

On-Board Equipment Condition Monitoring

Dan Maraini

Manager of Bogie Systems Engineering

Amsted Rail Company, Inc.



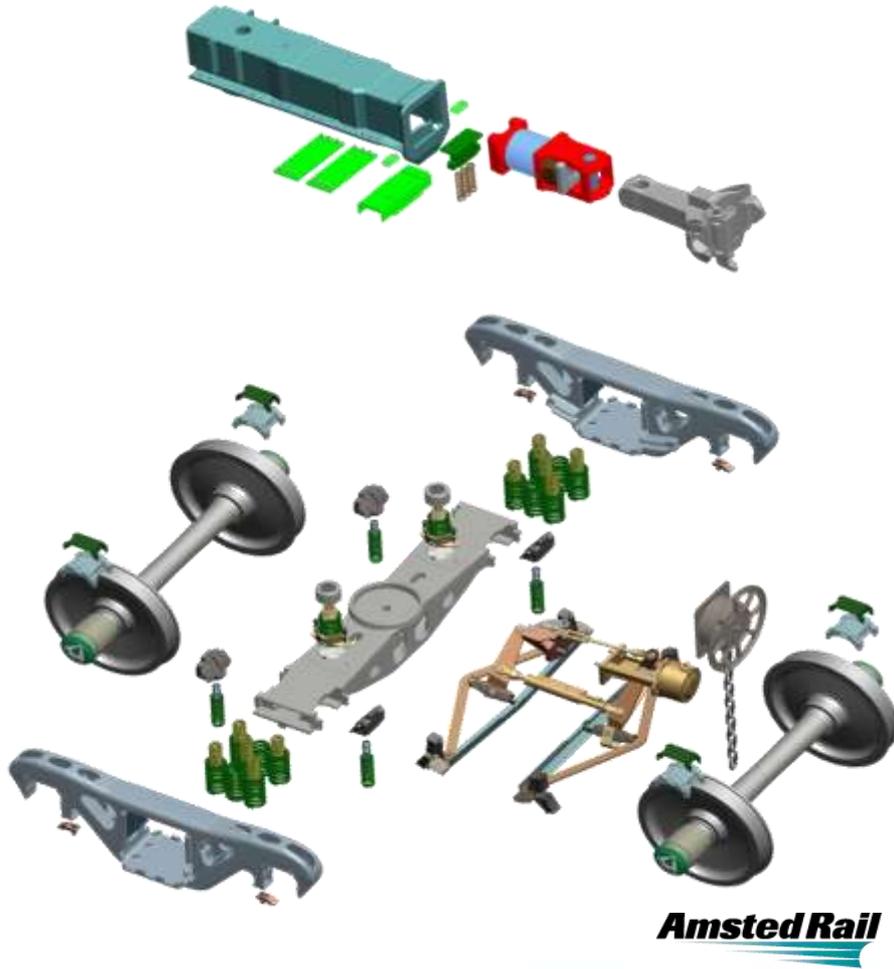
Agenda

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

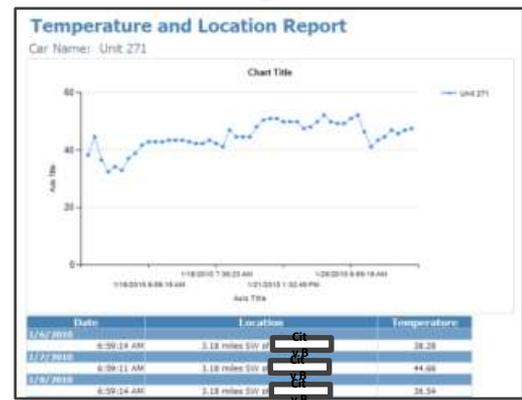


Remote Asset Monitoring Platform

Monitor what we make



IONX Platform



Condition Monitoring vs. Status Monitoring

Program Overview



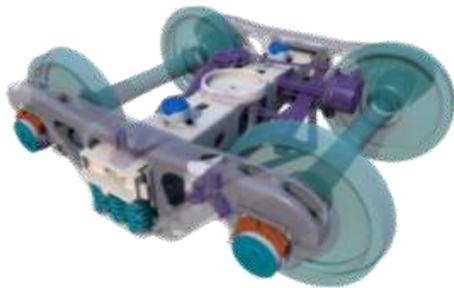
Remote Asset Monitoring

Condition Monitoring & Fault Diagnostics

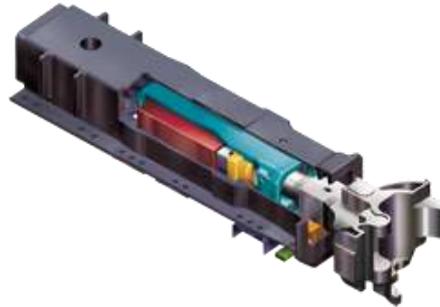
Detect, Diagnose, and Trend

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

Truck Condition



Draft Gear Condition



Bearing Condition

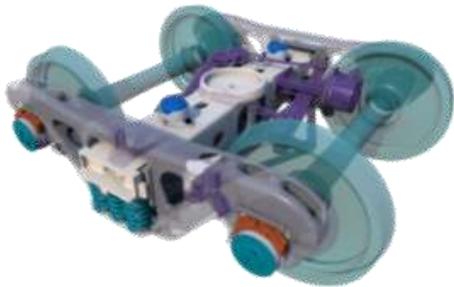


Remote Asset Monitoring

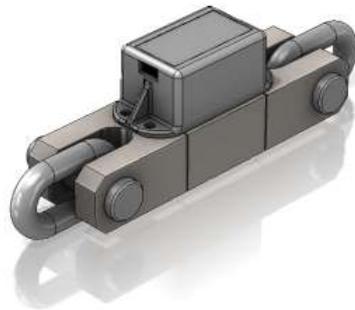
Status Monitoring

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

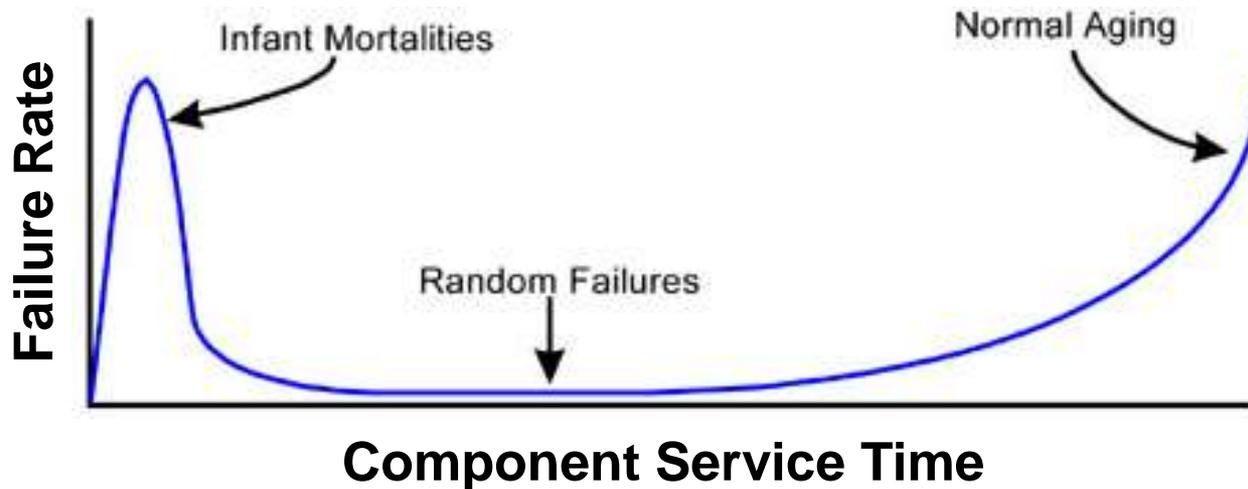
1. Component size & cost
2. Redundancy
3. Replacement cost/access
4. Safety critical?
5. **Is a CM-based program needed?**



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

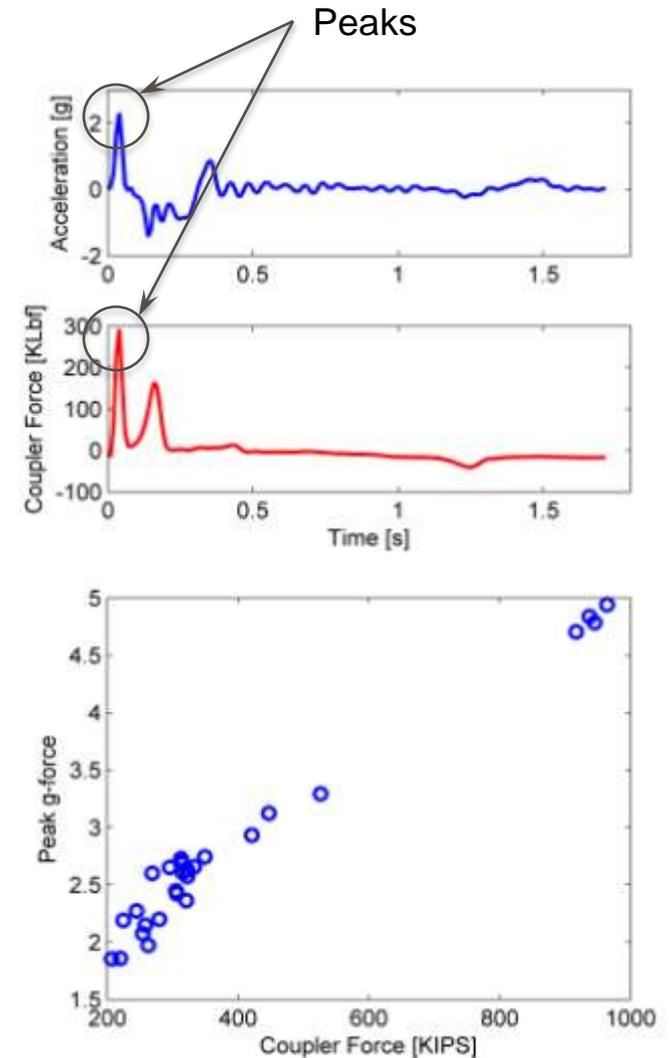
- **Measurand** – acceleration (g's)
- **Transducer** – MEM's inertial sensor
- **Acceptance Limits** – coupler force
- **Experimentation** – coupling events at test facility



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 ± 200 KIPS

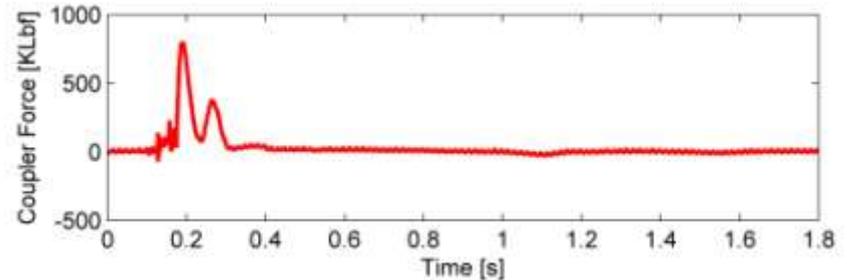
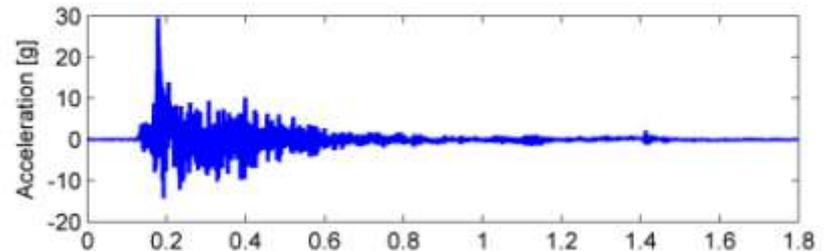
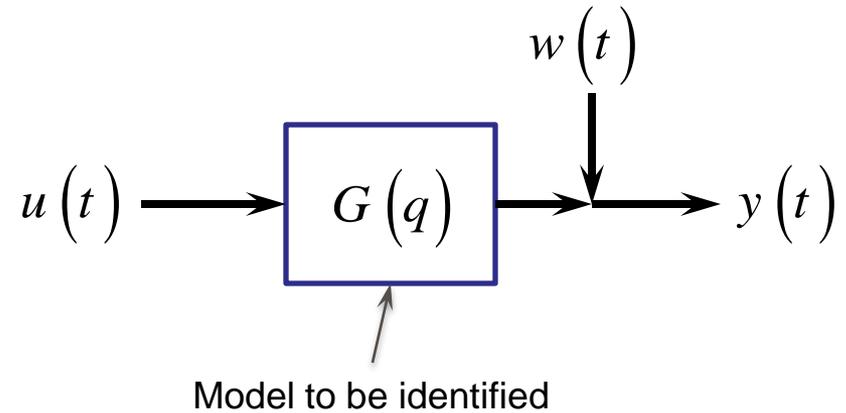


Impact Detection & Draft Gear Health

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

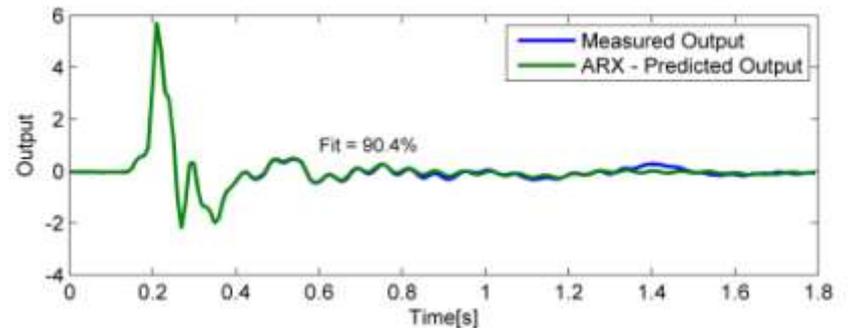
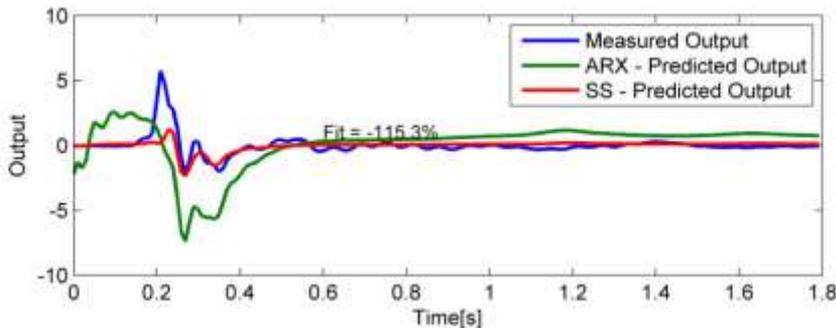
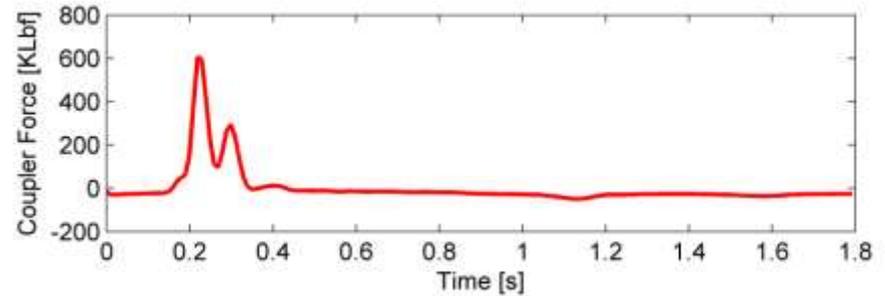
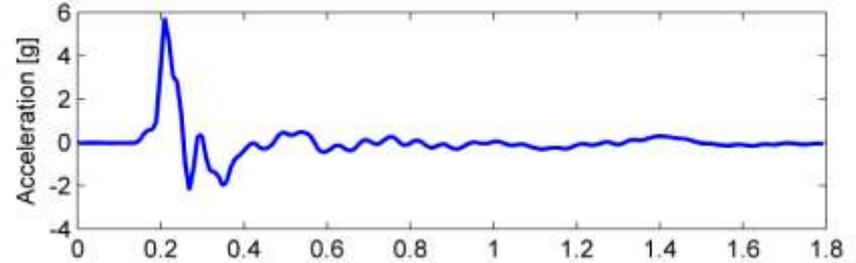
Minimal insight into physics required



Impact Detection & Draft Gear Health

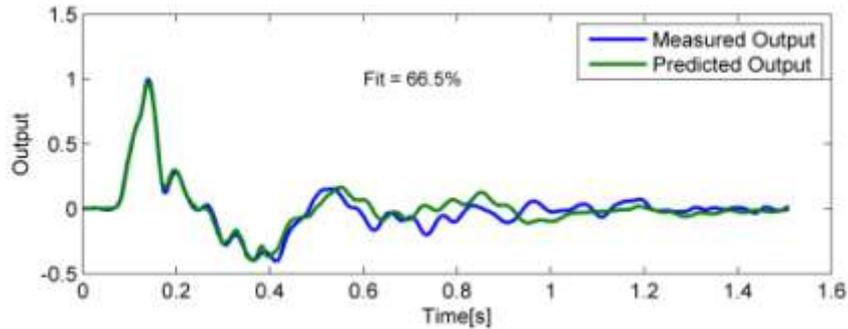
Parametric Model Creation

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

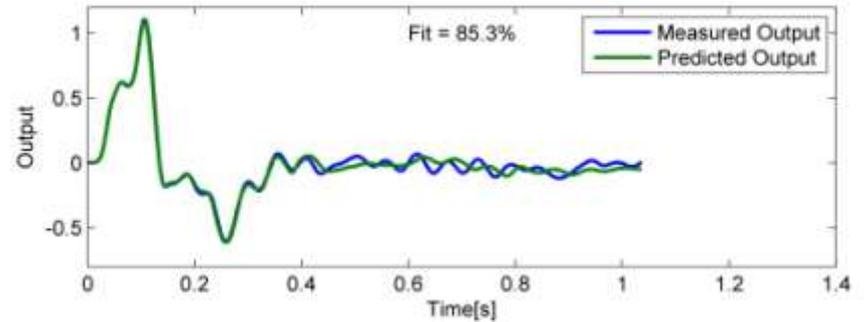


Impact Detection & Draft Gear Health

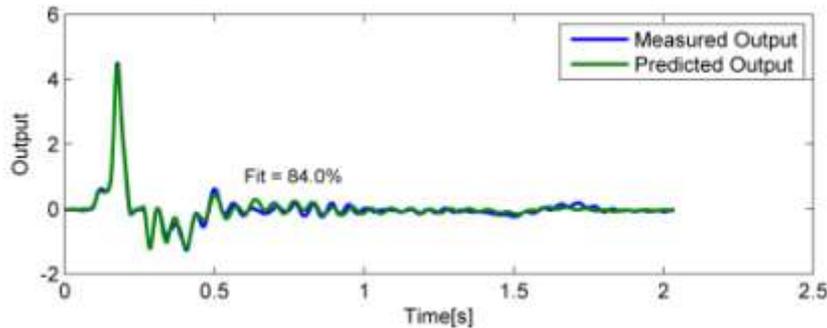
Model Validation with Fresh Data



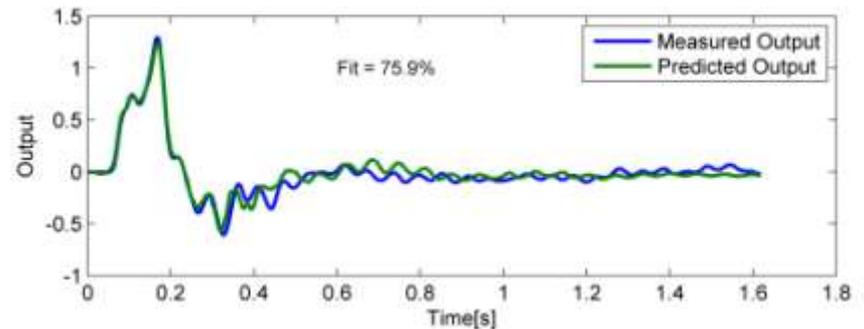
1 mph Coupling



2 mph Coupling



8 mph Coupling



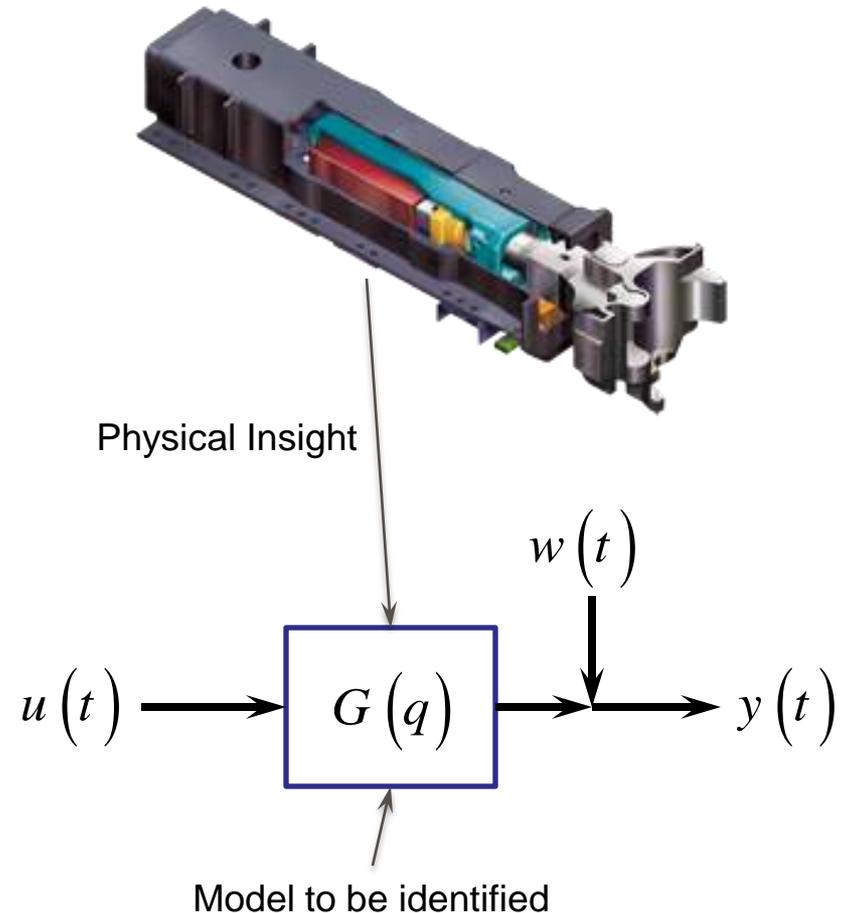
4 mph Coupling



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]

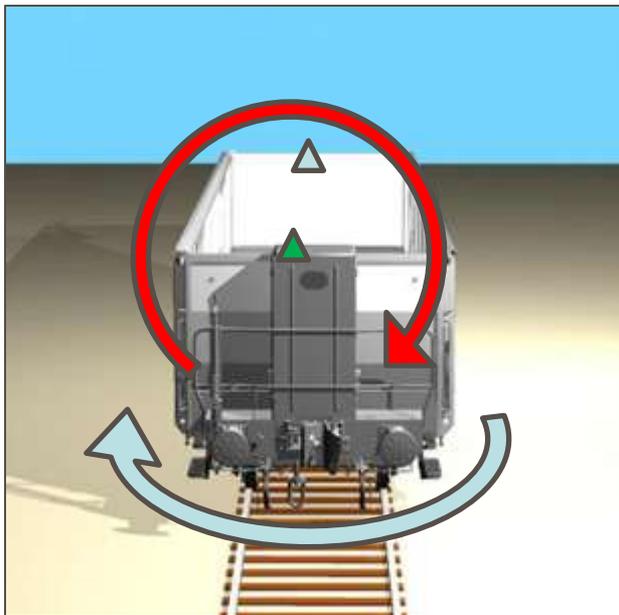


Hunting Detection & Vehicle Dynamics

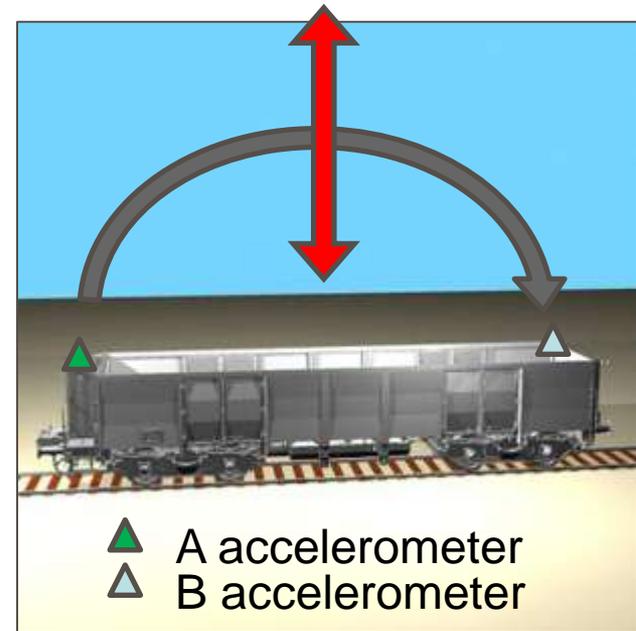
Rigid Body Modes

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

Roll & Yaw



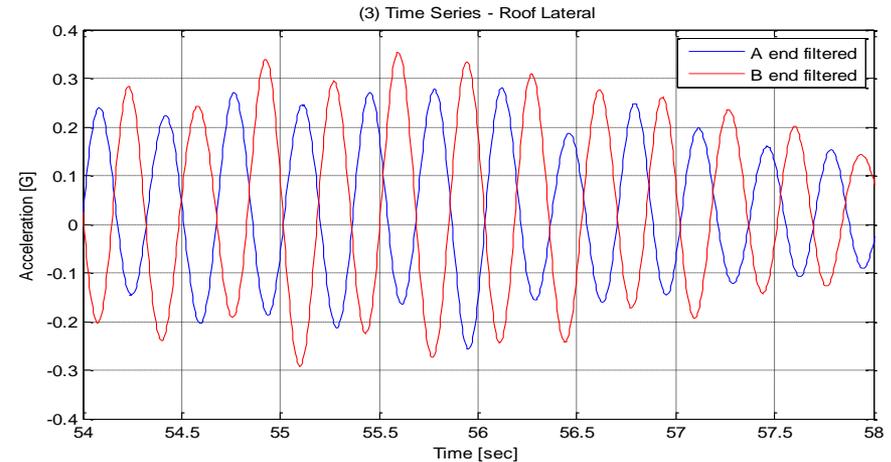
Pitch & Bounce



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



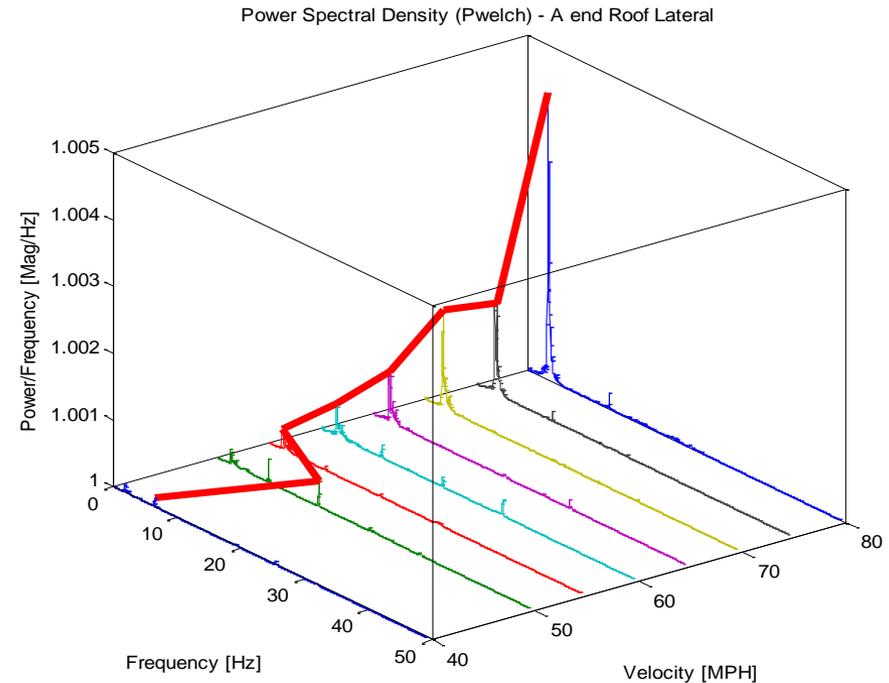
Hunting Detection & Vehicle Dynamics

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

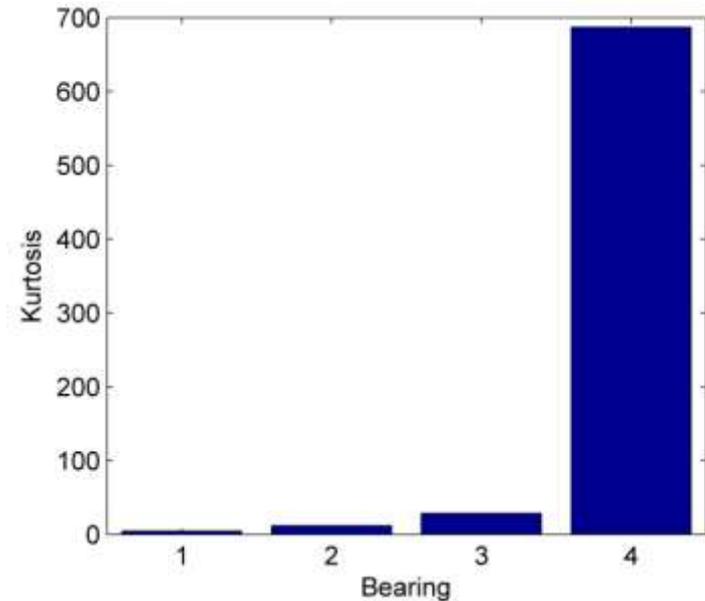
1. Algorithms compare multiple bearing temperatures, temperature above ambient...



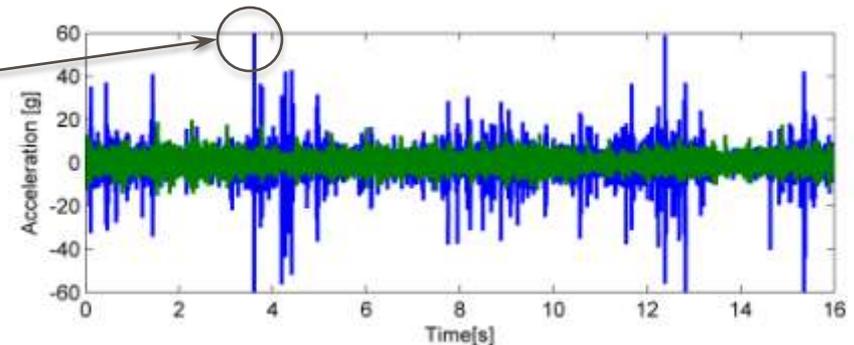
Bearing Fault Detection & Diagnostics

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



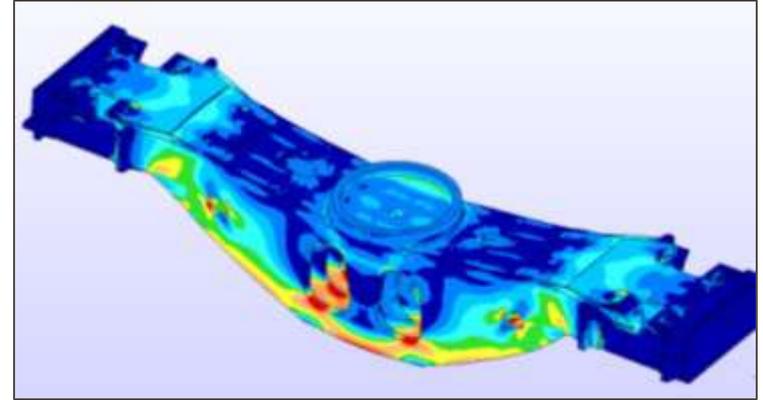
GPRS, Bluetooth, WiFi...



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

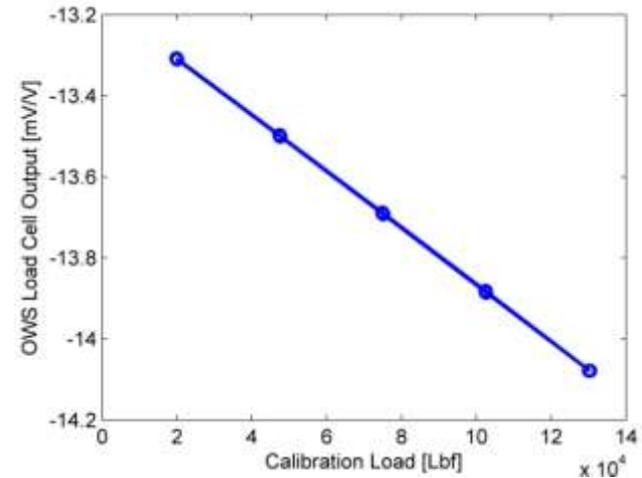
- Calibration according to ASTM E74
- Performance metrics according to ISA/NIST/NCWM standards



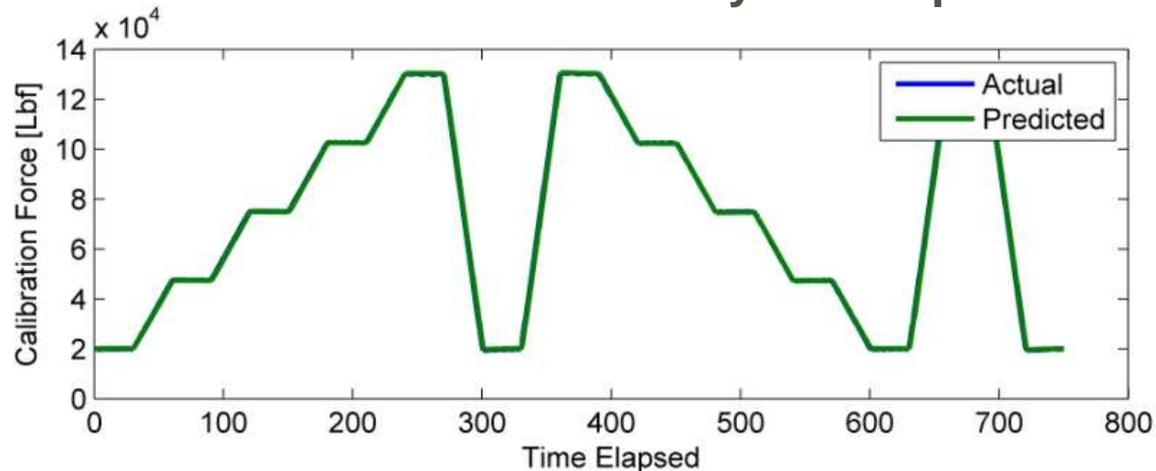
Vehicle On-Board Weighing System

Lab Performance

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



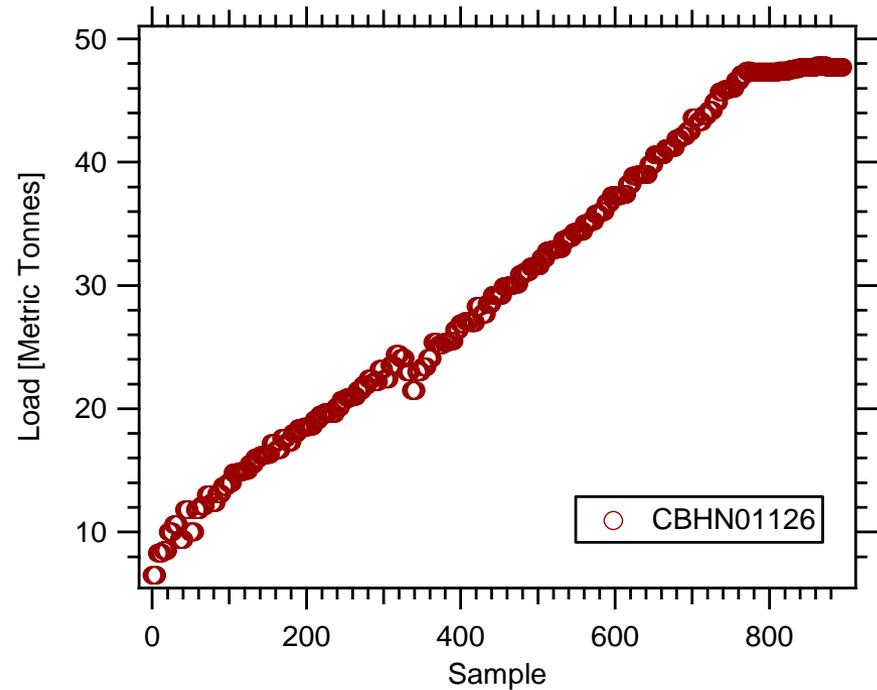
Calibration verification cycle sample



Vehicle On-Board Weighing System

Field Performance

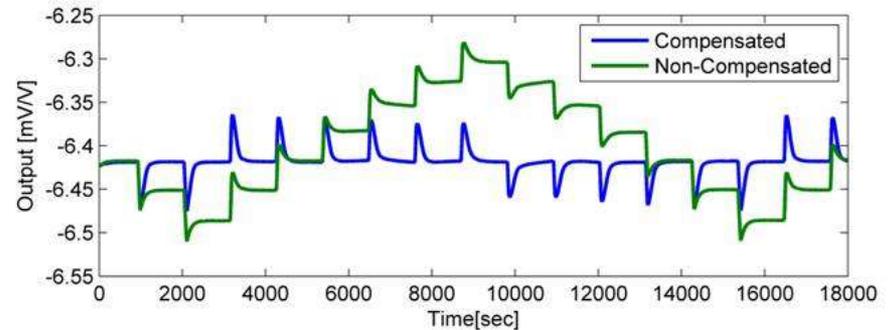
1. 287 Systems Deployed on Grain Cars (Summer 2012)
2. 3% Accuracy typical



Vehicle On-Board Weighing System

Future Work

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



Handbrake Monitoring System

Status Monitoring



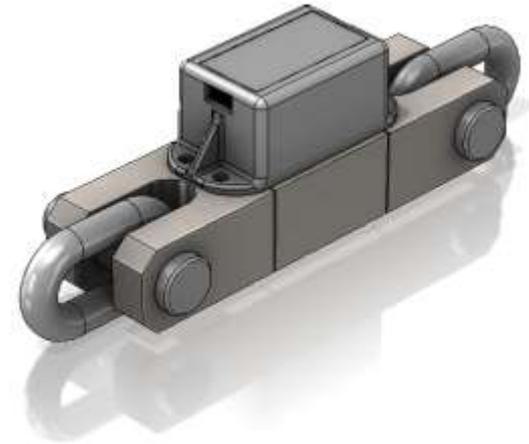
Handbrake Monitoring System

Goals

1. Build a wireless force-based handbrake monitoring solution

Approach

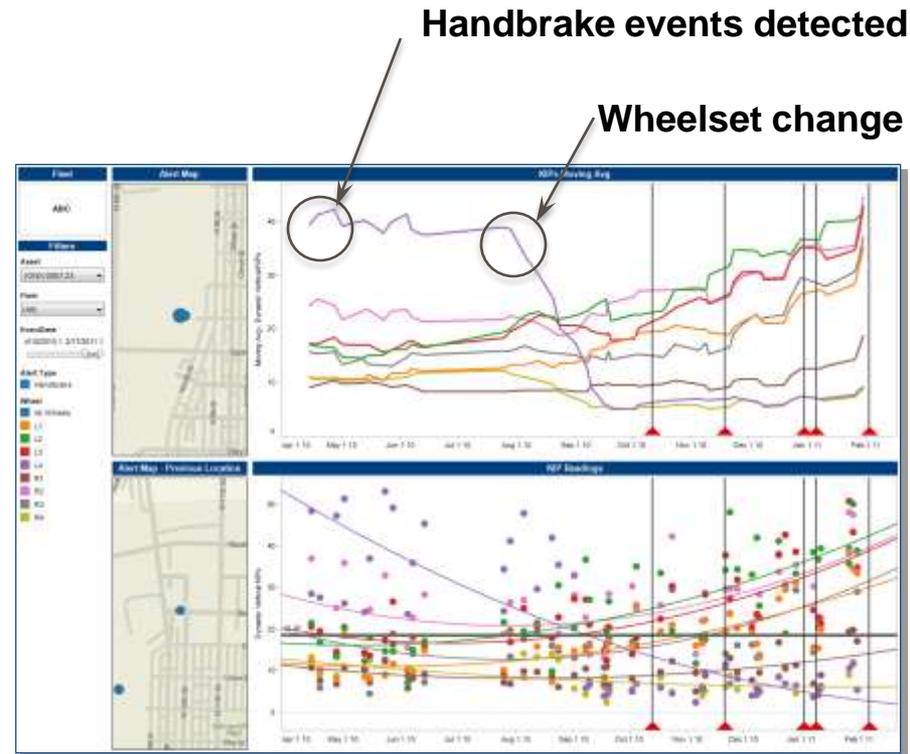
- **Measurand** – handbrake chain tension
- **Transducer** – custom handbrake chain link with wireless electronics
- **Status** – on/off based on force levels



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?

