

# On-Board Equipment Condition Monitoring

**Dan Maraini**

Manager of Bogie Systems Engineering

Amsted Rail Company, Inc.



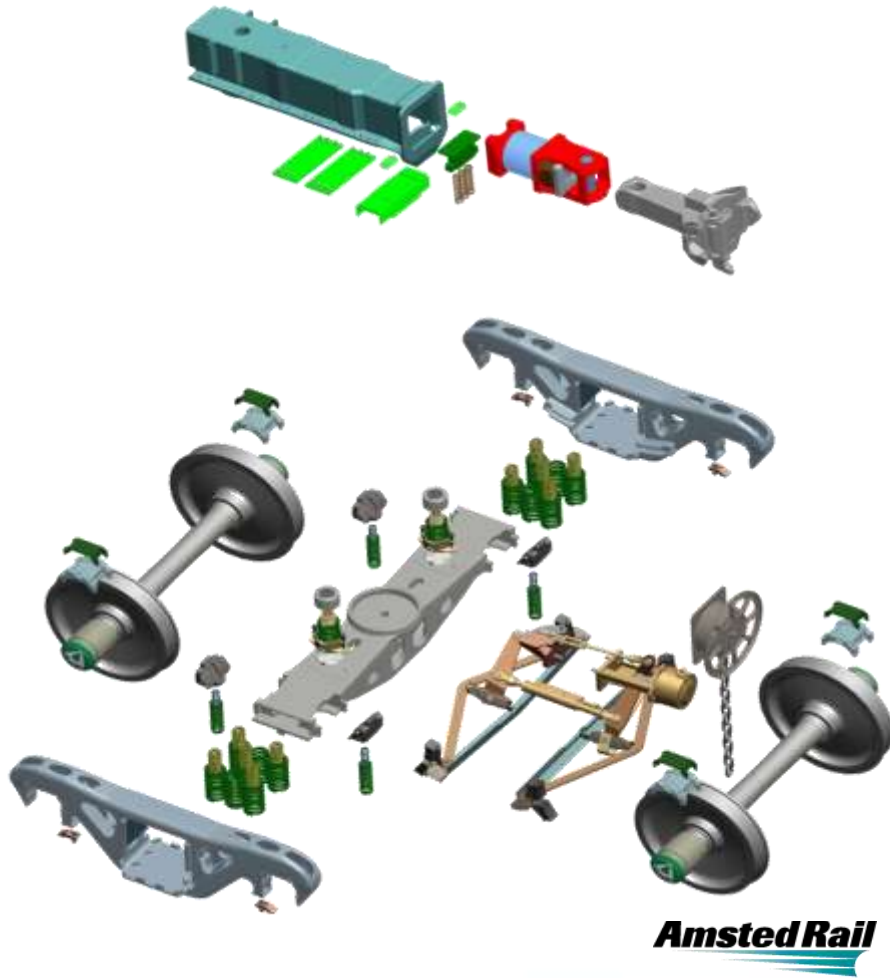
# Agenda

- 1. Remote Asset Monitoring Overview**
- 2. Condition Monitoring Framework**
- 3. Condition Monitoring R&D**
- 4. Status Monitoring R&D**
- 5. Conclusions**

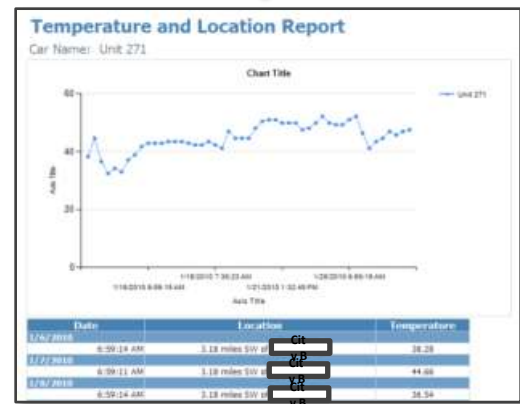


# Remote Asset Monitoring Platform

Monitor what we make



IONX Platform



# Condition Monitoring vs. Status Monitoring

## Program Overview



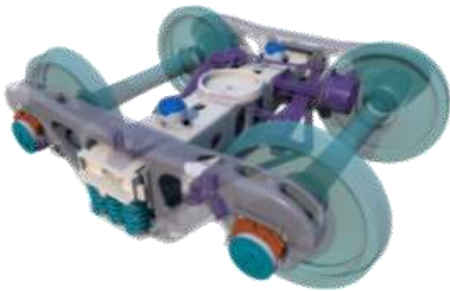
# Remote Asset Monitoring

## Condition Monitoring & Fault Diagnostics

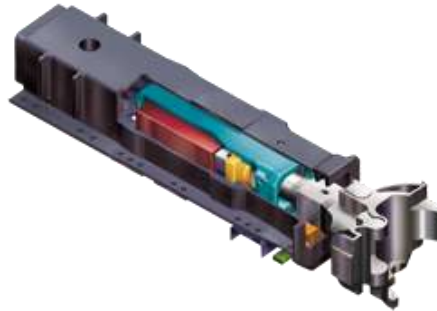
*Detect, Diagnose, and Trend*

1. Fault Detection
2. Fault Classification & Diagnostics
3. Trending & Prognostics

Truck Condition



Draft Gear Condition



Bearing Condition

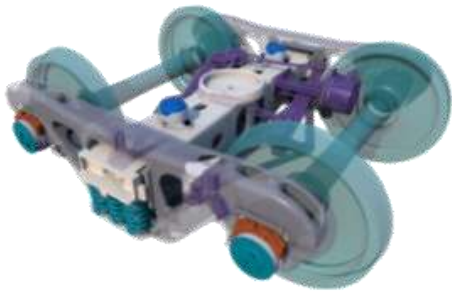


# Remote Asset Monitoring

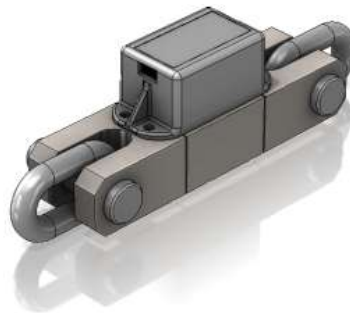
## Status Monitoring

1. Vehicle On-Board Weighing
2. Handbrake Chain Force
3. Hatch/Gate Status
4. Airbrake Pressure

**On-Board Weighing**



**Handbrake Status**



**Airbrake Pressure**



[Measurement Specialties, Inc.]



# Condition Monitoring Framework

## CM Structure and Phases



# Condition Monitoring Framework

## Phase 1 – Component Reliability Study

1. Failure Modes
2. MTBF & MTTF
3. Wear-in vs. Wear-out failures



## Phase 2 – Maintenance Strategy Survey

1. Component size & cost
2. Redundancy
3. Replacement cost/access
4. Safety critical?
5. **Is a CM-based program needed?**

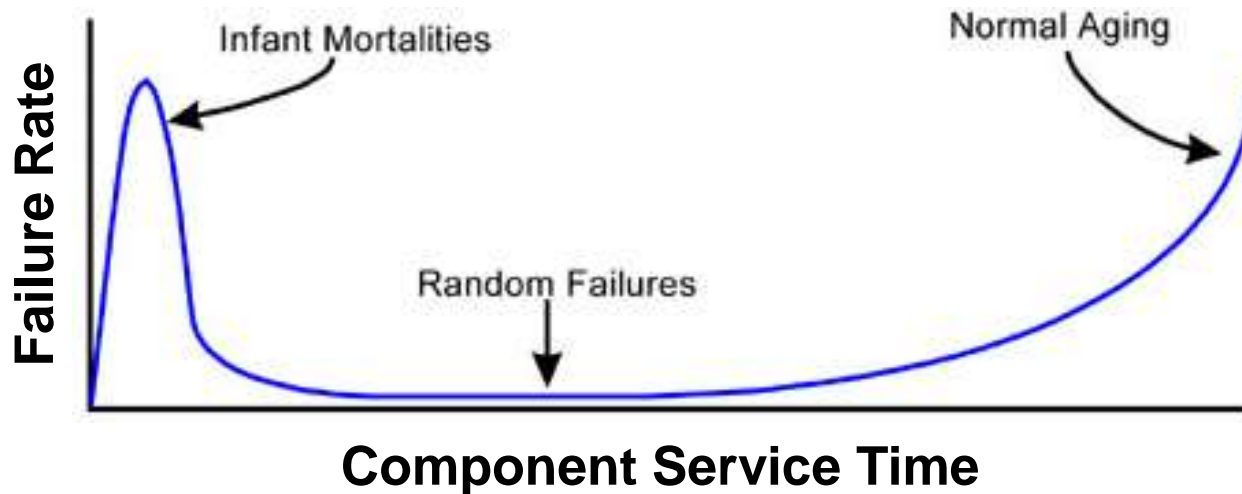




# Condition Monitoring Framework

## Why Condition Monitoring?

1. Maintenance when **required**
2. Unnecessary maintenance avoided
3. Extends useful life



# Condition Monitoring Framework

## Phase 3 – Creating a Condition-Based Strategy

### Fault Detection Strategy

- **Measurand** – acceleration, displacement, temperature...
- **Experimentation** – lab & field testing
- **Transducer Selection**
- **Acceptance Limits**

### Diagnostics

- **Classification of faults**
- **Modeling & Experimentation**
- **Time & frequency domain analysis**

**Prognostics** – can the remaining life be predicted?



# Impact Detection & Draft Gear Health

Condition Monitoring Research



# Impact Detection & Draft Gear Health

## Goals

1. Detect over-speed/over-force impacts
2. Diagnose the health of the draft gear



## Approach

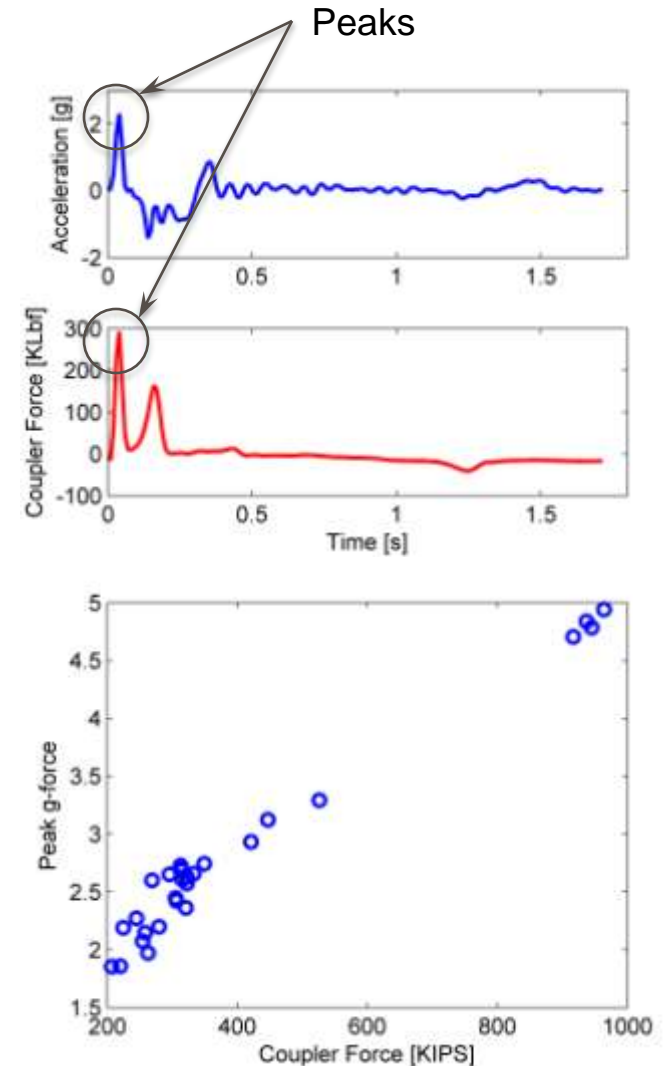
- **Measurand** – acceleration (g's)
- **Transducer** – MEM's inertial sensor
- **Acceptance Limits** – coupler force
- **Experimentation** – coupling events at test facility



# Impact Detection & Draft Gear Health

## Peak Coupler Force vs. Peak Car-body Acceleration

1. Data **pre-processed** to capture rigid body dynamics
2. Least-squares fit of force vs. acceleration
3. Prediction uncertainty on the order of  $\pm 200$  KIPS

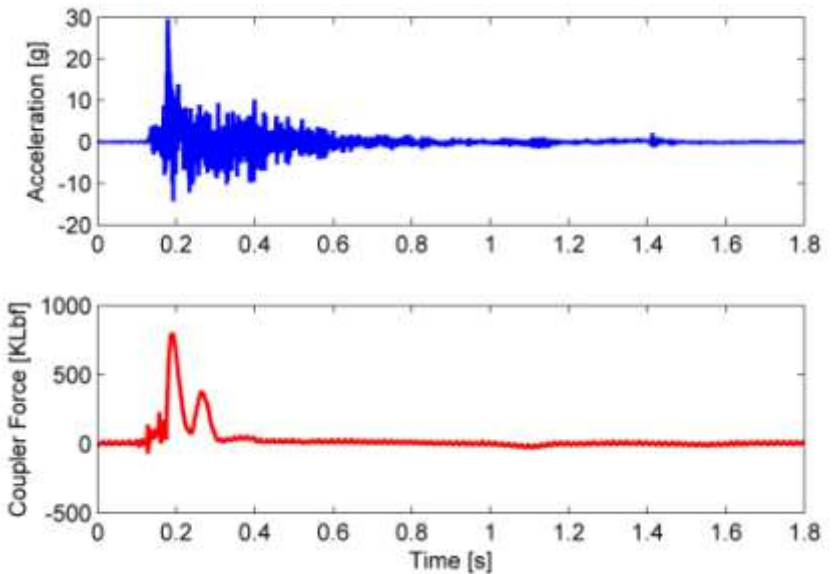
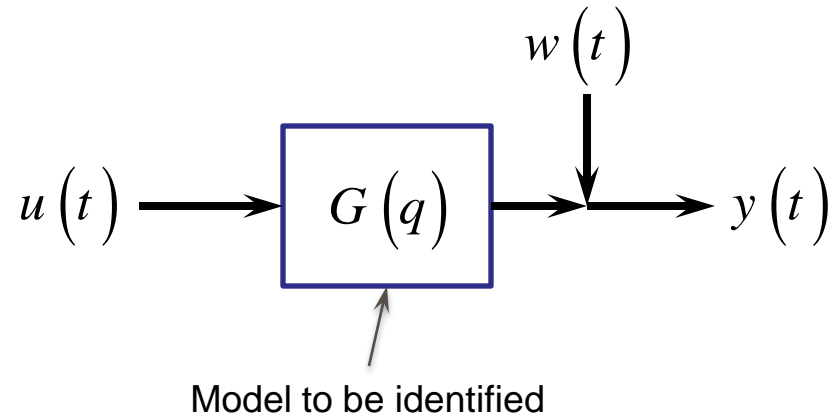


# Impact Detection & Draft Gear Health

## Black Box System Identification

1. Collect input/output data
2. Pre-process data
3. Choose/create model
  1. ARX Models
  2. State-space Models
  3. Neural Networks
4. Validate Model

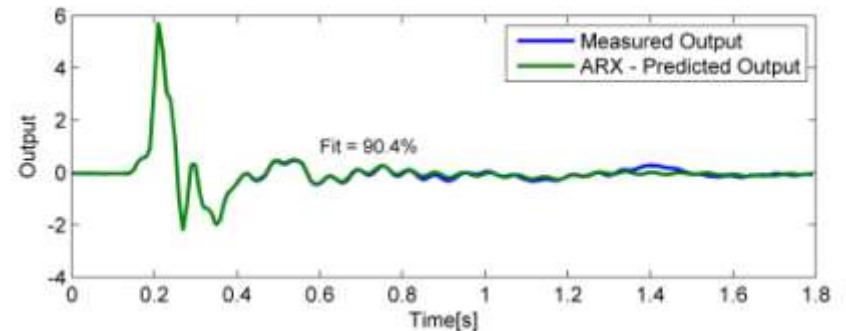
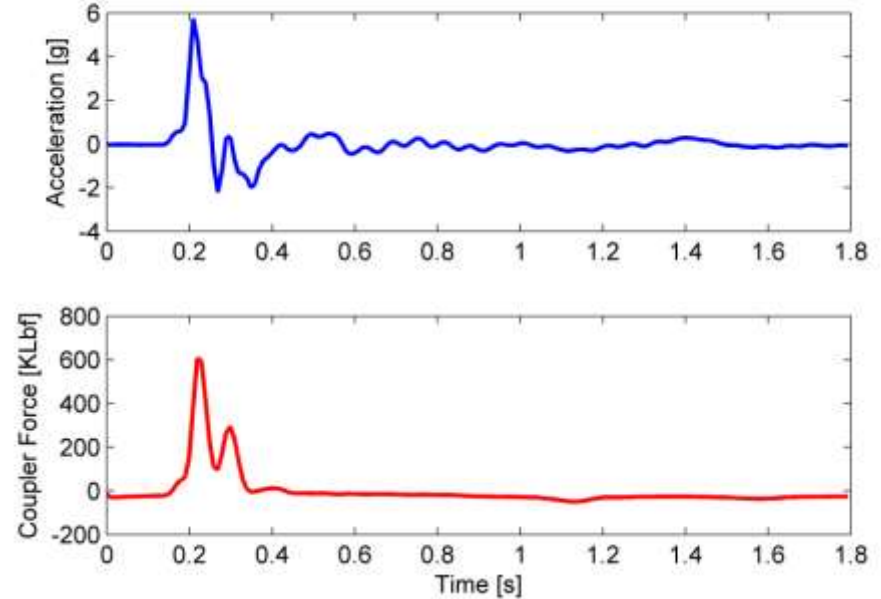
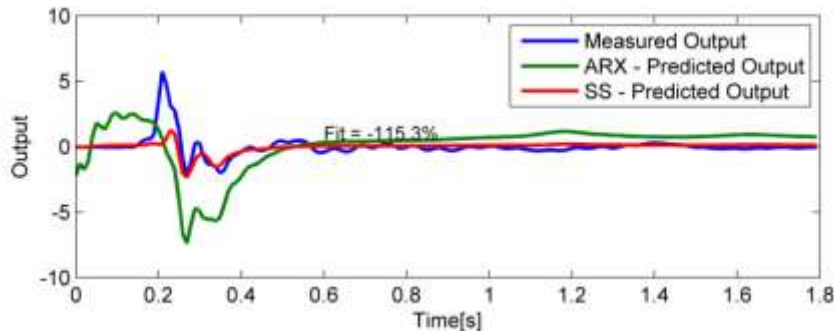
**Minimal insight into physics required**



# Impact Detection & Draft Gear Health

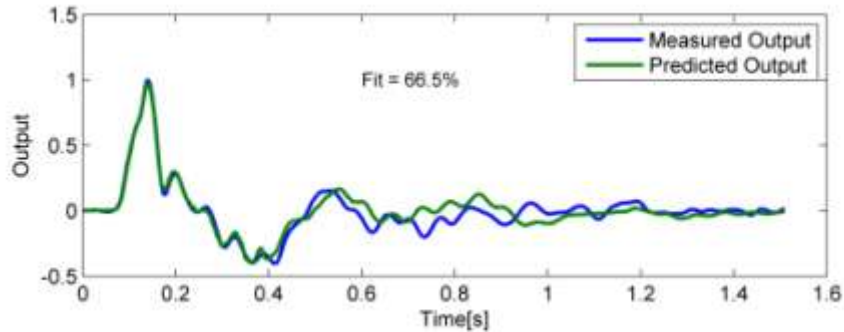
## Parametric Model Creation

1. Test model structures
2. Start with low order
3. Choose simplest model with best performance

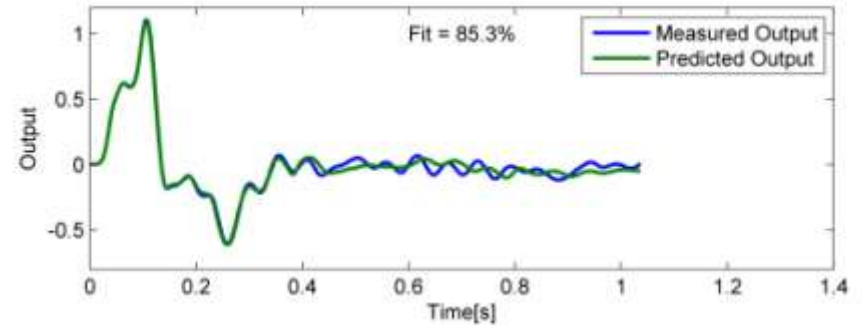


# Impact Detection & Draft Gear Health

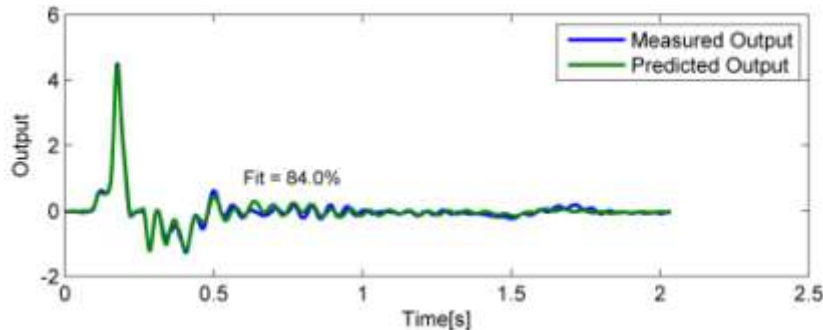
## Model Validation with Fresh Data



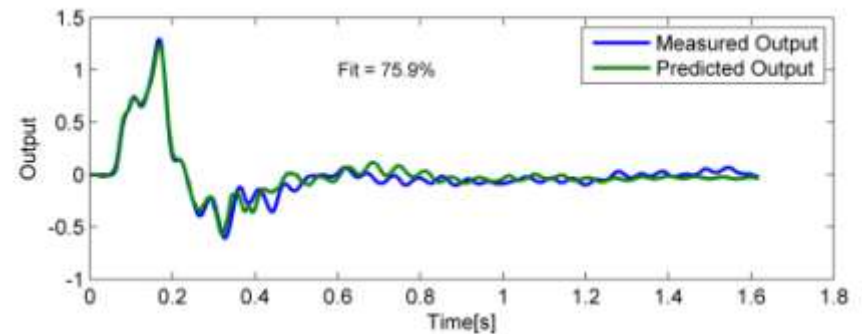
**1 mph Coupling**



**2 mph Coupling**



**8 mph Coupling**



**4 mph Coupling**

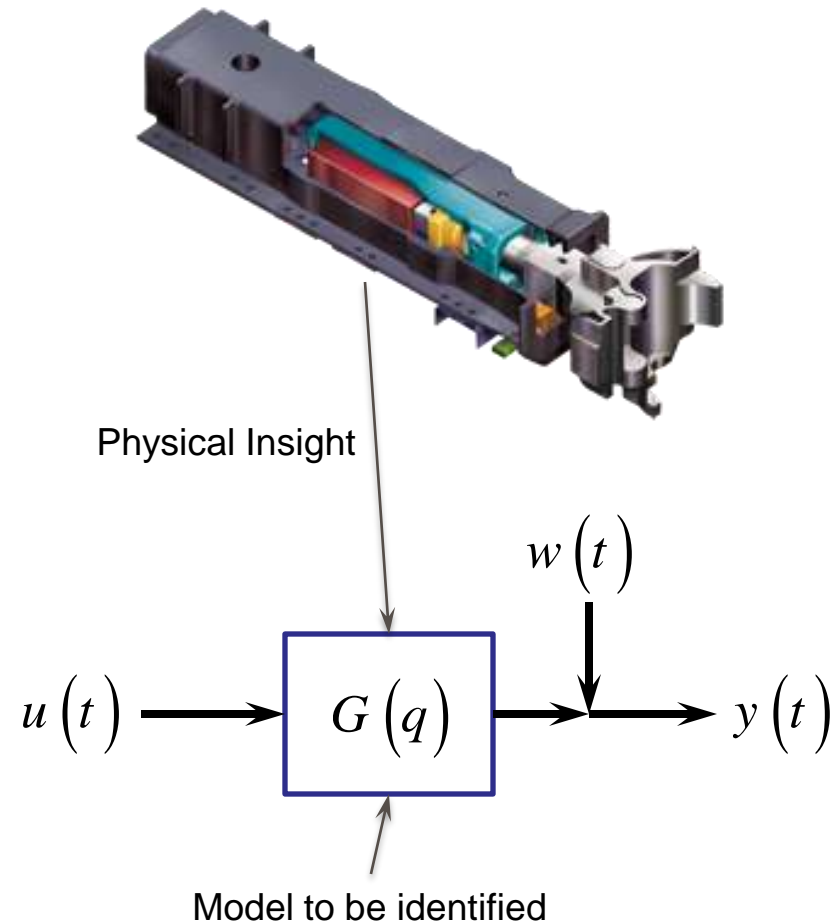




# Impact Detection & Draft Gear Health

## Future Work and Potential

1. Apply physical meaning to model parameters
2. Connect identified model and mathematical models
3. Monitor degrading conditions
4. Real-time intra-train force prediction



# Hunting Detection & Vehicle Dynamics

Condition Monitoring Research



# Hunting Detection & Vehicle Dynamics

## Goals

1. Detect hunting and vehicle instabilities
2. Diagnose the health of the truck system



## Approach

- **Measurand** – acceleration (g's) or angular rotation rate
- **Transducer** – MEMS inertial sensor
- **Acceptance Limits** – dependent upon application
- **Experimentation** – track testing



[ST Microelectronics]

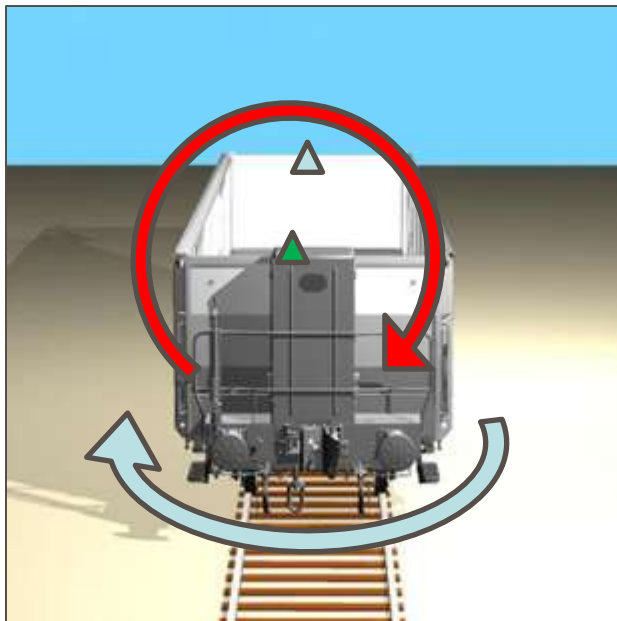


# Hunting Detection & Vehicle Dynamics

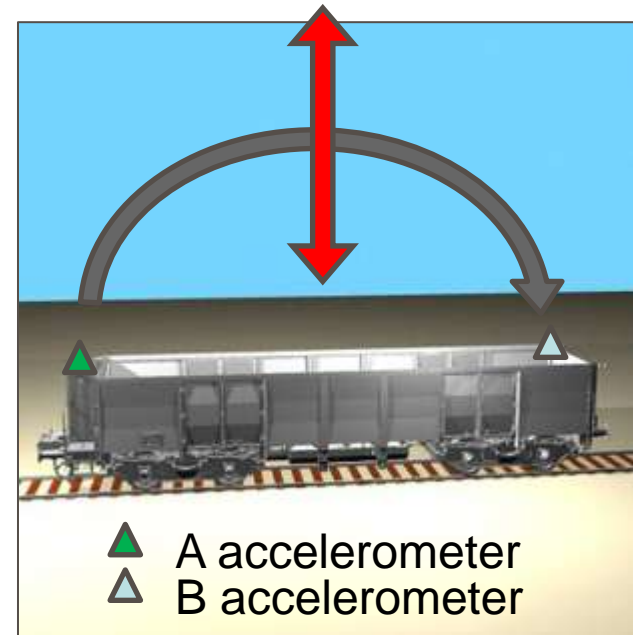
## Rigid Body Modes

1. Quantifiable with inertial sensors
2. A and B-end sensors capture all modes
3. Other locations possible with 6 DOF sensor

**Roll & Yaw**



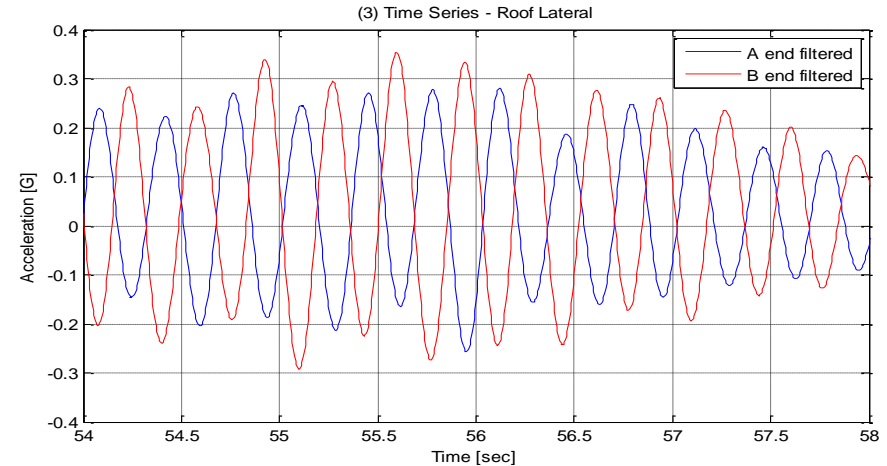
**Pitch & Bounce**



# Hunting Detection & Vehicle Dynamics

## Time Domain Approach

1. Phase used to determine type of motion
2. Magnitude used for severity of body motion
3. A and B-end mounted inertial sensors



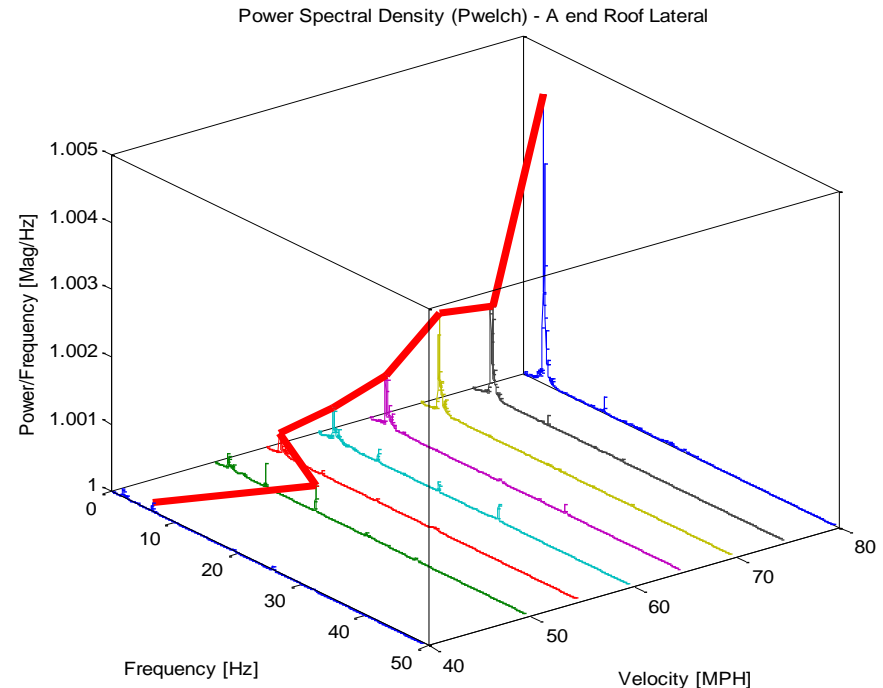
# Hunting Detection & Vehicle Dynamics

## Frequency Domain Approach

1. Cascade plot illustrates development of instability
2. Similar approach to rotating equipment diagnostics

## Future Work

1. **Diagnostics** – connect measured modes with component health
2. Connect modes with **hollow worn wheels, truck warp & mis-alignment**



# Bearing Fault Detection & Diagnostics

Condition Monitoring Research



# Bearing Fault Detection & Diagnostics

## Goals

1. Impending failure detection
2. Classification of detected faults – e.g. cup, cone, roller defect...
3. Prognostics – remaining life



## Approach

- **Measurand** – temperature and/or acceleration (g's)
- **Transducer** – wireless temperature/vibration sensor
- **Acceptance Limits** – multiple methods used
- **Experimentation** – bearing test rig and field trials





# Bearing Fault Detection & Diagnostics

## Temperature Based Fault Detection

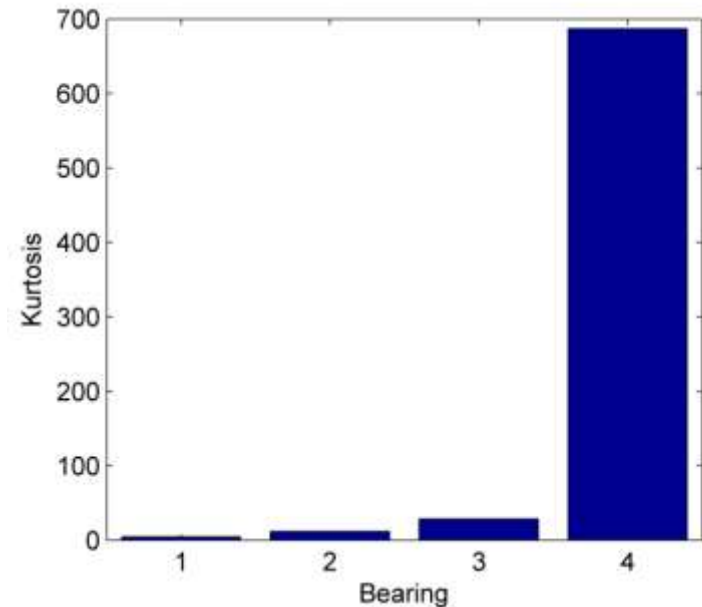
1. Algorithms compare multiple bearing temperatures, temperature above ambient...



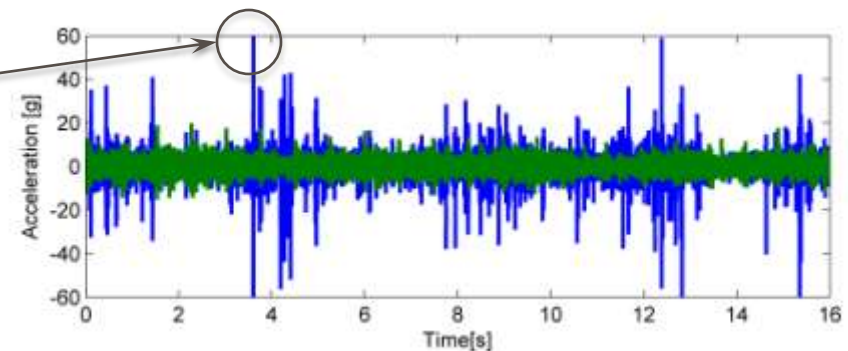
# Bearing Fault Detection & Diagnostics

## Vibration Based Fault Detection

1. **Time Domain** – statistical moment (R.M.S, mean, kurtosis...)
2. **Frequency Domain** – detection of defect frequencies, harmonic resonance...



**Impulsive Signal**



# Vehicle On-Board Weighing System

Status Monitoring



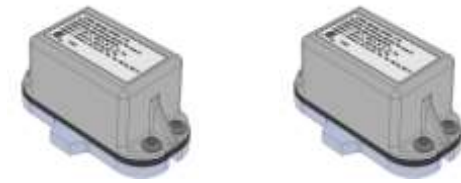
# Vehicle On-Board Weighing System

## Goals

1. Build a 1% accurate vehicle on-board weighing system

## Approach

- **Measurand** – displacement or strain
- **Transducer** – custom instrumented truck component
- **Calibration** - in the field or laboratory



Raw Readings



Sealed Parameters in CMU



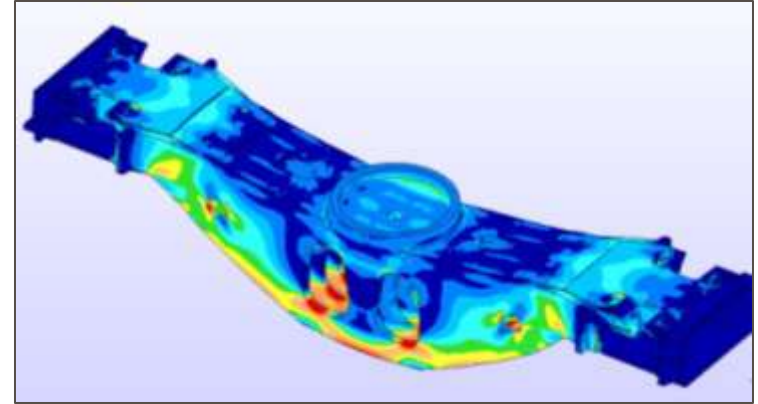
GPRS, Bluetooth, WiFi...



# Vehicle On-Board Weighing System

## Key Challenges

1. Strains very low on truck system components (less than 10% of typical load cells)
2. Calibration and instrumentation
3. Temperature compensation



## Design & Development

- Transducers with 5X strain amplification developed
- Over 300 Generation I systems deployed (3% accuracy)



# Vehicle On-Board Weighing System

## Lab & Field Testing

1. Complete truck testing and calibration in load frame
2. Field trials deployed with continuous data acquisition

## Industry Standards

- Calibration according to ASTM E74
- Performance metrics according to ISA/NIST/NCWM standards

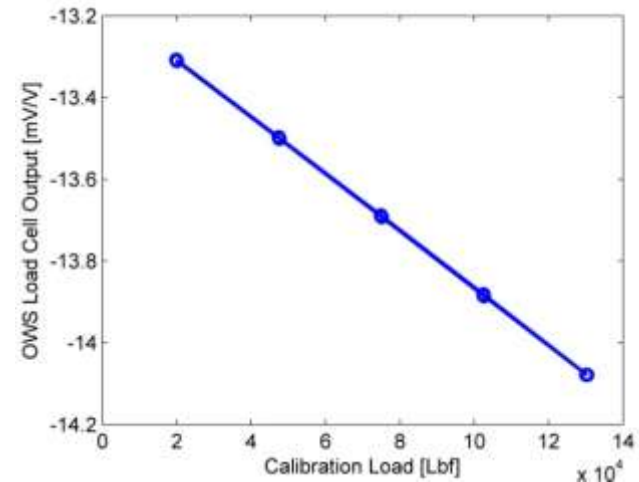




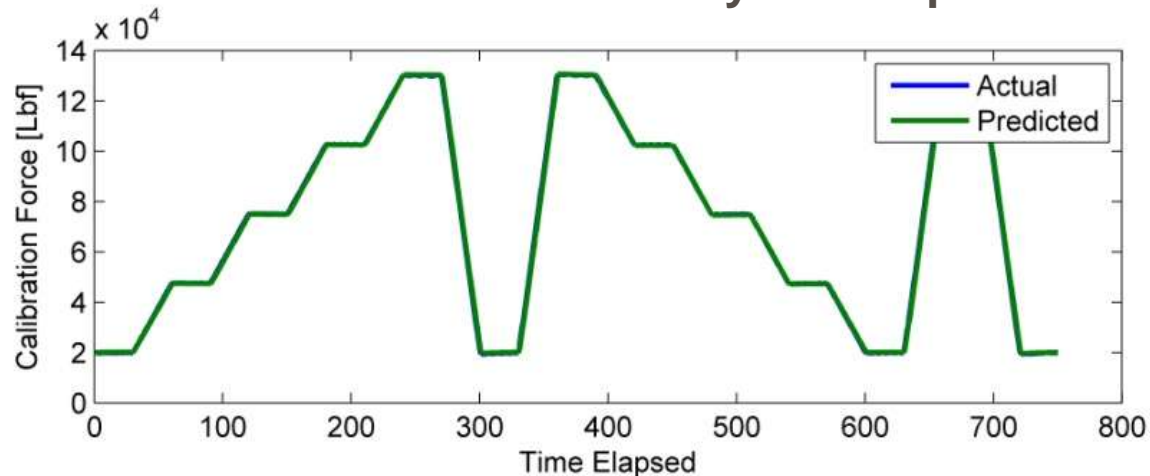
# Vehicle On-Board Weighing System

## Lab Performance

1.  $\pm 500$  Lbf uncertainty possible
2. Hysteresis, linearity, and repeatability better than 0.5% full-scale



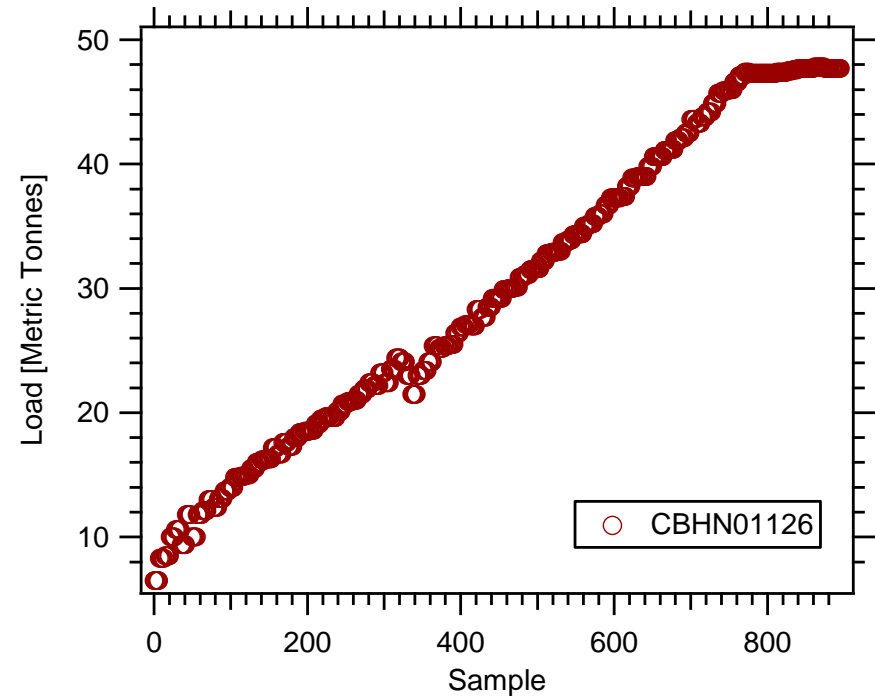
### Calibration verification cycle sample



# Vehicle On-Board Weighing System

## Field Performance

1. 287 Systems Deployed on Grain Cars (Summer 2012)
2. 3% Accuracy typical

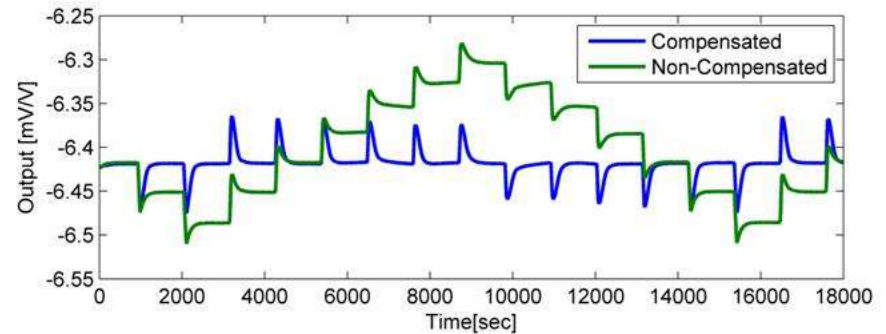




# Vehicle On-Board Weighing System

## Future Work

1. Statistical certainty
2. Temperature Compensation
3. Class IIIL accuracy classification
4. NTEP Compliance – NIST Handbook 44
5. Dynamic truck behavior monitoring



# Handbrake Monitoring System

## Status Monitoring



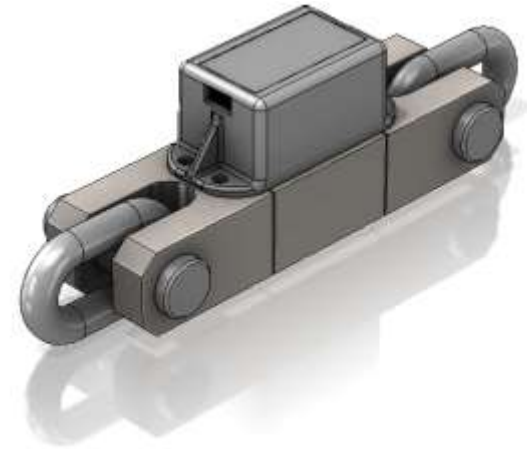
# Handbrake Monitoring System

## Goals

1. Build a wireless force-based handbrake monitoring solution

## Approach

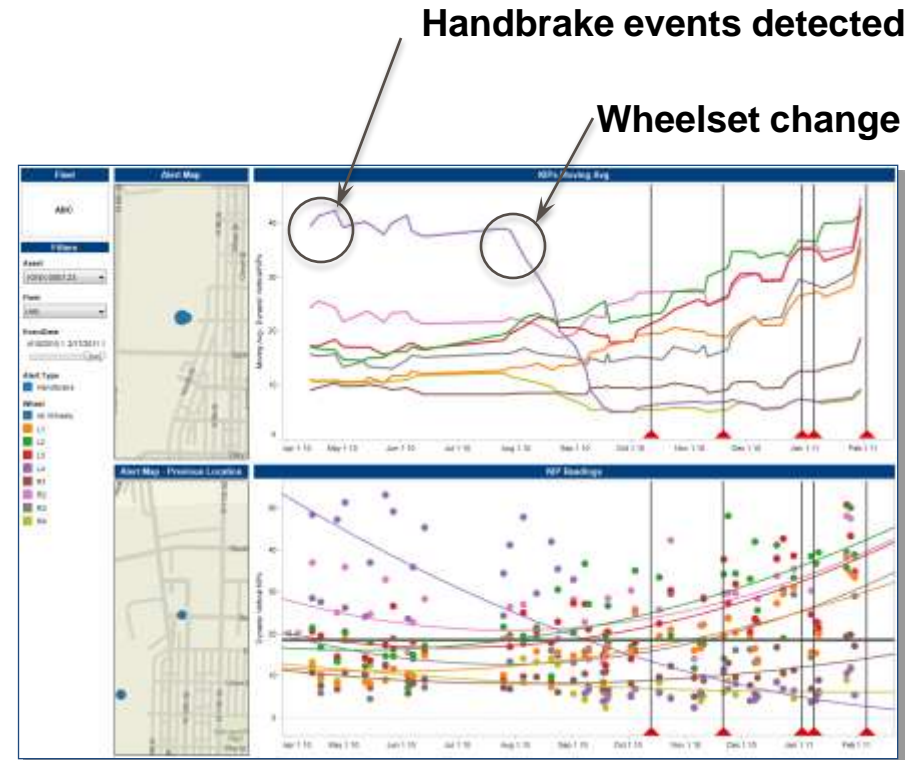
- **Measurand** – handbrake chain tension
- **Transducer** – custom handbrake chain link with wireless electronics
- **Status** – on/off based on force levels



# Handbrake Monitoring System

## Handbrake Events vs. Wheel Impacts

1. Handbrake event – handbrake engaged with car moving
2. Leads to flat spots in wheels
3. Eventually detected at WILD site



## Future Work

1. Correlation between chain force and probability of sliding wheels



# Conclusions

## The Future of Embedded Systems

1. Increased **memory & processing power**
2. Decreased **power consumption**
3. Reduced **Cost**



[Energy Micro]

## The Future of Condition Monitoring

1. Wireless sensing systems **easier & cheaper** to deploy
2. Large amount of data needs to be processed, analyzed...



# Thank You!

Questions?

