

# Removing Undesired Periodic Data from Random Vibration Data

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# Introduction and Motivation

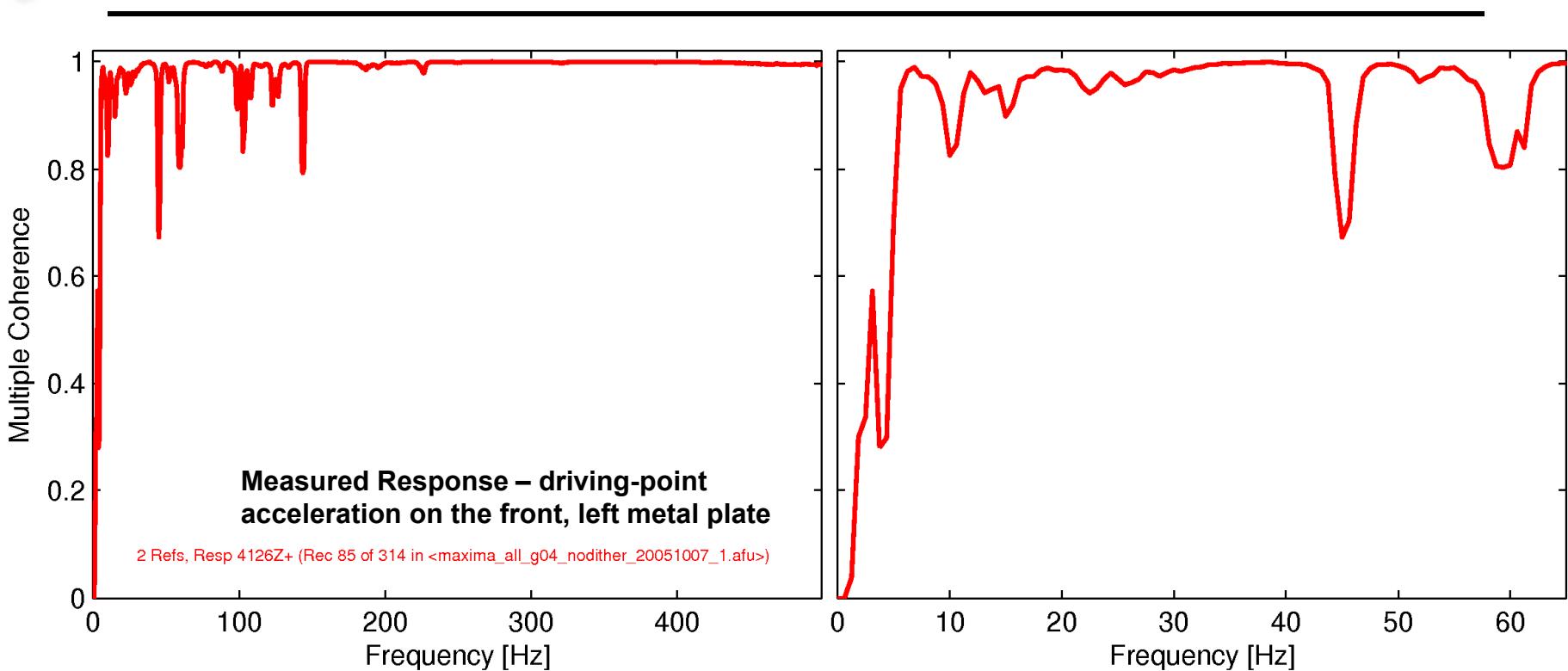
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## Vehicle Modal Testing

- Replaced wheels/tires with square metal plates
- Softly support vehicle by putting air spring under each metal plate
- Use shaker to apply continuous, random, force excitations to the metal plates
- Measure resulting acceleration responses on the plates and various locations in and on the vehicle



# Typical Coherence Data



- **Excitation Force – continuous random force of 17.8 N (4 lb) RMS to both front metal plates**
- **Looks OK, but there is a problem...**



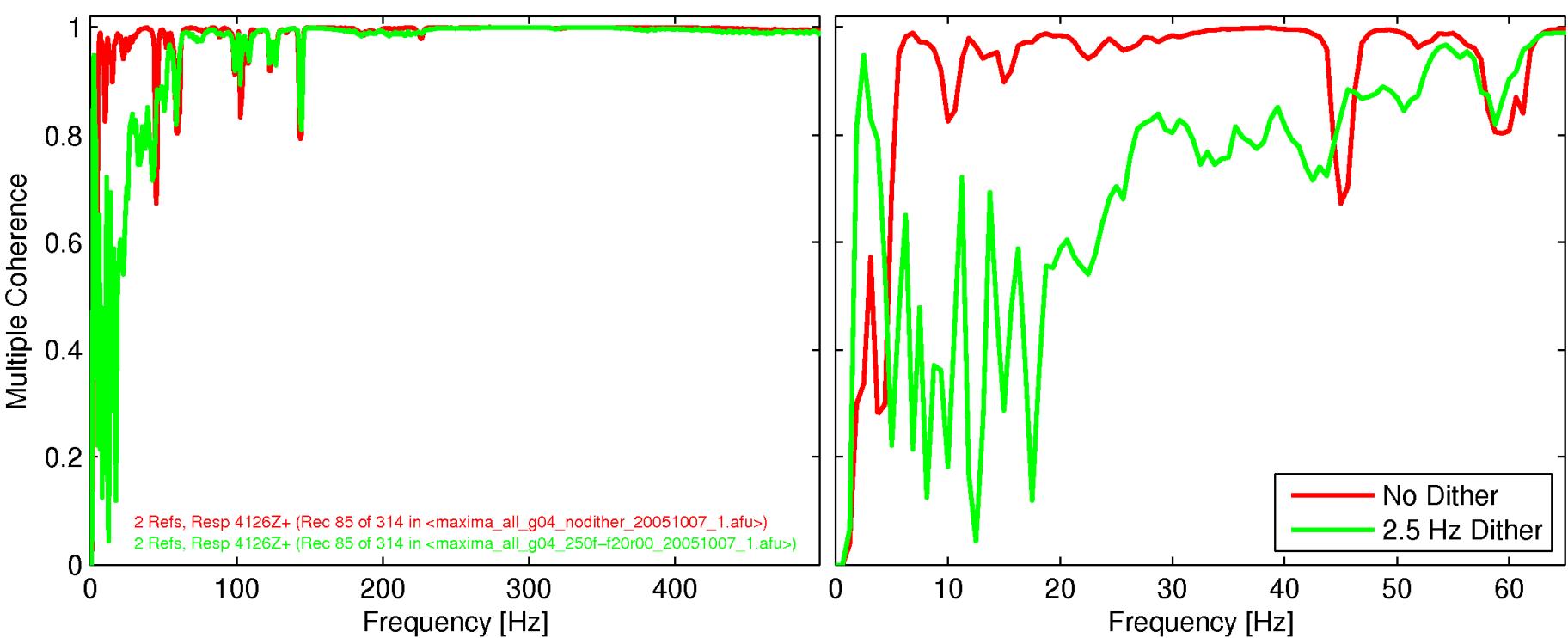
# Introduction and Motivation

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- For small force levels used:
  - shocks act as rigid members
  - sometimes “break free” for portions of the excitation
  - poor FRF results
    - dependent on force level
    - not repeatable
- “Dither” to ensure that shocks are always broken free
  - extra shaker under vehicle that provides single-freq, sinusoidal forcing
  - choose dither freq to minimize required dither force
  - dither freq is well below first elastic mode of the vehicle



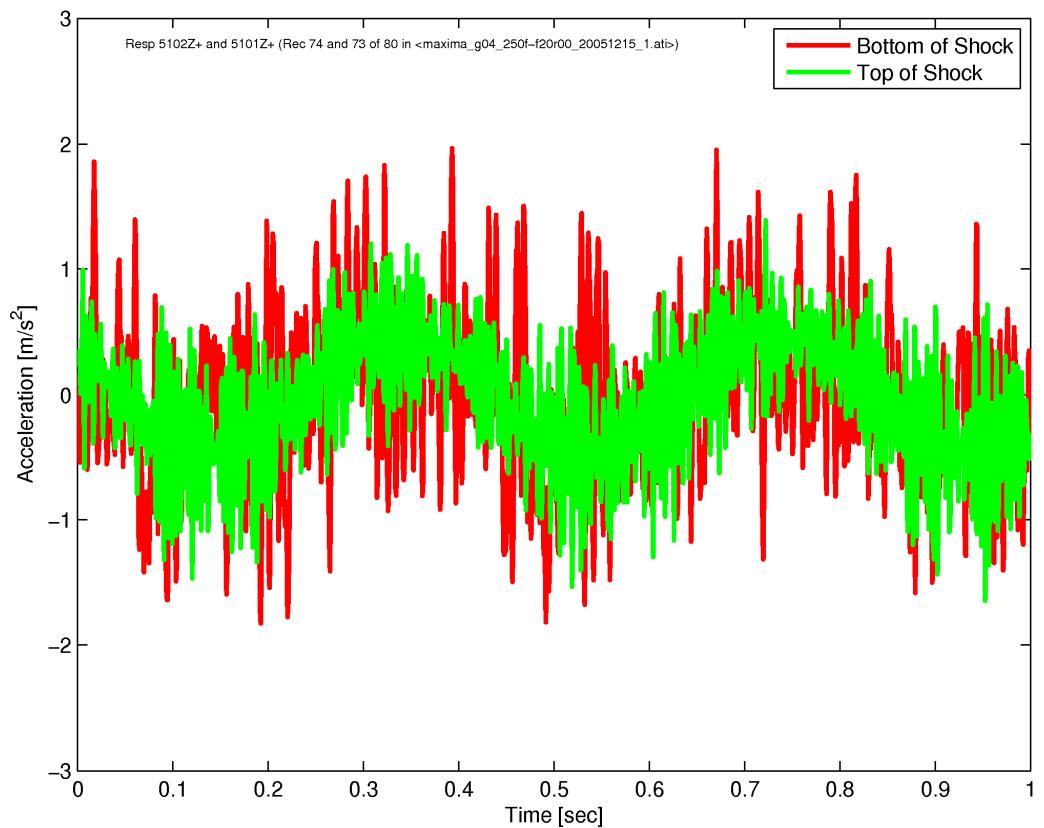
# Coherence With and Without Dither



- Same measurement as before
- Dither – 2.5 Hz, 89.0 N (20 lb) RMS under front of vehicle
- Looks like expected at high freq, but something's wrong below 50 Hz

# Motion of Shocks

- **Accel at the top and bottom of shocks**
  - Shock absorber is broken free as its **top** and **bottom** do not move identically
  - Random motion of shock (due to shaker on plate) is combined with periodic motion due to dithering

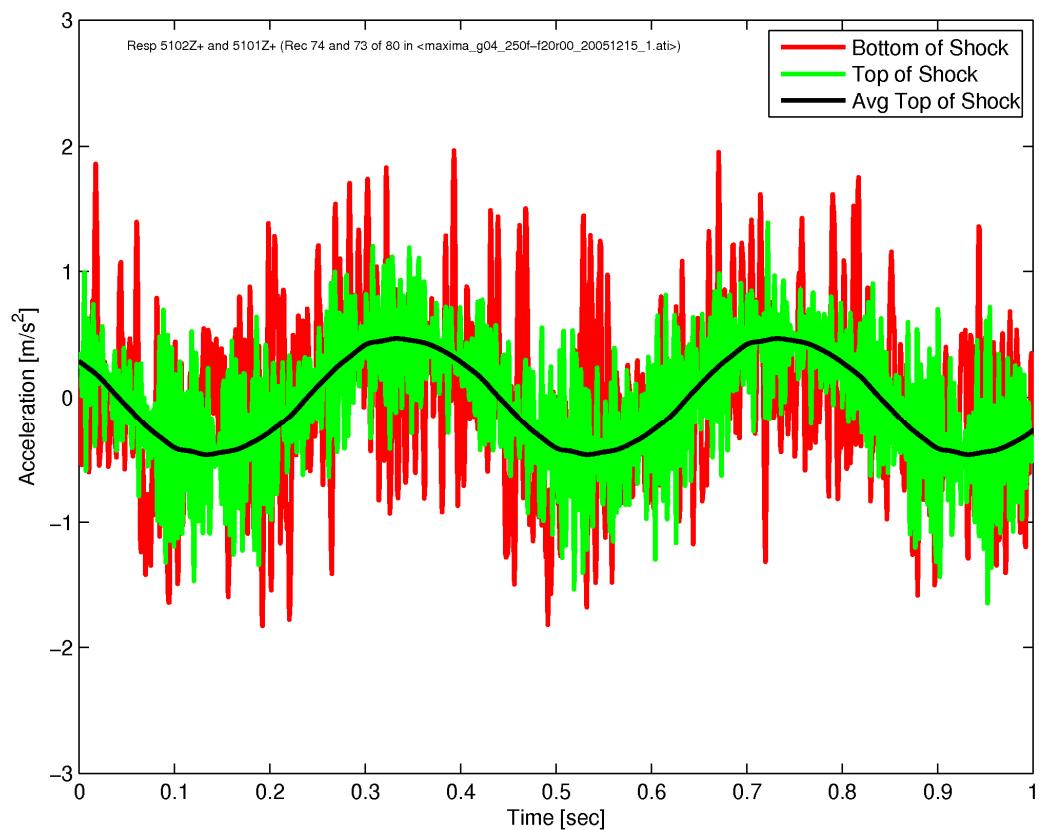


Shock nearest the plate on which random force is applied

- **top** of shock is attached to body
- **bottom** of shock is attached to wheel spindle and metal plate

# Motion of Shocks

- Look at average periodic motion of the shock
  - Top looks like 2.5 Hz sine (just like the applied dither force)



Shock nearest the plate on which random force is applied

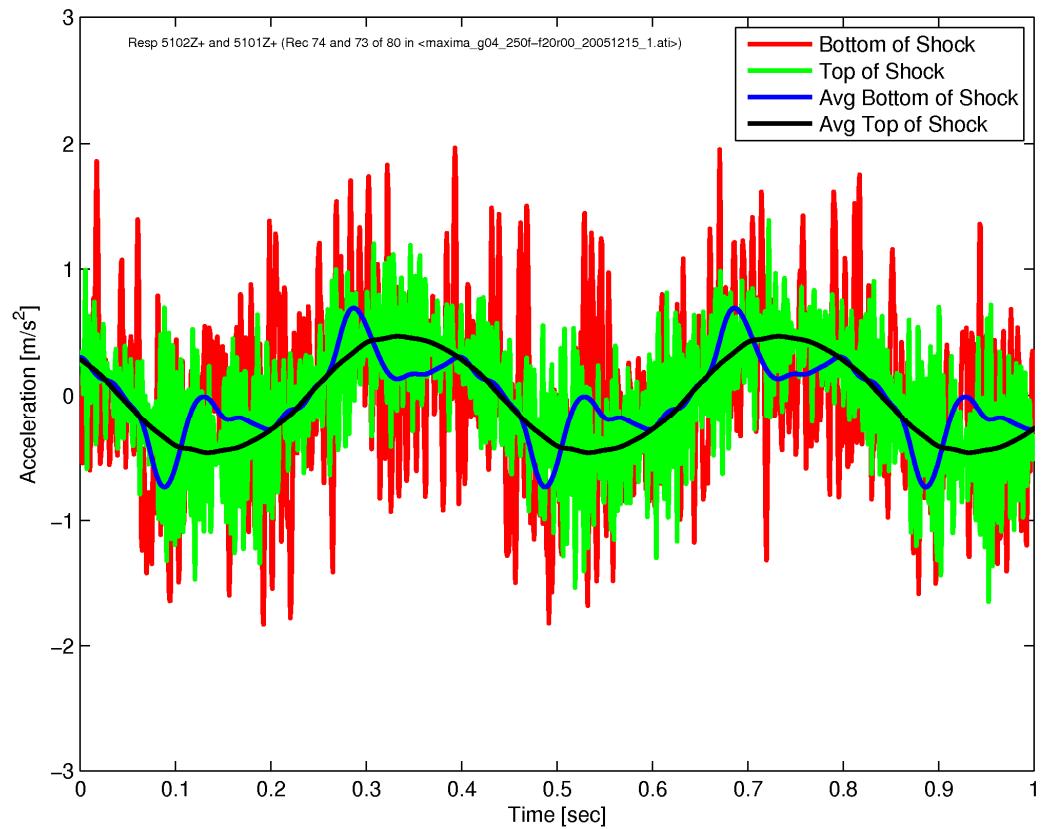
- top of shock is attached to body
- bottom of shock is attached to wheel spindle and metal plate

# Motion of Shocks

- Look at average periodic motion of the shock
  - Top looks like 2.5 Hz sine
  - **Bottom** is periodic, but has lots of higher harmonics

Shock is not linear

- Harmonics due to dithering cause drop in coherence
- Effect extends up into freq range of interest even though dither is at low freq



Shock nearest the plate on which random force is applied

- **top** of shock is attached to body
- **bottom** of shock is attached to wheel spindle and metal plate



# What Should We Do?

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- Remove periodic dither responses from measured data to improve FRFs/coherences
- This is a problem if we only have averaged spectral data
  - Can't just throw out freq lines at dither harmonics
    - saved data had resolution of 0.625 Hz
    - harmonics of 2.5 Hz dither occur every 4 lines
- Solution is to save time-history data instead of averaged FRF data
  - Can later post-process the data
    - calculate averaged spectral results
      - change freq resolutions/windowing
    - investigate glitches/overranges
    - remove periodic noise present in the data
    - investigate nonstationary or nonlinear behavior



# Lobbying for Saving More Data

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- Computers have vastly-increased capabilities in processing power, RAM memory, and hard disk storage space
- Advocate always recording time-history data
  - Modal testers are conditioned to acquire averaged spectral data
    - Never question why
  - Brandt, et. al. (*Sound and Vibration*, Apr.2006)
    - Only saving averaged spectral data and discarding time data is a remnant held over from the past when computers were extremely limited compared to what is available today



# Lobbying for Saving More Data

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- For these tests the time-history data file size was 20 times larger than the averaged spectral data
  - 48.6 Mbytes for time-history data
  - 2.4 Mbytes for averaged spectral data (FRF, autospectra, coherence)
- Extra storage cost is minimal compared to the advantages of having the raw data
  - days/months to plan, set up, and perform test
  - one-of-a-kind test or hardware

80 channels at 1280 Hz for 192 sec  
(245,760 samples/chan)

averaged into segments of 2048 samples  
(801 freq lines 0-500 Hz, 0.625 Hz resolution)



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These hard drives can store > 5000 / 8000 time-history data files

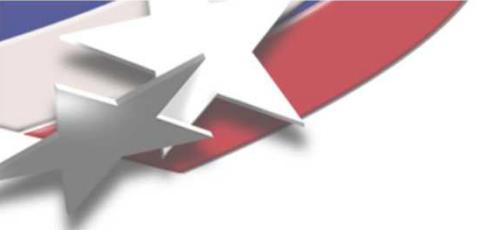




# Removing Periodic Noise

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- All this increased computer power is also what makes this technique possible
  - Removing periodic noise from random data has been done before – adaptive filtering, etc.
  - We don't need to be quite so clever since we have lots of power available
    - Directly fit sinusoids to the data
      - very simple to understand
    - Technique can be implemented in only a few lines of computer code
    - Can process large data sets very quickly
      - 80 channels with 245,760 samples/channel in less than 1 minute on my laptop



# Mathematical Development

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- Fit continuous function  $y(t)$  with  $N$  harmonics of a sinusoid with fundamental frequency ( $\omega$ )

$$y \approx c_0 + c_1 \sin(\omega t + \theta_1) + c_2 \sin(2\omega t + \theta_2) + \cdots + c_N \sin(N\omega t + \theta_N)$$

- Can also be written as

$$y \approx c_0 + [a_1 \cos(\omega t) + b_1 \sin(\omega t)] + [a_2 \cos(2\omega t) + b_2 \sin(2\omega t)] + \cdots + [a_N \cos(N\omega t) + b_N \sin(N\omega t)]$$

- Second equation is preferable for optimization as all  $(2N + 1)$  coefficients have similar sensitivities



# Mathematical Development

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- For sampled data, write equation in matrix form

$$\{y\} = \begin{Bmatrix} y_1 \\ y_2 \\ \vdots \\ y_{nPts} \end{Bmatrix} \approx \begin{bmatrix} 1 & \cos(\omega t_1) & \cdots & \cos(N\omega t_1) & \sin(\omega t_1) & \cdots & \sin(N\omega t_1) \\ 1 & \cos(\omega t_2) & \cdots & \cos(N\omega t_2) & \sin(\omega t_2) & \cdots & \sin(N\omega t_2) \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ 1 & \cos(\omega t_{nPts}) & \cdots & \cos(N\omega t_{nPts}) & \sin(\omega t_{nPts}) & \cdots & \sin(N\omega t_{nPts}) \end{bmatrix} \begin{Bmatrix} c_0 \\ a_1 \\ \vdots \\ a_N \\ b_1 \\ \vdots \\ b_N \end{Bmatrix}$$

- For time-history with  $nPts$  samples
  - $y$  is  $nPts \times 1$  column vector
  - coefficients are  $(2N + 1) \times 1$  column vector
  - sinusoidal harmonics are  $nPts \times (2N + 1)$  matrix
    - time values ( $t_i$ ) come from data sampling freq.
    - if fundamental freq ( $\omega$ ) is known, the harmonics matrix and its pseudo-inverse can be calculated

# Mathematical Development

**The  $(2N + 1)$  coefficients can now be calculated in a least-squares sense by**

pseudo-inverse only needs to be calculated once, then it can be used for all data records

$$\left\{ \begin{array}{l} c_0 \\ a_1 \\ \vdots \\ a_N \\ b_1 \\ \vdots \\ b_N \end{array} \right\} = \left[ \begin{array}{ccccccc} 1 & \cos(\omega t_1) & \cdots & \cos(N\omega t_1) & \sin(\omega t_1) & \cdots & \sin(N\omega t_1) \\ 1 & \cos(\omega t_2) & \cdots & \cos(N\omega t_2) & \sin(\omega t_2) & \cdots & \sin(N\omega t_2) \\ \vdots & \vdots & & \vdots & \vdots & & \vdots \\ 1 & \cos(\omega t_{nPts}) & \cdots & \cos(N\omega t_{nPts}) & \sin(\omega t_{nPts}) & \cdots & \sin(N\omega t_{nPts}) \end{array} \right]^+ \left\{ \begin{array}{l} y_1 \\ y_2 \\ \vdots \\ y_{nPts} \end{array} \right\}$$



# Mathematical Development

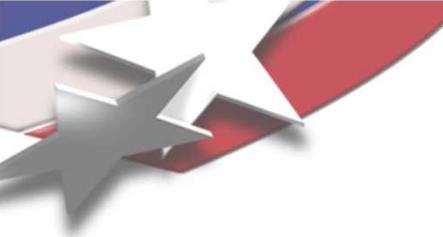
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- The best fit to  $y$  using the  $N$  harmonics is

$$\{y_{\text{periodic}}\} = \begin{bmatrix} 1 & \cos(\omega t_1) & \cdots & \cos(N\omega t_1) & \sin(\omega t_1) & \cdots & \sin(N\omega t_1) \\ 1 & \cos(\omega t_2) & \cdots & \cos(N\omega t_2) & \sin(\omega t_2) & \cdots & \sin(N\omega t_2) \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ 1 & \cos(\omega t_{n_{\text{Pts}}}) & \cdots & \cos(N\omega t_{n_{\text{Pts}}}) & \sin(\omega t_{n_{\text{Pts}}}) & \cdots & \sin(N\omega t_{n_{\text{Pts}}}) \end{bmatrix} \begin{Bmatrix} c_0 \\ a_1 \\ \vdots \\ a_N \\ b_1 \\ \vdots \\ b_N \end{Bmatrix}$$

- The time-history with the harmonics removed is

$$\{y_{\text{random}}\} = \{y\} - \{y_{\text{periodic}}\}$$



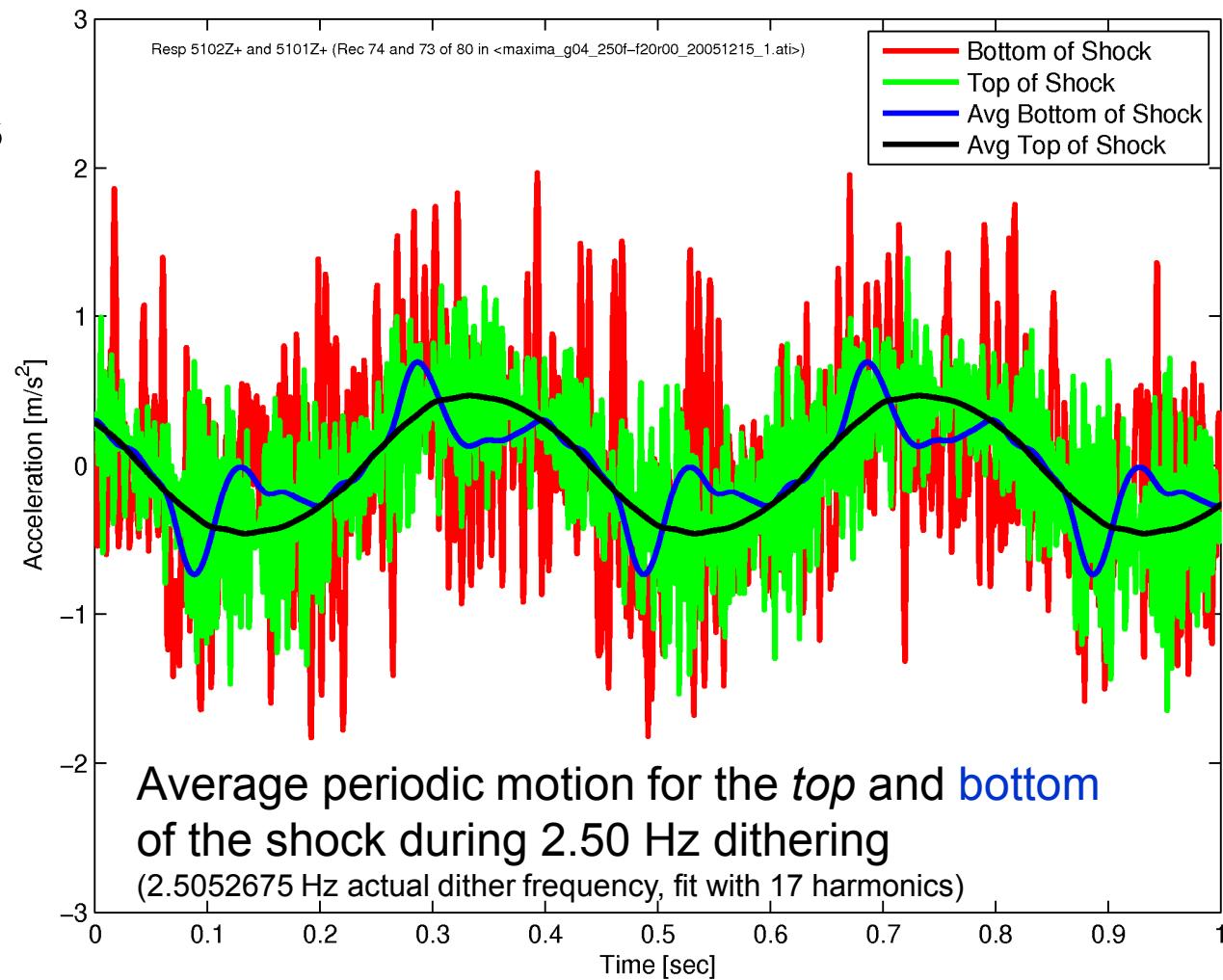
# Implementation of Technique

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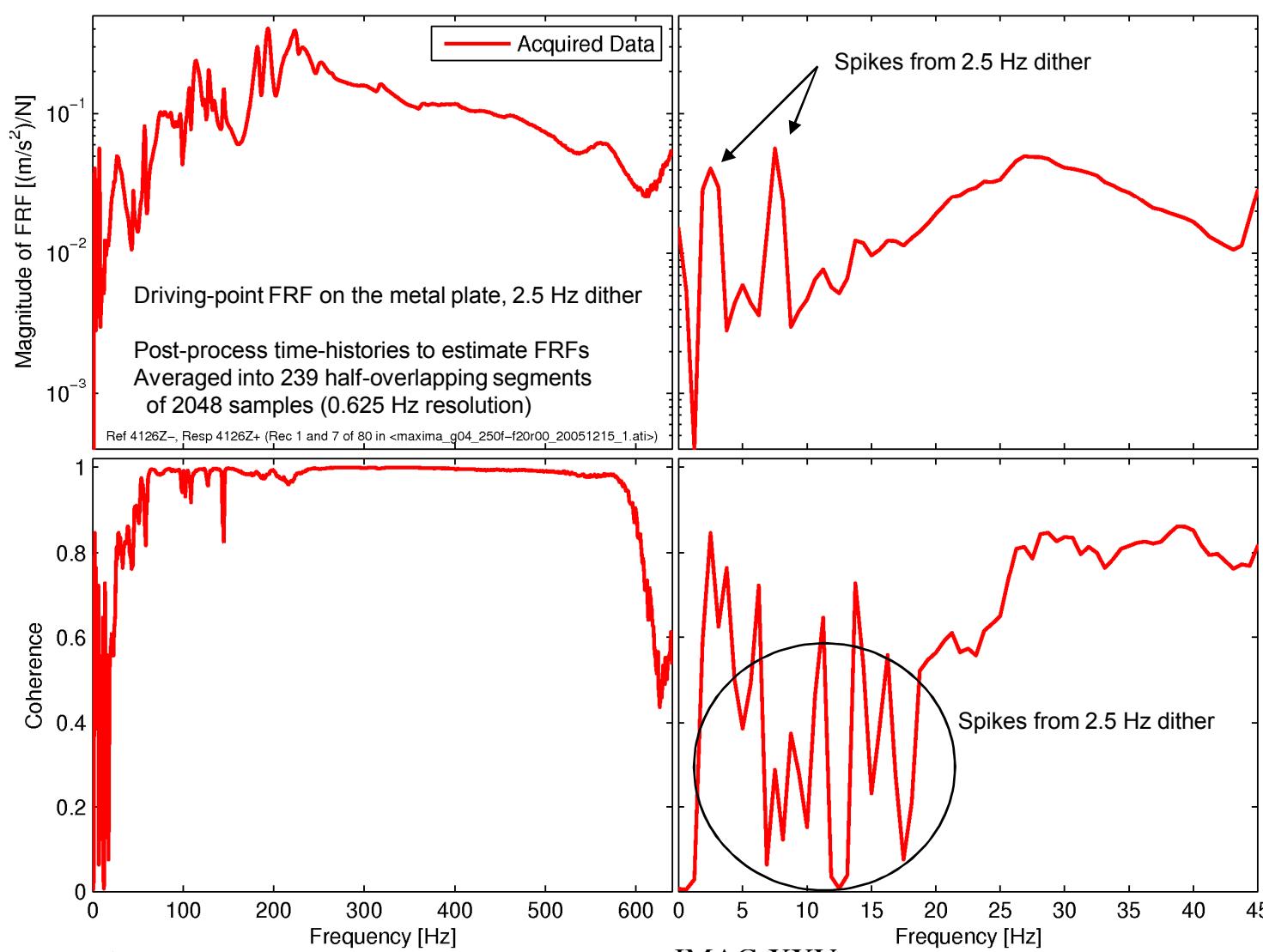
- Technique has been implemented in MATLAB
  - requires less than 30 lines of MATLAB code
  - complete code listing is included in the paper
- Must measure and save data as **CONTINUOUS** time-history records
  - do **NOT** use option to automatically discard records when an overrange is detected
- Automated optimization finds fundamental freq.
  - user must supply initial guess
  - need extremely accurate fundamental frequency
    - after  $T$  seconds, phase error  $\Delta\theta = 360^\circ T \Delta f$  degrees
- Can select how many harmonics ( $N$ ) to use in fit

# Example of Technique

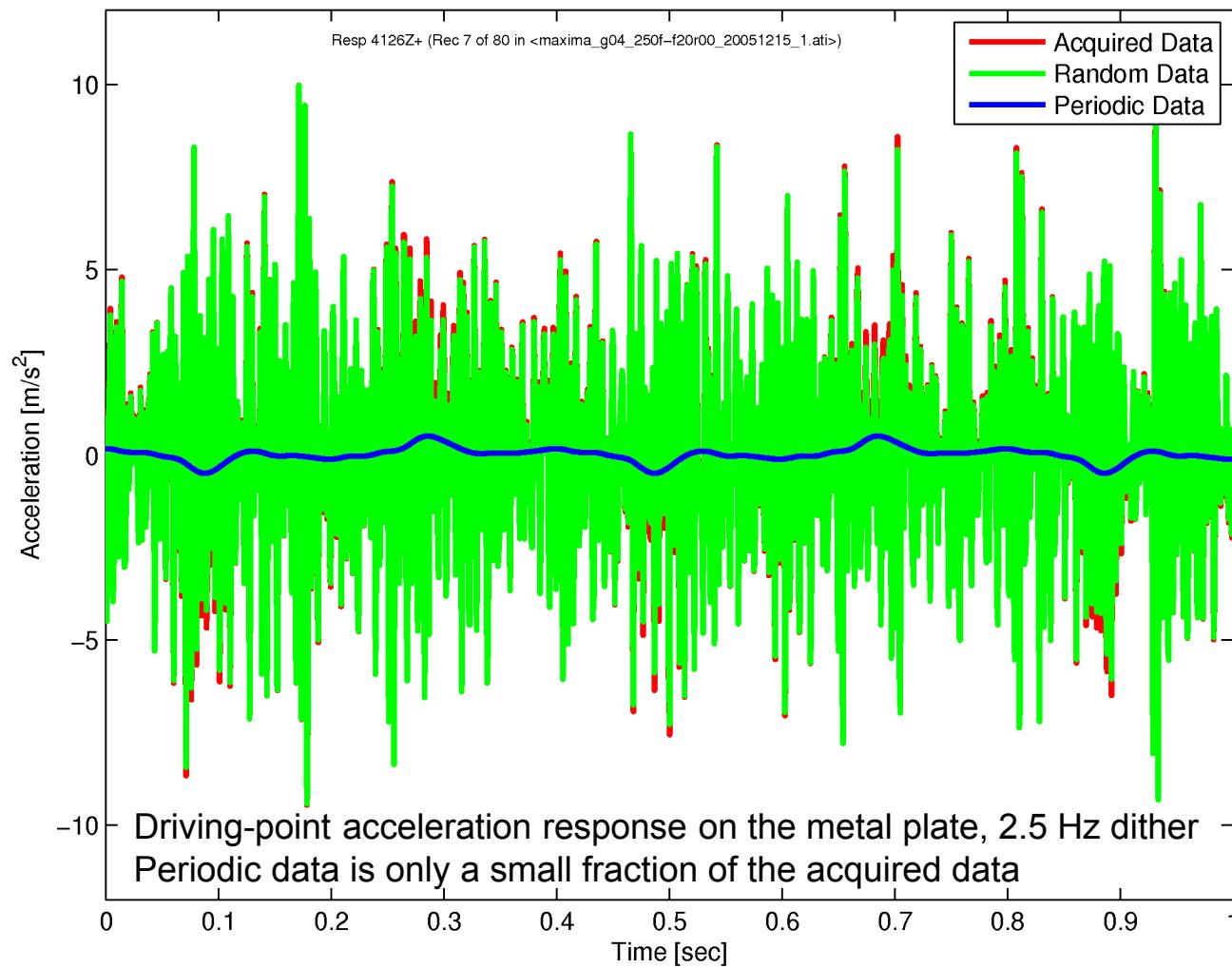
- Have already shown results from the technique



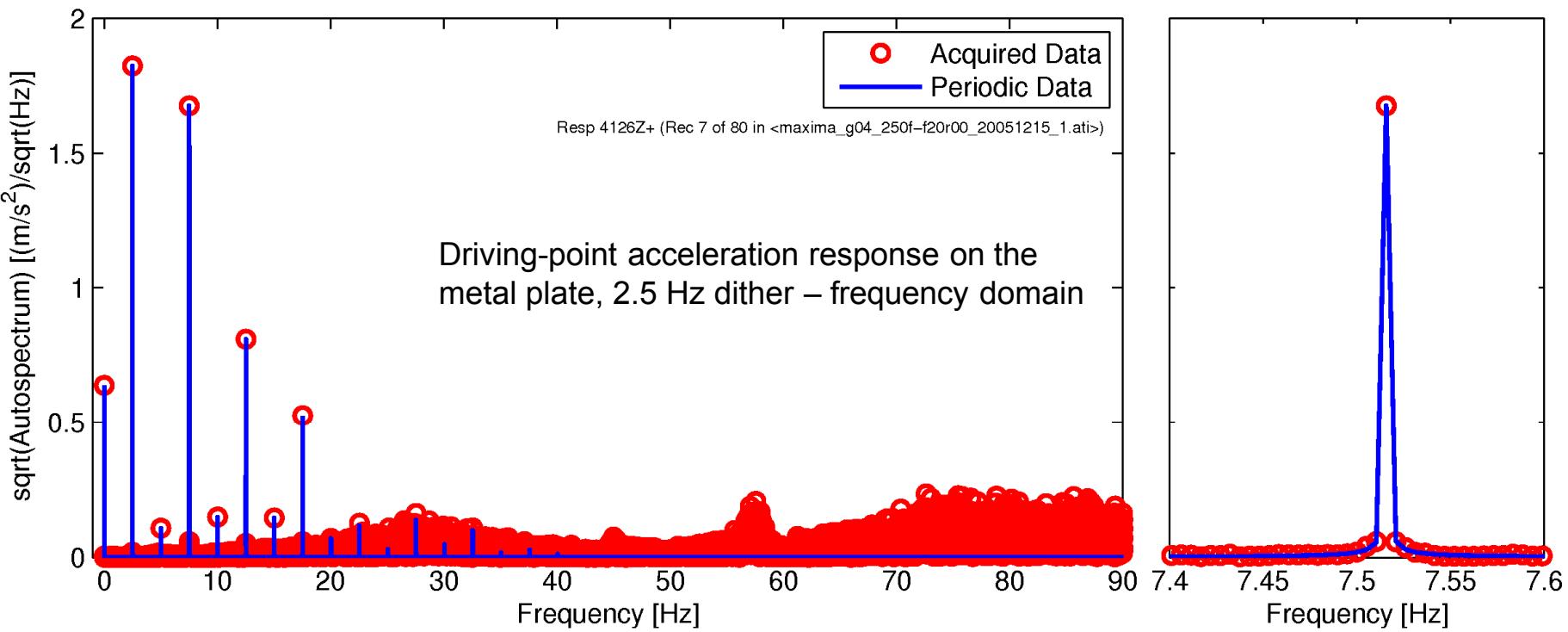
# Example — Dither Removal



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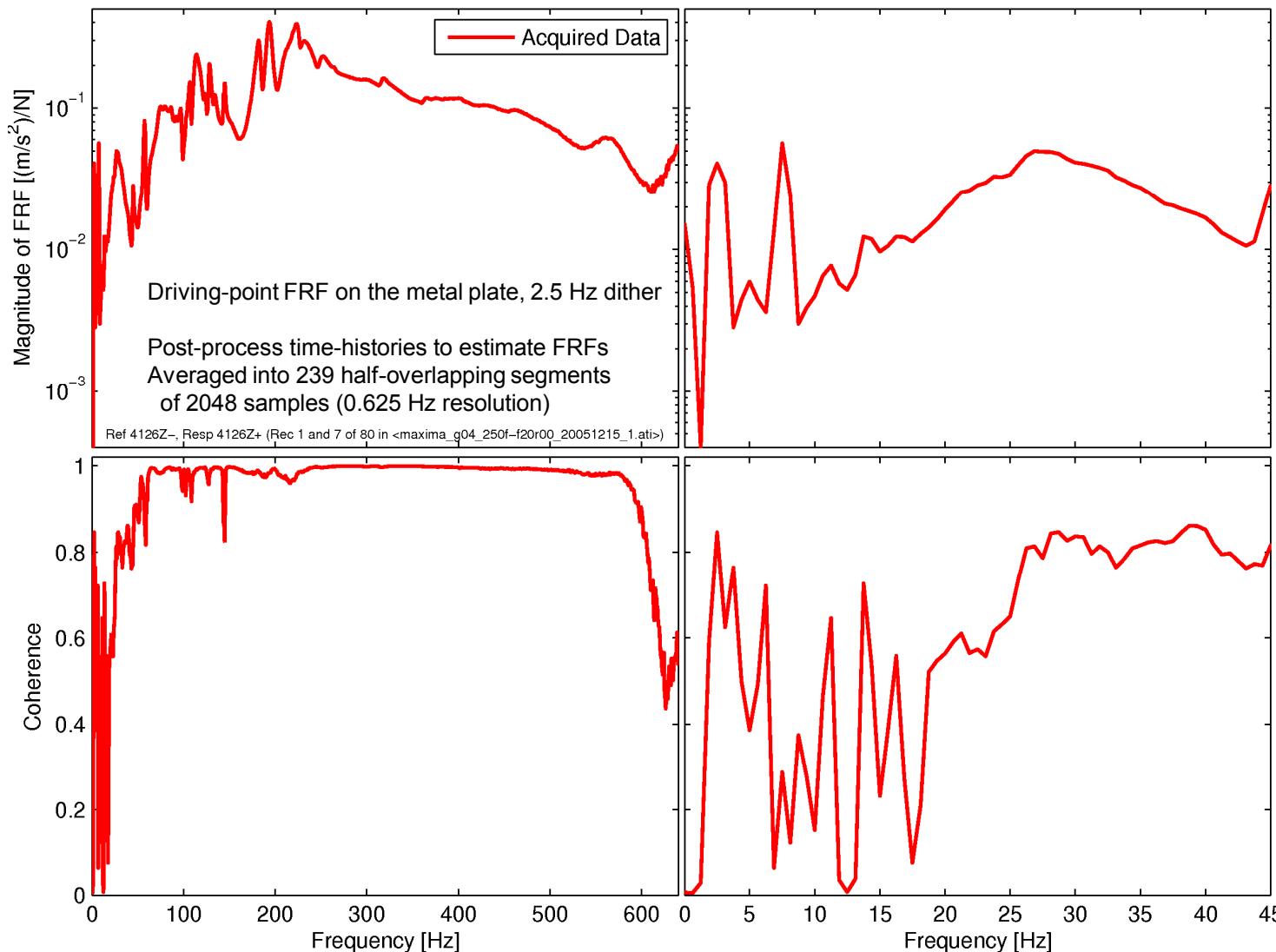


# Example — Dither Removal

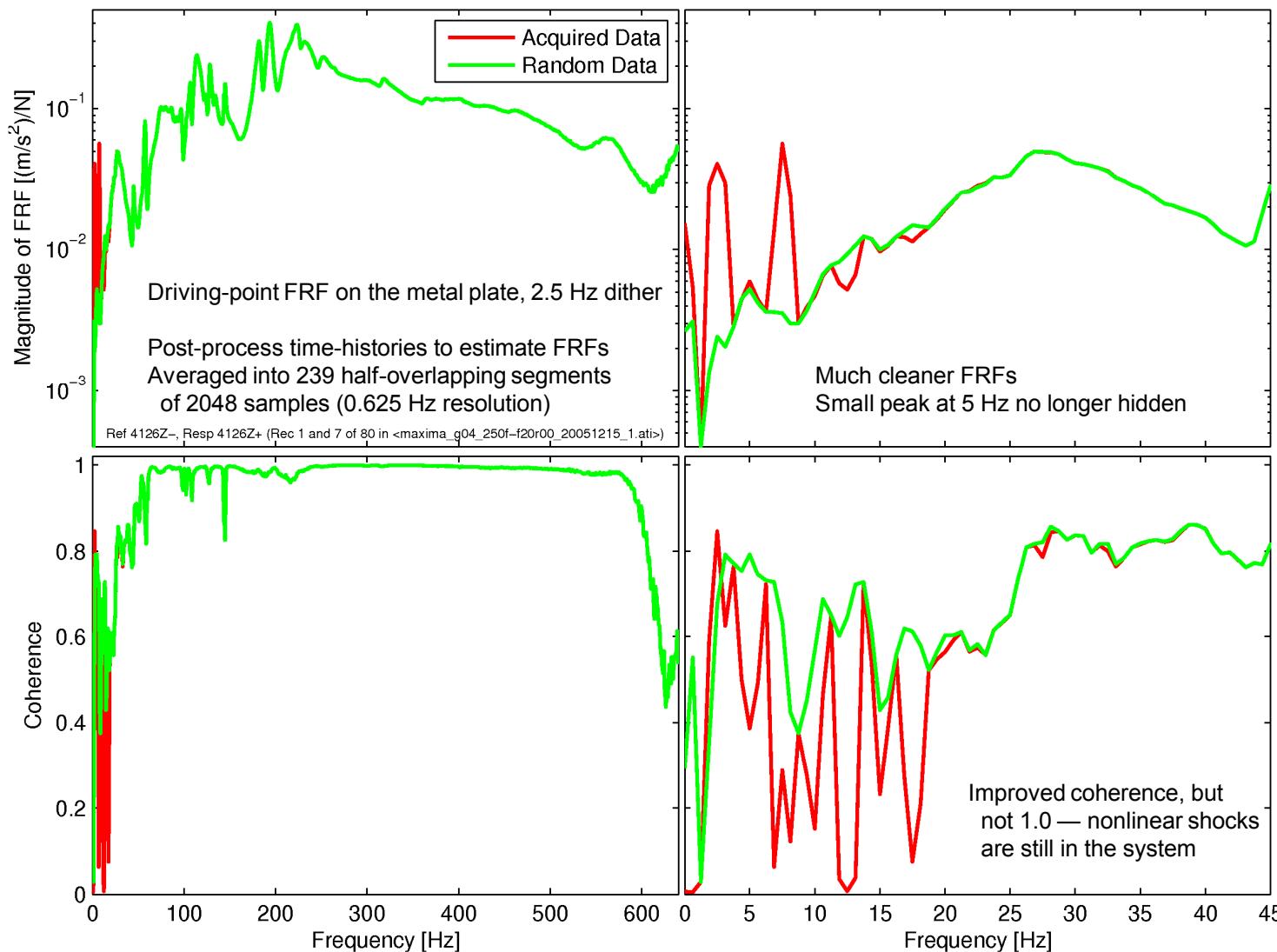


Processed time-history as a single, 245,760-sample record (0.00521 Hz resolution)  
Dither harmonics visually dominate the acquired freq-domain data (especially the odd harmonics)...  
...but only account for 0.5% of mean-squared acceleration

# Example — Dither Removal



# Example — Dither Removal

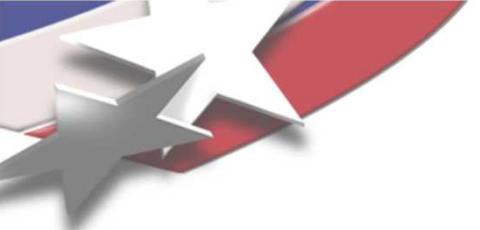




# Conclusions

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- Have developed/demonstrated a simple technique for identifying a stationary, periodic signal in what is otherwise random data
  - The periodic data can be removed from the acquired data, resulting in random data that can be post-processed in the usual fashion
  - The acquired data must be saved as *continuous* time-history data, not averaged frequency-domain data
- Advocate always recording time-history data



# Extra Information

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- Have also used technique to remove 60 Hz powerline noise
  - Power frequency is not very constant
- Why not just filter?
  - Filtering gets rid of a range of frequencies
    - can't just “pluck out” a single frequency in the midst of data you want to keep
    - filter rolls off – does not give a sharp cutoff
  - Filtering doesn't give a truly stationary signal
    - has some slight cycle-to-cycle variation
    - initial transient at start of signal