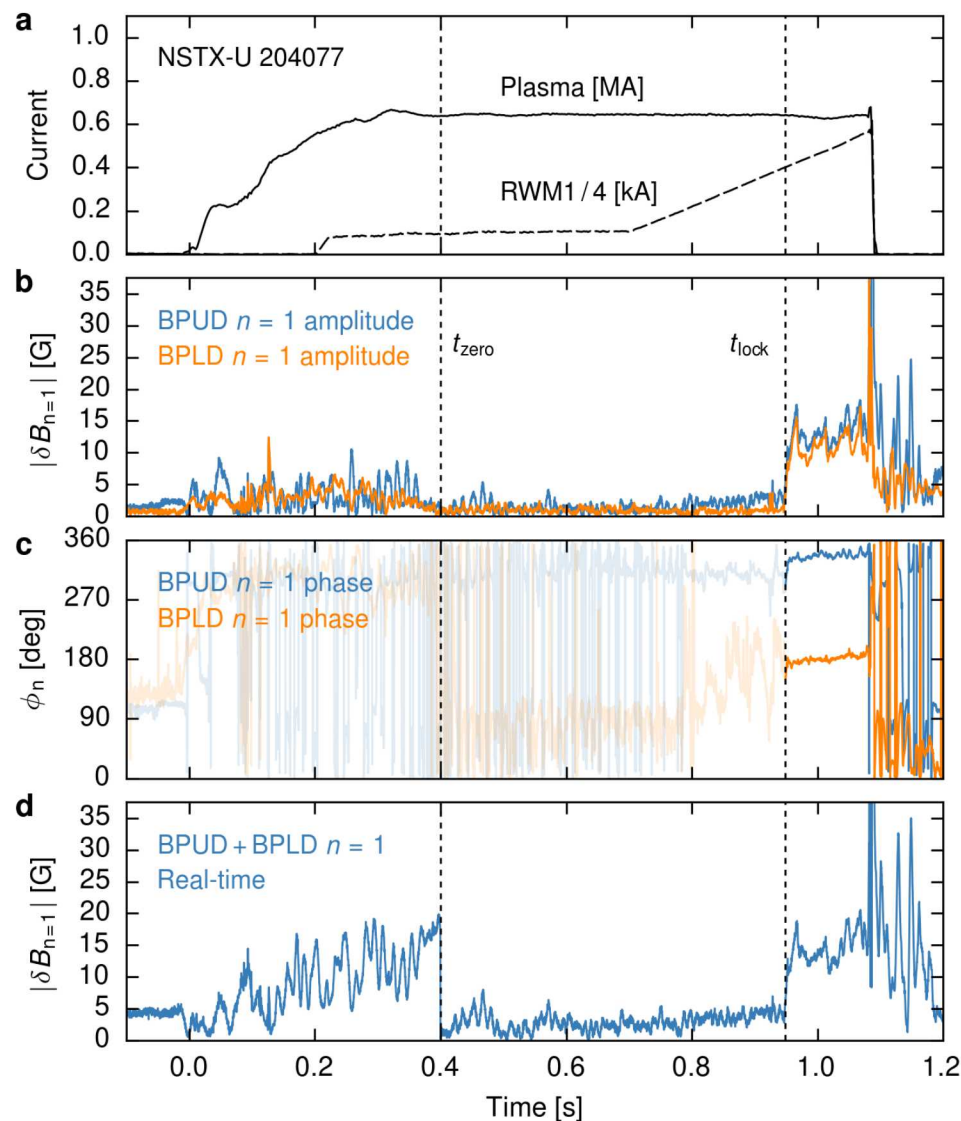
The sensors are 're-zeroed' at 0.4 s to maximize sensitivity in the flattop

a Plasma and 3D coil currents

b Mode locking observed in both BPUD and BPLD $n = 1$ amplitudes

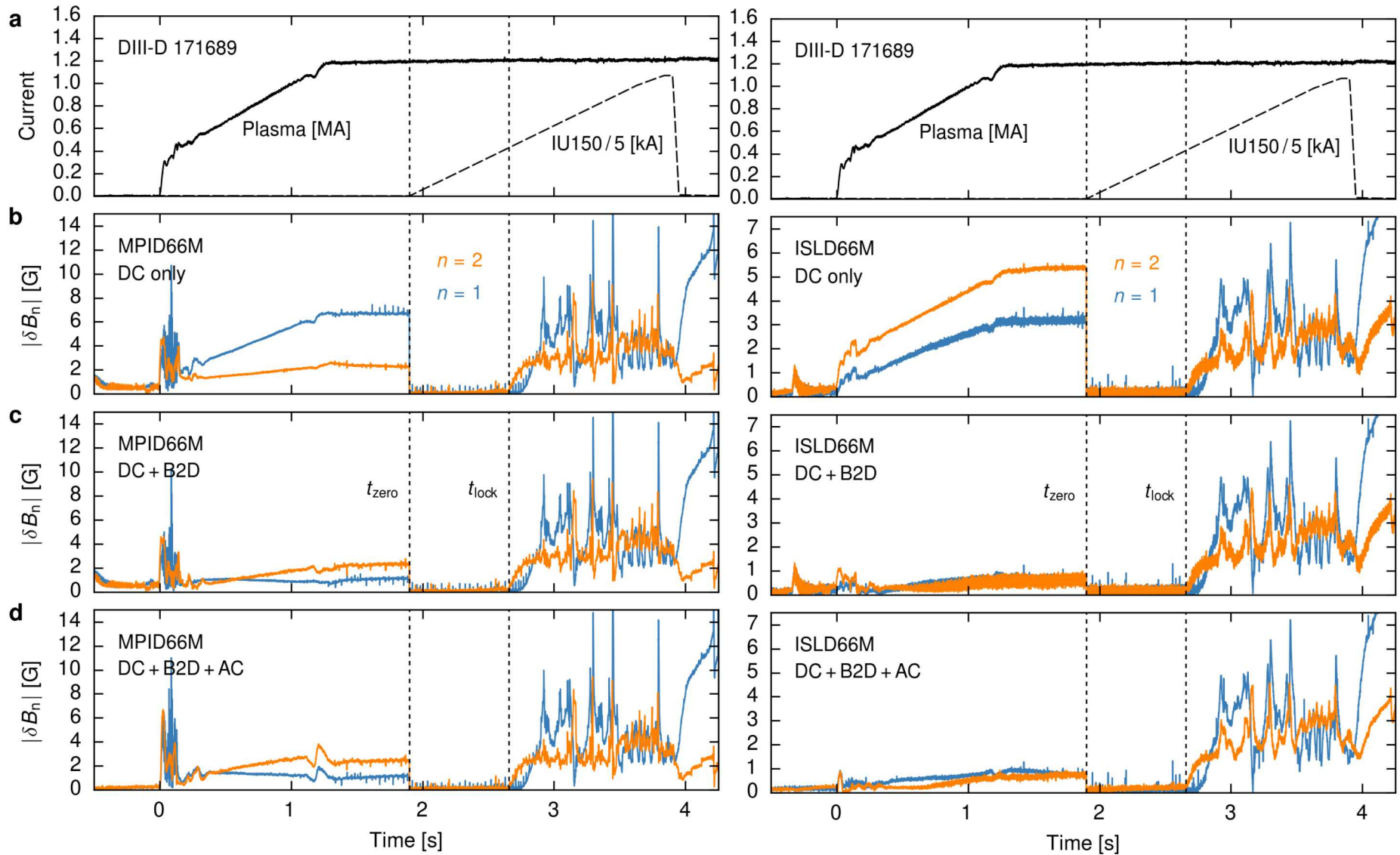
c The $n = 1$ phases after mode onset are locked (and toroidally offset)

d Mode ID was conducted in real-time on this shot. Though the compensations are not well tuned, the locked mode is still identified.



Mode identification also implemented for DIII-D (offline)

Example: $n = 2$ mode locking



Summary and future plans

- Layered low-pass compensations have been implemented on NSTX-U and on DIII-D:
 - Satisfactory vacuum field compensation achieved in both machines
 - LLP compensations could replace dedicated vacuum field shots on DIII-D
 - Offline and real-time mode identification demonstrated in NSTX-U
 - Real-time mode ID enables locked mode detection and dynamic mode control
 - BP2D/BR2D compensations are key for DC2D compensations
 - Chirped PF coil shots in DIII-D improve AC2D compensations
- Path forward:
 - Acquire chirped PF coil shots on NSTX-U to improve AC2D compensations
 - Update NSTX-U real-time algorithm to include an arbitrary number of layers
 - Implement LLP algorithm in OMFIT for broad distribution (already in python)
 - Implement real-time algorithm on DIII-D for improved mode ID and mode control