



HEAVY HAUL - JUNE 11-12, 2025

W H E E L F L A N G E L U B E B E N E F I T S

Wayne Kennedy – Rail Consultant
Rob Stevens¹ – First Analytics

WRI2025HH





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SCIENCE BASED TARGETS

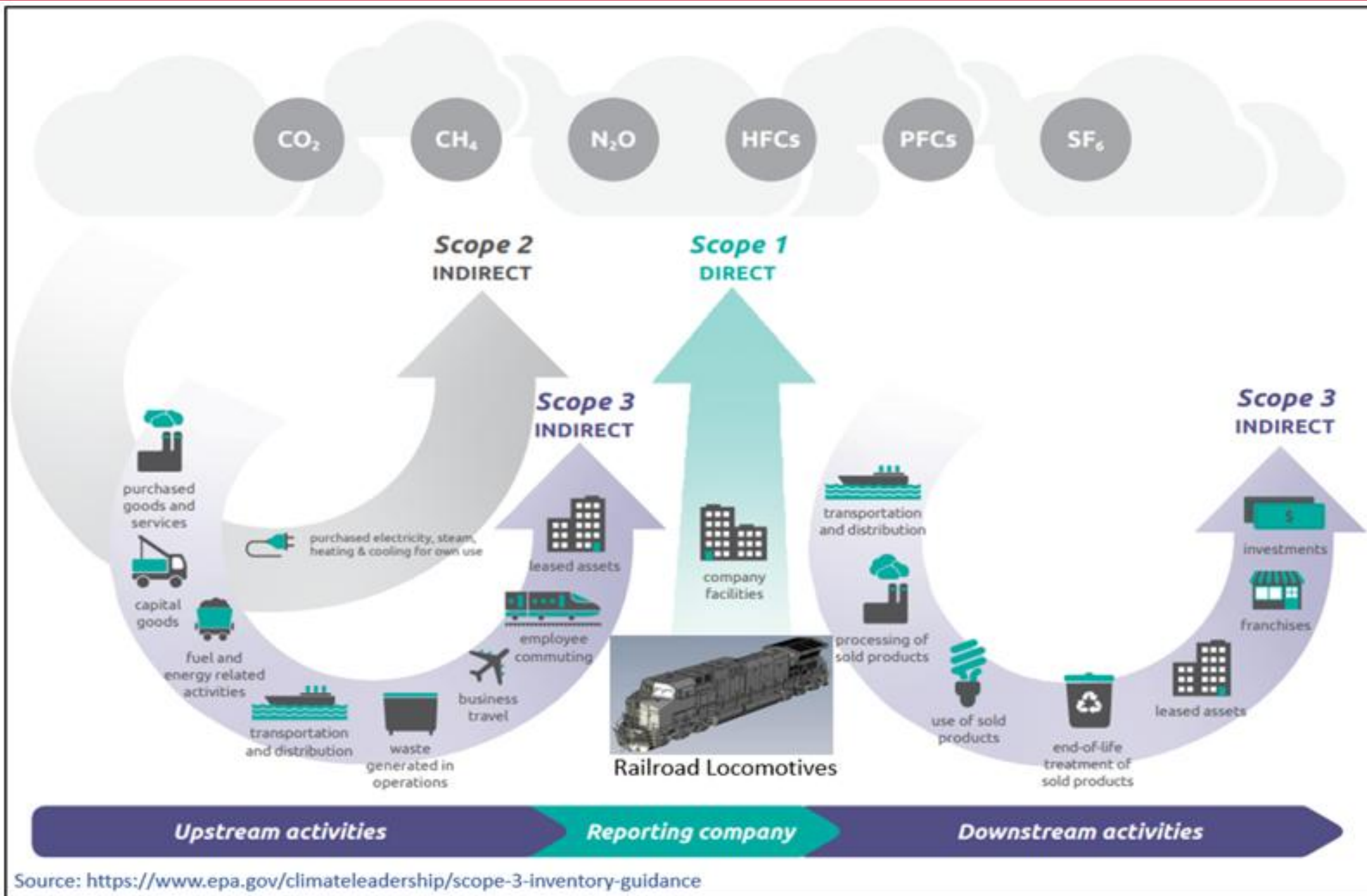


10572 Total no. of companies with targets or commitments	7810 Companies with validated targets
1764 Companies with net-zero targets	2997 Companies with active commitments

The Science Based Targets initiative (SBTi), the global body enabling businesses to set emissions reduction targets in line with climate science, is unveiling a new strategy to increase minimum ambition in corporate target setting from ‘well below 2°C’ to ‘1.5°C’ above pre-industrial levels.

Railroads set SBTi goals in the 2018 timeframe and have all set very aggressive goals to reduce GHG emissions by 2030 and some even have net-zero goals by 2050

EMISSIONS INVENTORY



SCOPE 1

Direct emissions from owned sources

SCOPE 2

Indirect emissions from purchased services

SCOPE 3

All other indirect emissions from value chain

Source: <https://www.epa.gov/climateleadership/scope-3-inventory-guidance>



CLASS I RAILROAD GOALS

Company Name	Full target language	Company Temperature	Scope	Target Value	Type	Base Year	Target	Date Published
BNSF Railway	BNSF Railway commits to reduce absolute scope 1 and 2 and well-to-wheel locomotive GHG emissions 30% by 2030 from a 2018 base year*. *The target boundary includes biogenic emissions and removals from bioenergy feedstocks.	Well-below 2°C	1+2	30%	Absolute	2018	2030	2023-05-25
Canadian National Railway Co	CN commits to reduce scope 1 and 2 GHG emissions 43% per gross ton miles by 2030 from a 2019 base year*. CN commits to reduce scope 3 GHG emissions from fuel and energy related activities 40% per gross ton miles by 2030 from a 2019 base year. *The target boundary includes biogenic emissions and removals from bioenergy feedstocks.	Well-below 2°C	1+2	43%	Intensity	2019	2030	2021-07-21
CSX Corporation	CSX commits to reduce scope 1 and 2 GHG emissions intensity 37% per million gross ton miles by 2029 from a 2014 base year.	Well-below 2°C	1+2	37%	Intensity	2014	2029	2020-01-01
Norfolk Southern Corporation	Norfolk Southern commits to reduce scope 1 and 2 GHG emissions 42% per million gross ton-miles (MGTM) by 2034 from a 2019 base year*. *The target boundary includes biogenic emissions and removals from bioenergy feedstocks.	Well-below 2°C	1+2	42%	Intensity	2019	2034	2021-07-29
Union Pacific Corporation	Union Pacific commits to reduce absolute scope 1 and 2 GHG emissions 50.4% by 2030 from a 2018 base year.* Union Pacific also commits to reduce scope 3 GHG emissions from purchased goods and services, capital goods, and fuel and energy-related activities 50.4% within the same timeframe. *The target boundary includes land-related emissions and removals from bioenergy feedstocks.	1.5°C	1+2	50%	Absolute	2018	2030	2024-03-28
CPKC	CPKC commits to reduce scope 1, 2, and 3 well-to-wheel locomotive GHG emissions 36.9% per gross ton-miles by 2030 from a 2020 base year.	Well-below 2°C	1+2+3	37%	Intensity	2020	2030	2023-11-23

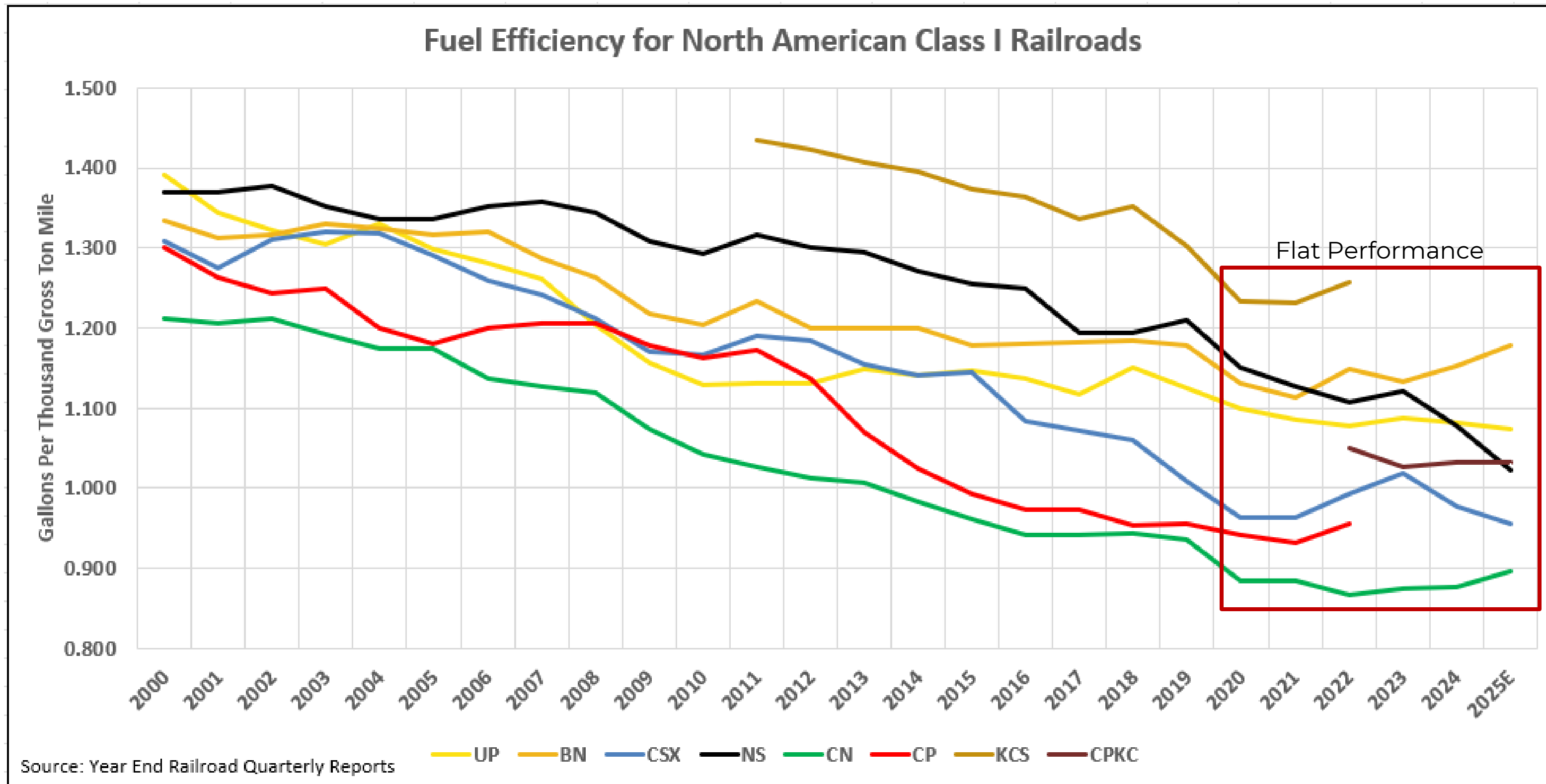
Various Goals, Types and Scopes for Each Railroad – All Very Aggressive



HISTORICAL FUEL EFFICIENCY



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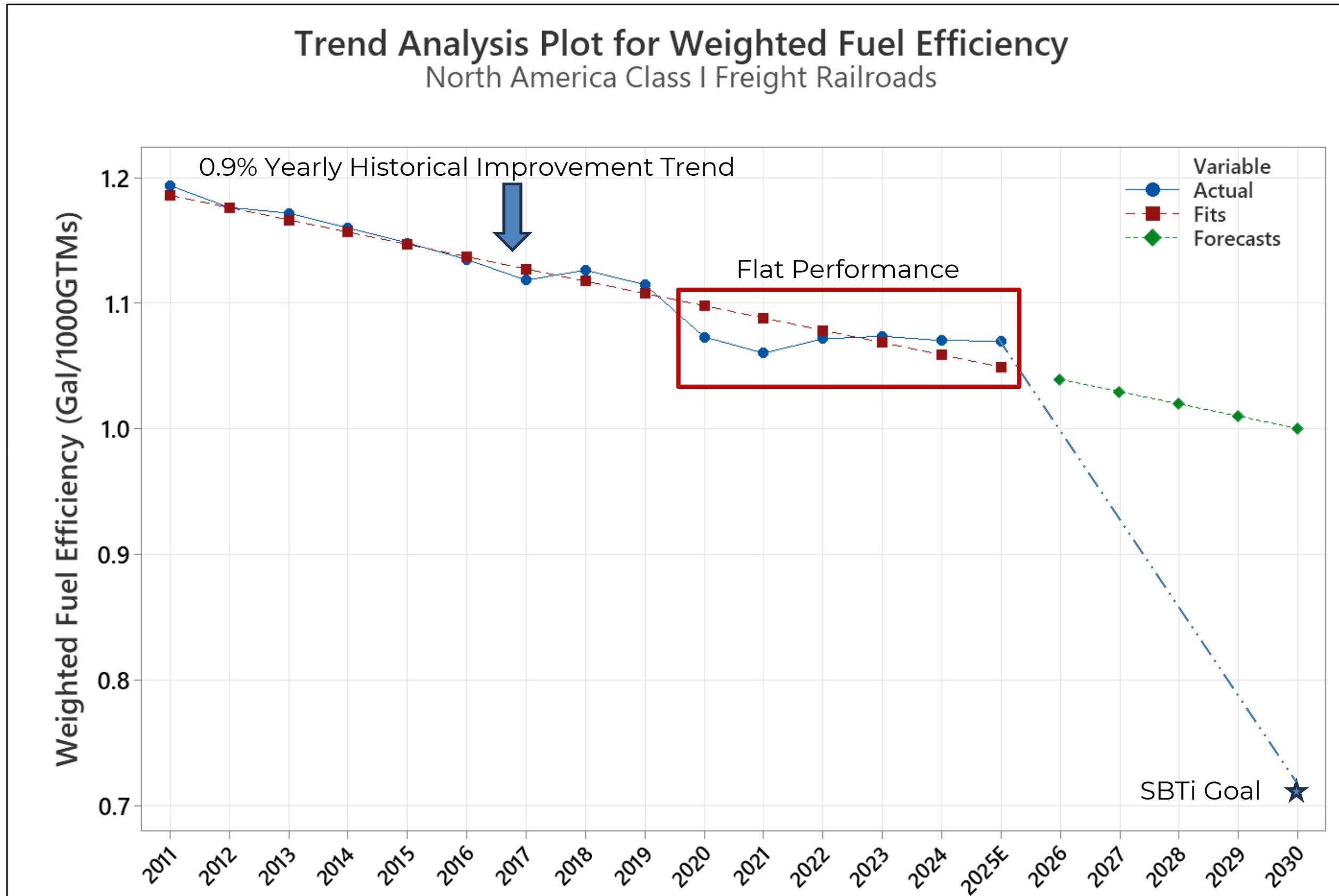


Gradual Improvement Though Flat Performance Since 2020 Post PSR Dip

CLASS I INDUSTRY TREND TO 2030 GOAL



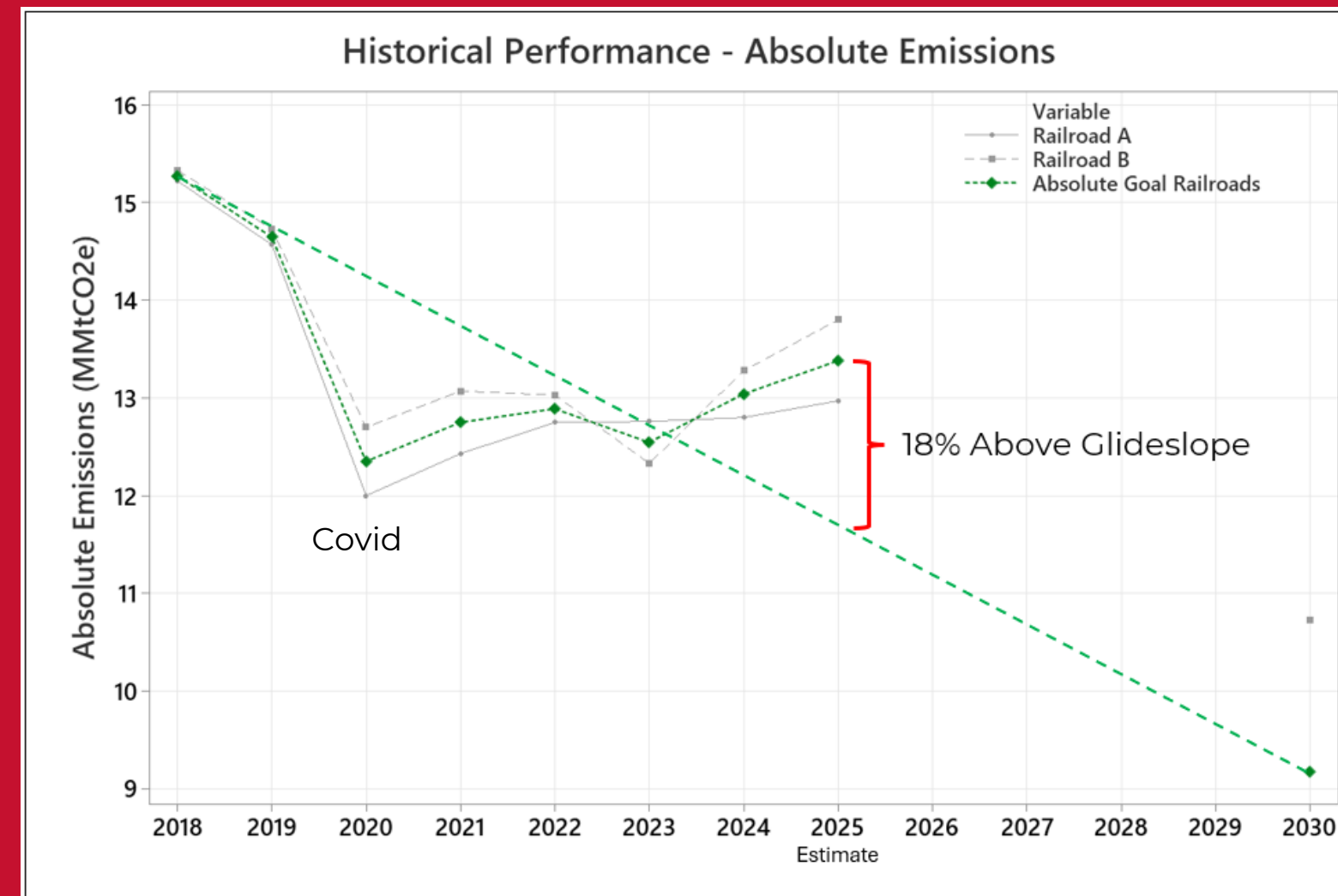
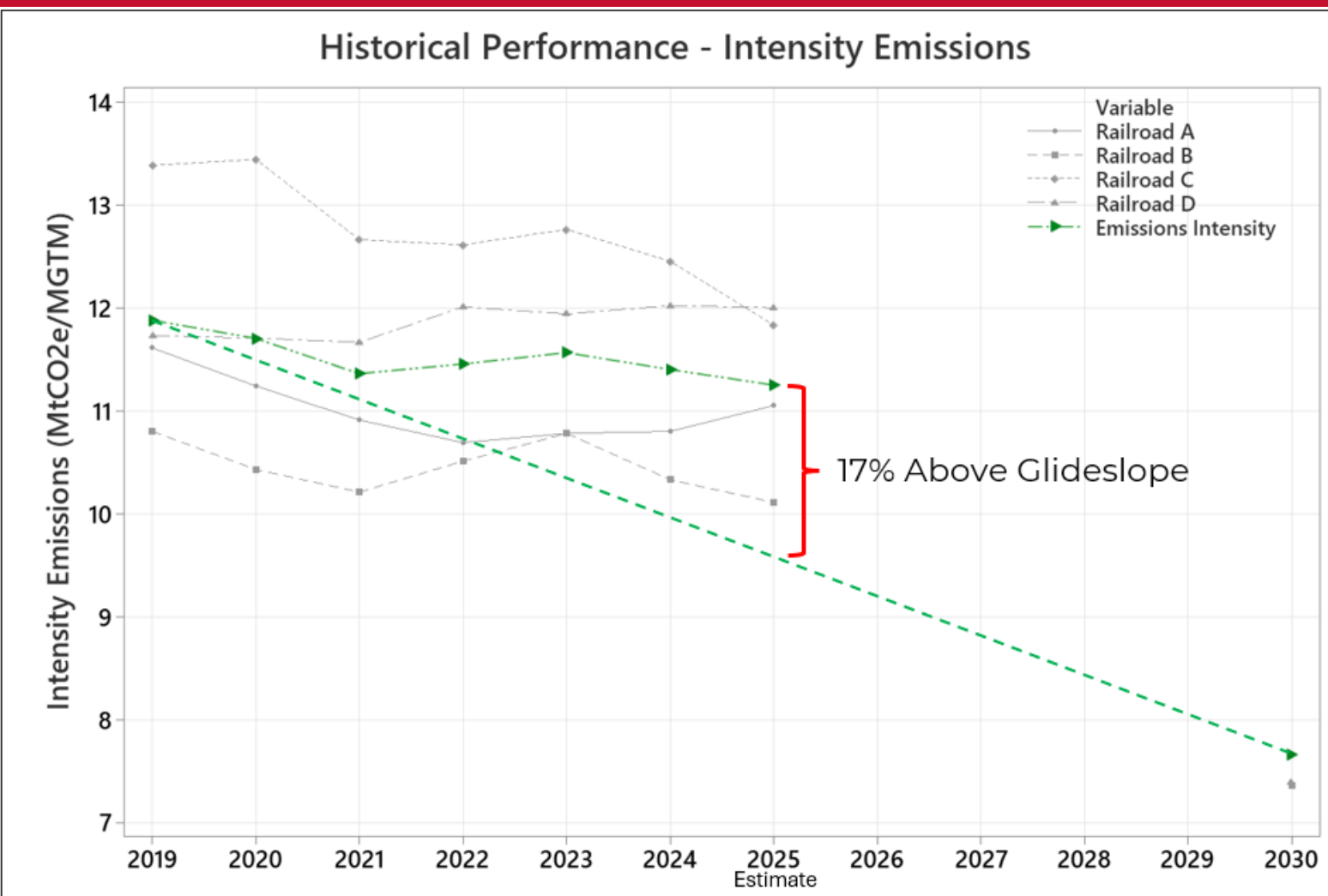
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- ▶ Weighted industry average shows a very gradual improvement likely due to newer more fuel efficiency locomotive power
- ▶ 2020 was the post-PSR effect of storing power and lowering HPTT (Horsepower Per Trailing Ton) with longer trains
- ▶ The last five years has seen flat performance overall and if the SBTi goal was pure fuel efficiency, it would be almost impossible to achieve by 2030

Performance Has Flattened Out Since 2020

SBTI PERFORMANCE TO-DATE



**Recent Years Have Seen Degradation to Glideslope
Future Gains Will Become More Challenging**

**Initial Traffic Volume Drop Has Now Reversed
As Volumes Begin to Slowly Return**

Both Intensity and Absolute Goal Type Railroads Seem Challenged to Meet 2030 Goals

FUEL SAVING TECHNOLOGIES

Other

Unnecessary stop reduction
SpillX high speed refueling
Fuel management systems
Fuel data analysis
Biofuels (GHG reduction only)

Engine Efficiency

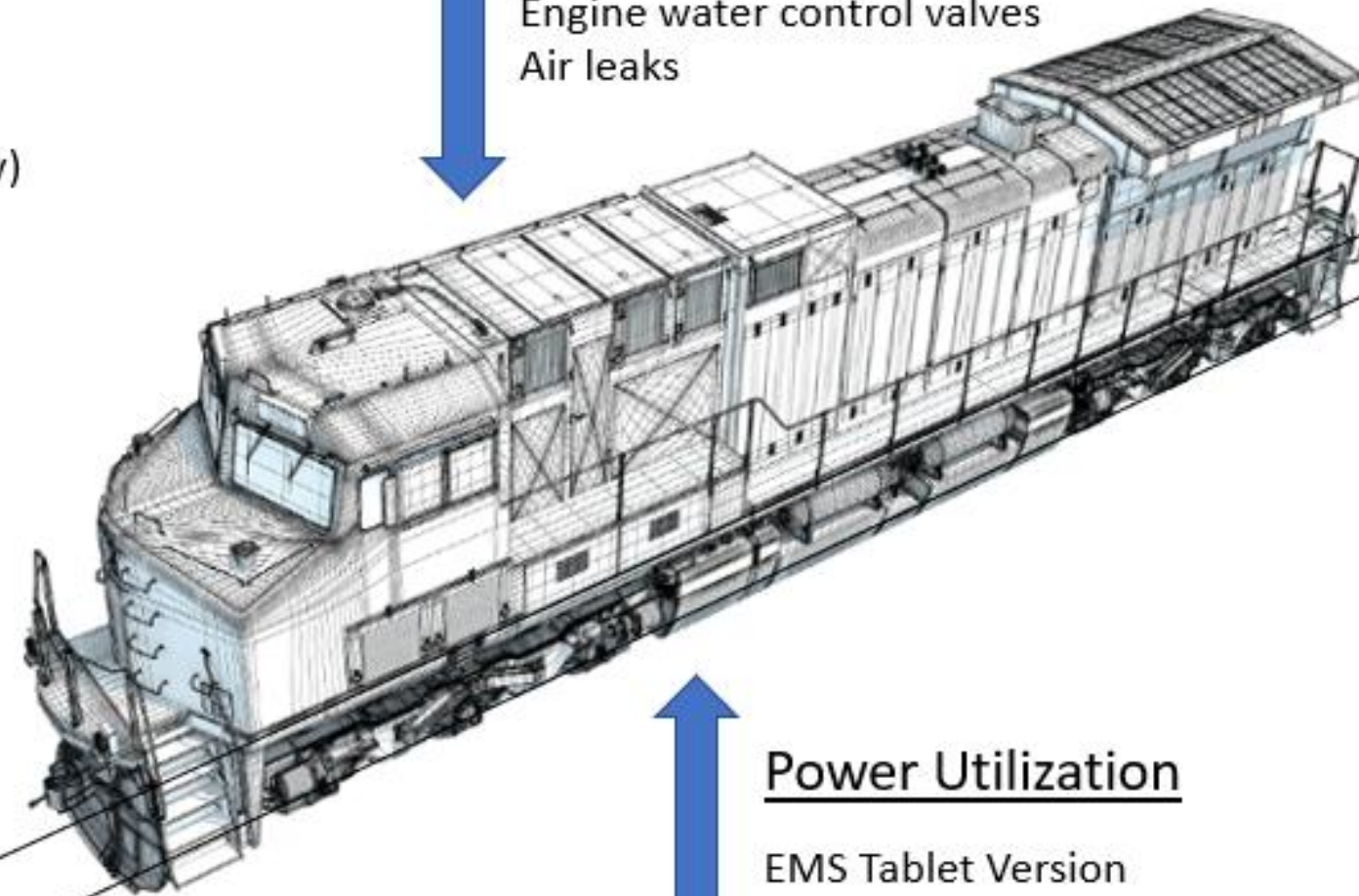
Fuel/oil additives
Engine Oil Friction modifiers
Railhead LED headlights
Good/bad actor ID
OEM specified injectors
Engine water control valves
Air leaks

Train Drag Factors

Freight Car Aerodynamics
Wheel Flange lube sticks
On-board TOR-FM
Wheel bearing seals
Wheel profile (AAR 2A)
Wayside TOR-FM

Power Utilization

EMS Tablet Version
Reduce HPTT
AESS (air leaks)
Throttle limitation
Reduce load testing
Li+ Battery Starter Pack
Engineer Training/Competition

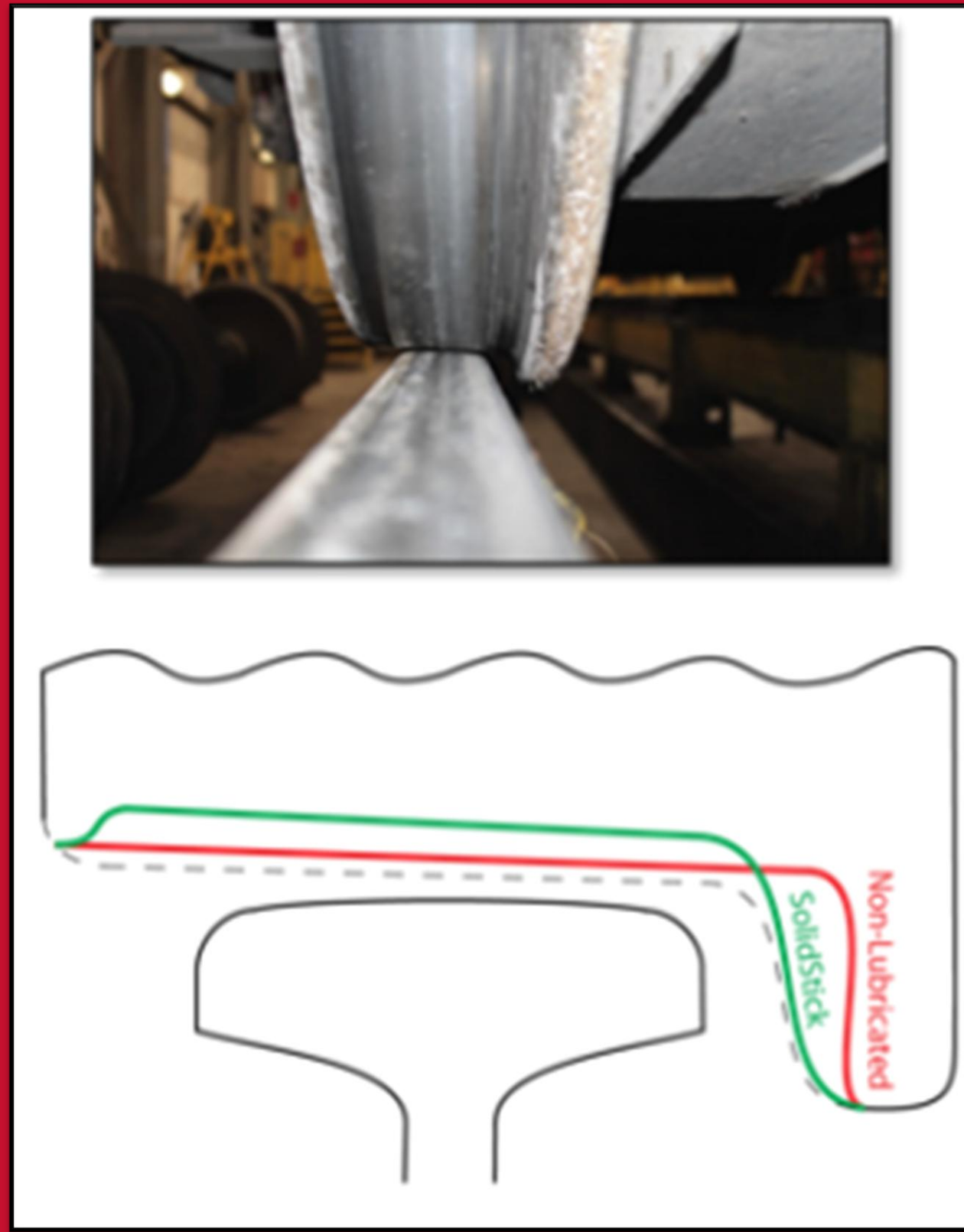
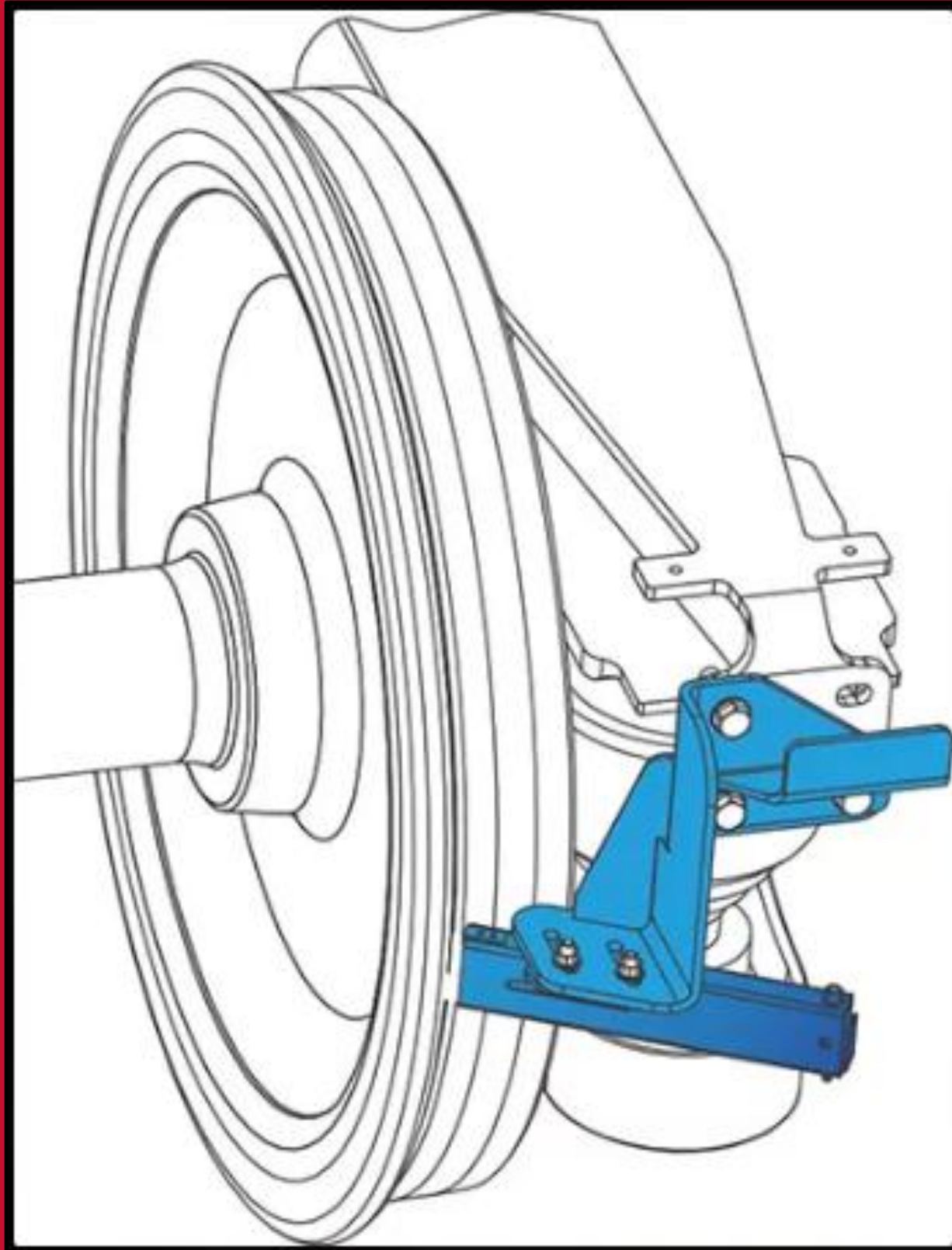


- ▶ Many of these technologies are in either low or no levels of adoption
- ▶ An inability to validate fuel savings is often the reason why
- ▶ High end statistical methods exist to tease out low levels of fuel savings



SOLID STICK FLANGE LUBRICATION

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- ▶ Reduces friction and wear between locomotive wheels and the rail, extending life and reducing cost
- ▶ Reduces fuel consumption and lowers coupler forces thus enhancing safety
- ▶ Environmentally friendly, often biodegradable and renewable, lowers maintenance costs and decreases noise levels



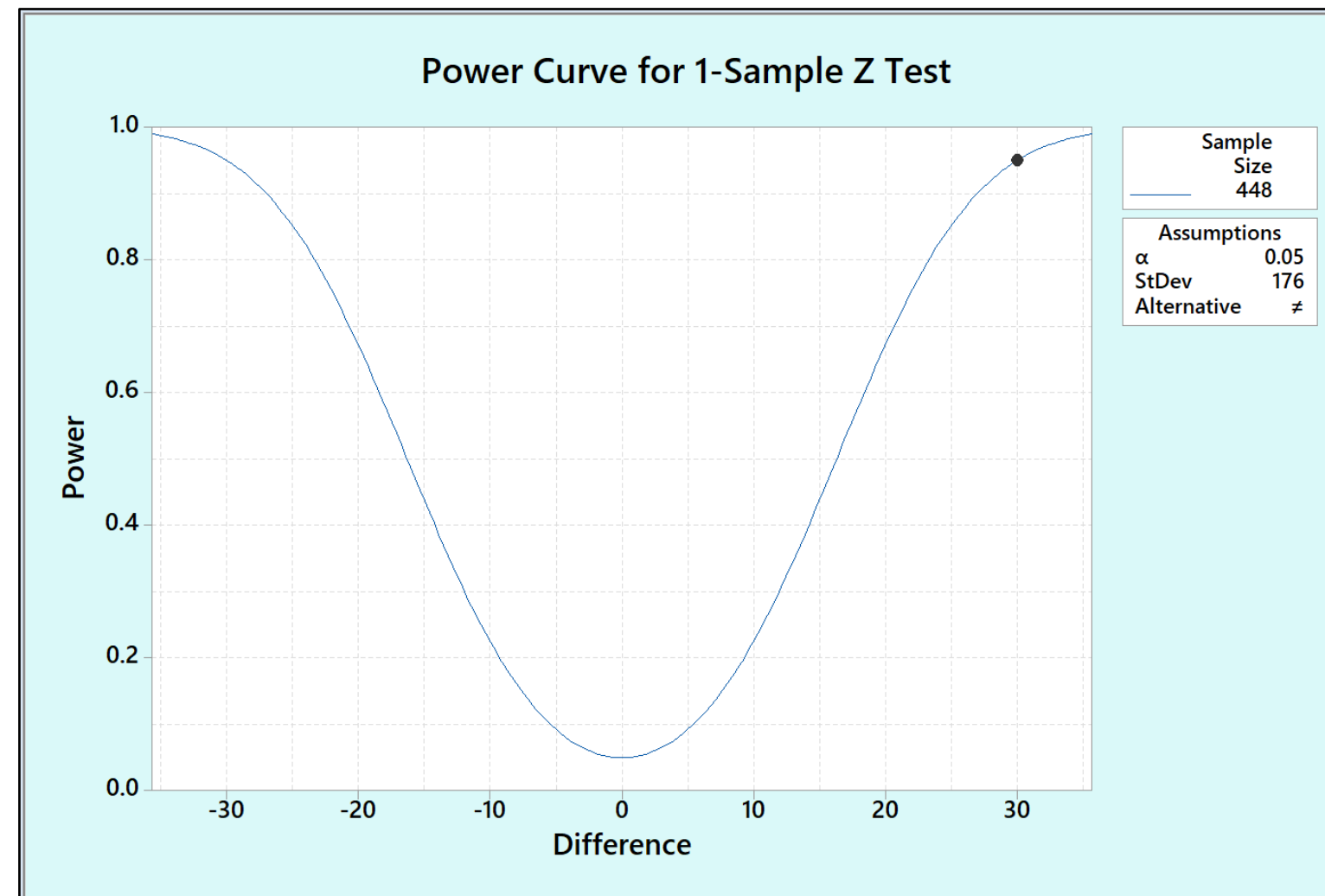
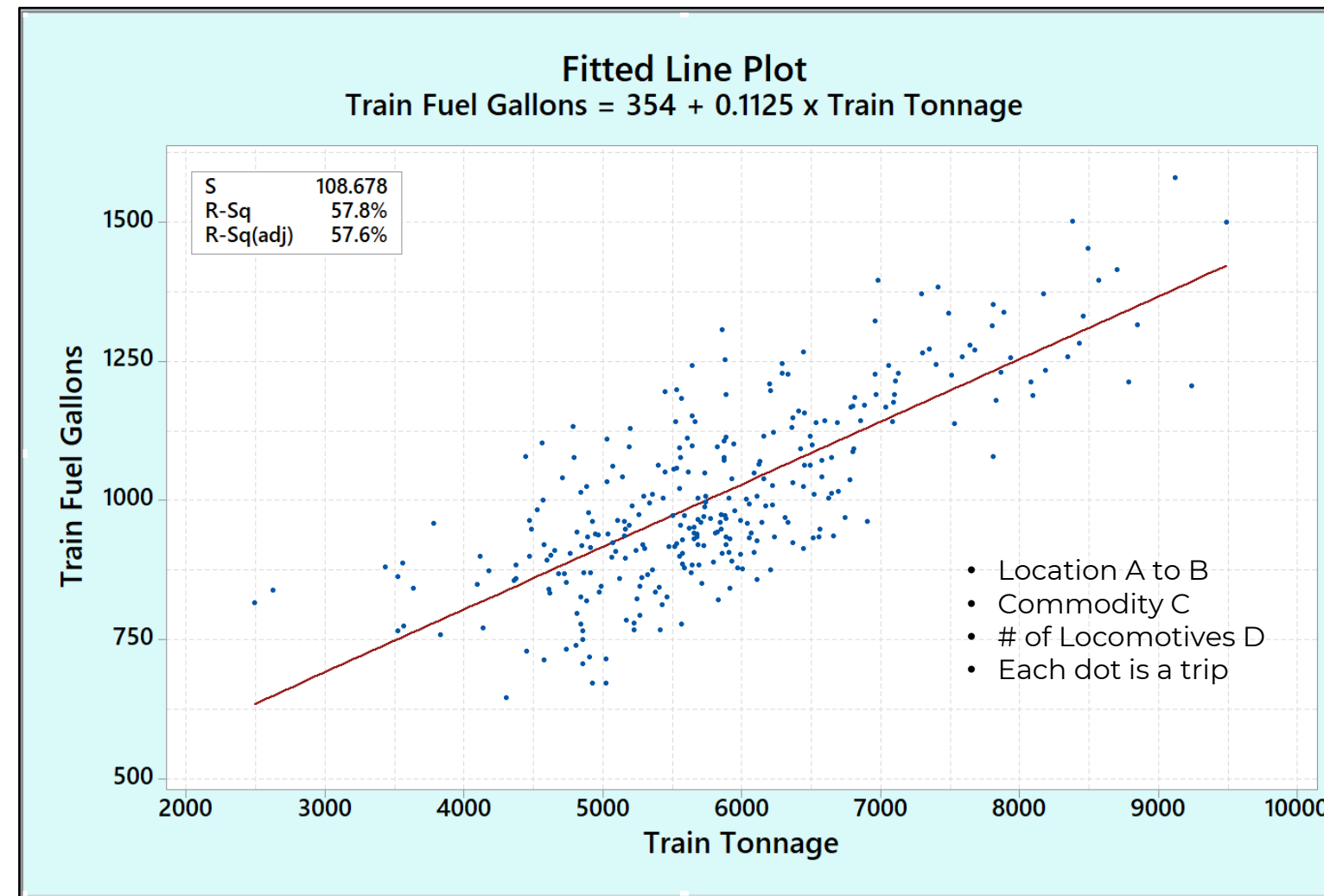
FUEL MEASUREMENT

Fuel consumption is highly variable due to numerous factors such as:

- Train length
- Train weight
- Commodity type
- Horsepower-Per-Trailing-Ton (# locomotives)
- Topography or terrain
- Train Speed and aerodynamic losses
- Locomotive engineer skill level
- Locomotive condition
- Condition of cars on train
- Track and ballast condition
- Episodic events
- Congestion
- Weather
- Location

A common measure of fuel efficiency is needed that can account for many of the variables listed above

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Segment Data

Trip fuel consumption (engineer on/off) is the preferred method

Regression

Within each classification, regress fuel against train tonnage

Sample Size

Depending on the mean and SD, you assess how many trips are needed to identify a specific % in fuel savings



REVENUE TESTING

Logistic-regression model using 500,000 trip segments with half of fleet equipped, a 1-year test duration

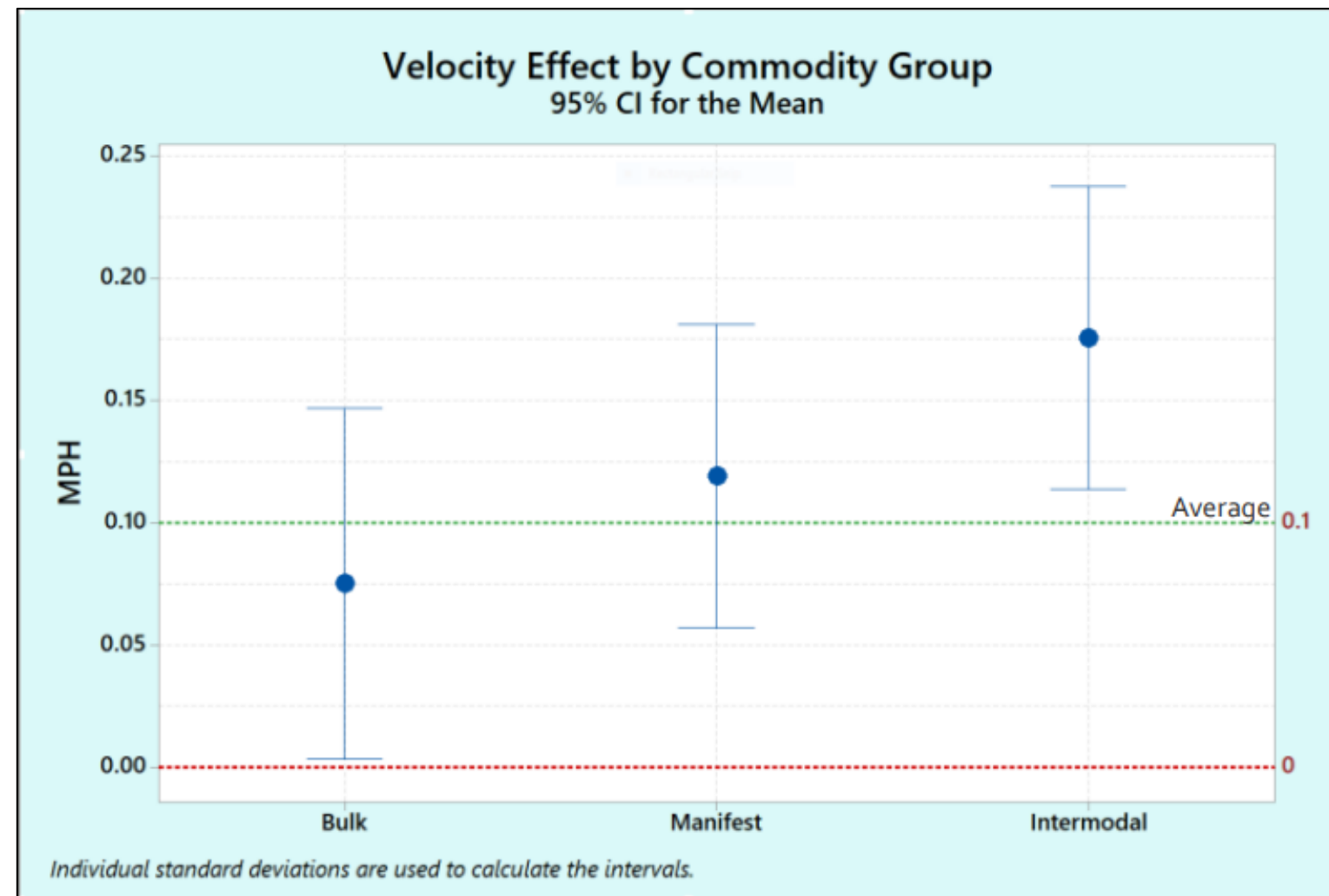
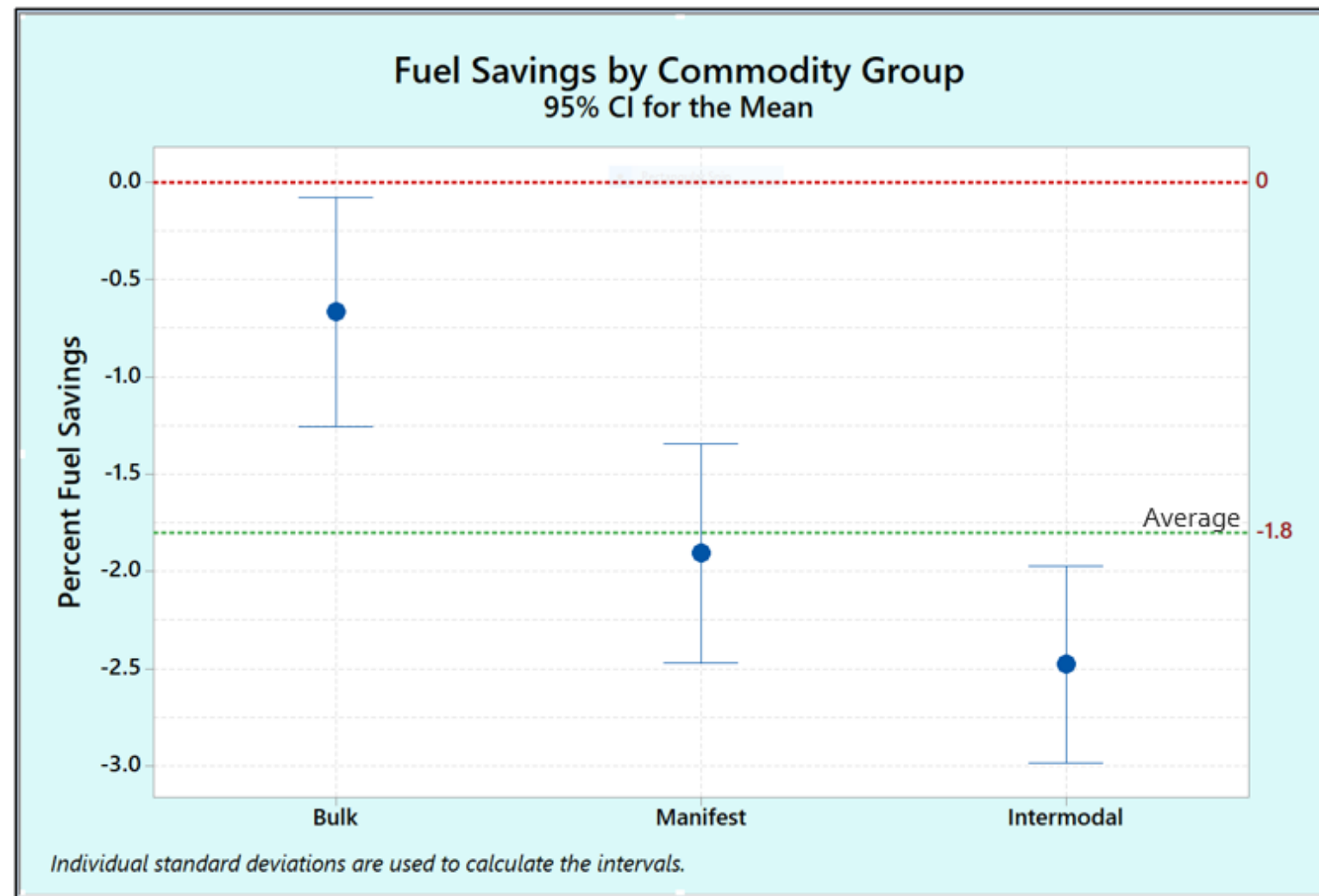
Dependent Variables:

- Fuel consumption G/KGTM
- Train velocity in MPH

Independent Variables:

- Train equipped (Y/N)
- Multiple locos equipped (Y/N)
- Train commodity group
- Horsepower per trailing ton
- Train tonnage and length
- Distributed Power (Y/N)
- Segment route miles
- Wind speed

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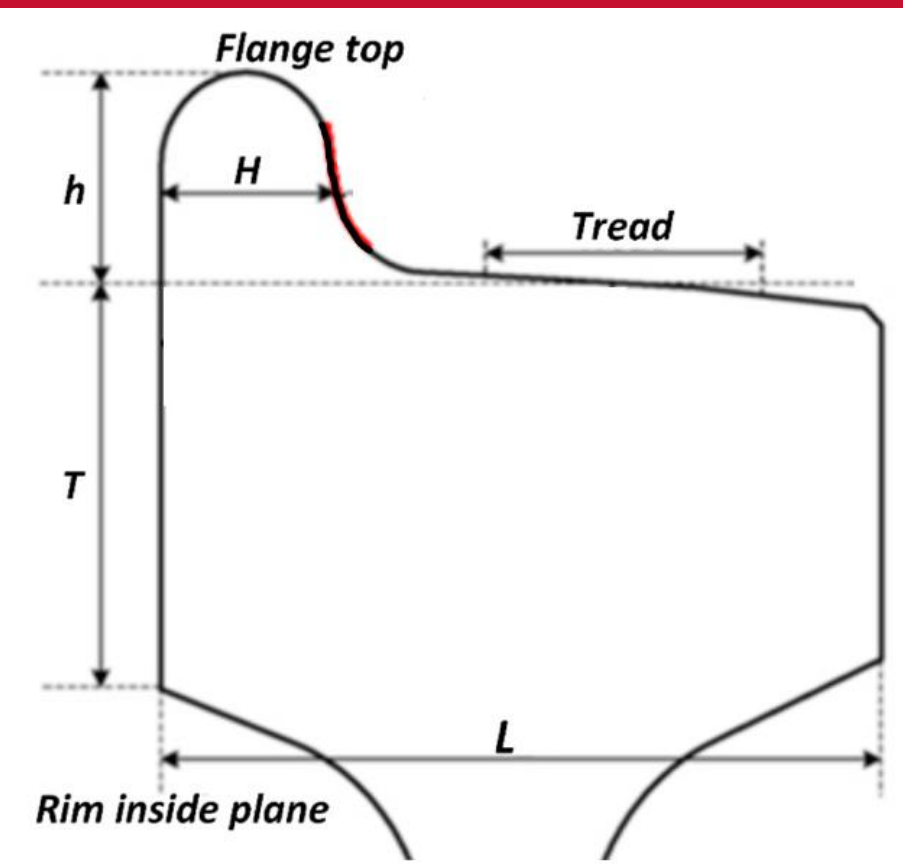
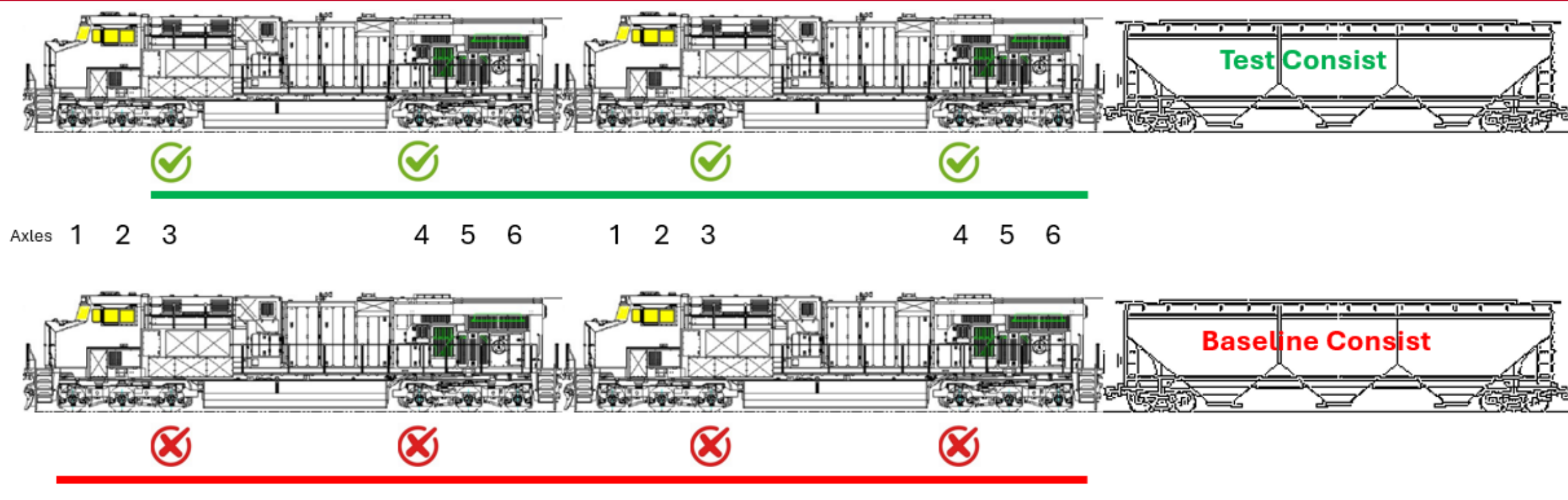


▶ **Commodity**
Light / fast show higher savings with heavy / slow show less

▶ **Interval Plot**
Model shows consistent savings, reasonable intervals

▶ **Velocity**
Moderate speed improvement, which is an intuitive finding

WHEEL WEAR TEST SETUP



- Test duration was six months
- Two consists pulling on the same route hauling the same commodity
- Static locomotive location in consist
- Average of wheel wear on 10 test axles (post application) and 12 baseline axles (no lubrication applied)
- Applicators located on axles 3 and 4

- Both test and baseline trains operated on same heavy haul coal route with locomotives static
- An electronic wheel measurement gauge was used to measure all locomotive wheels
- Rim thickness (r), flange height (h) and tread to reference groove distance (as a secondary check on rim thickness) were measured at the start and end of the test





WHEEL WEAR TEST RESULTS



- ▶ Rim thickness change shows good extension of wheel life and reduced truing maintenance required
- ▶ Flange height reduction also shows good life extension and decreased derailment risk
- ▶ A very large decrease in reference groove distance preservation which would increase wheel life longevity significantly



FUEL SAVINGS ANALYTICS

PUEBLO TESTING





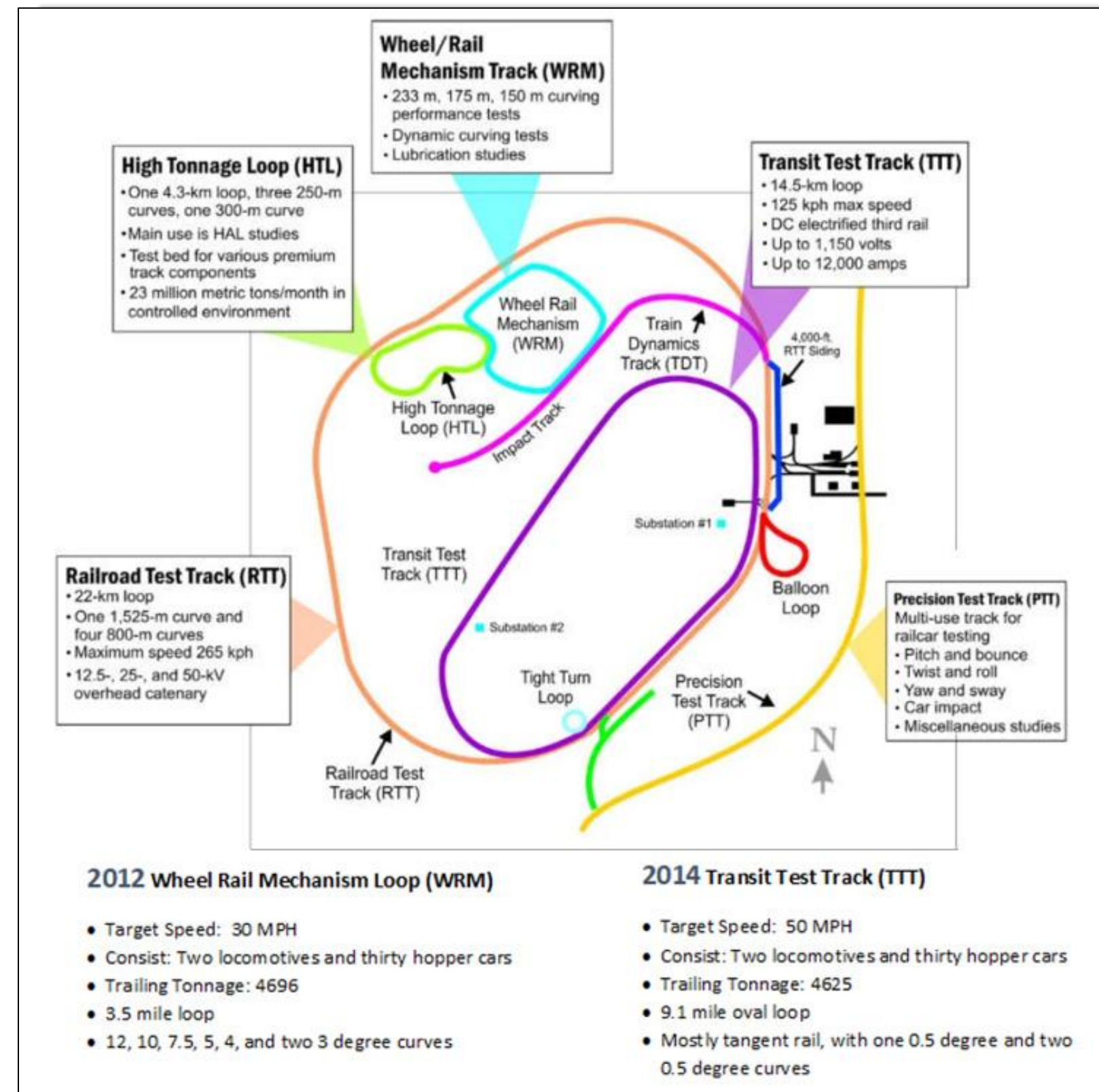
TESTING: CLOSE TO REAL WORLD

Theme

Rigorous, statistical analysis of data generated from tests



Locomotive Wheel Flange Solid Stick Lubrication



COMPRESSIVE DATA ANALYSIS AND FORMAL STATISTICAL TESTING



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Figure 9 – Comparison of Means, Base versus Lubricated

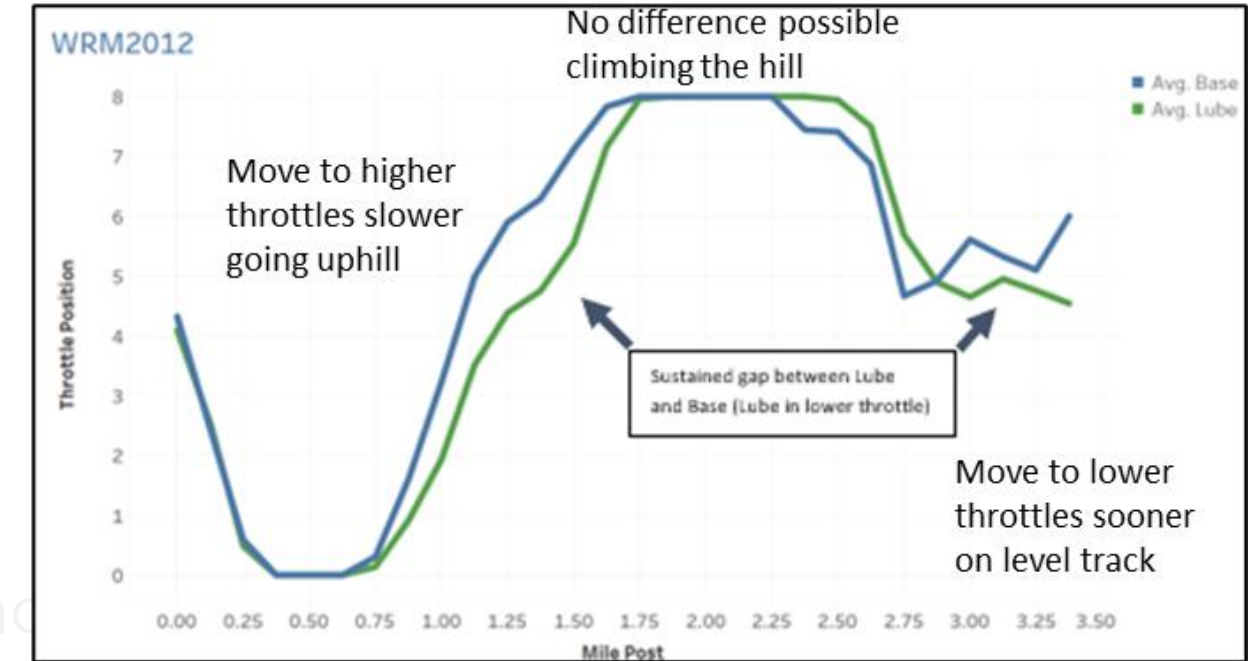
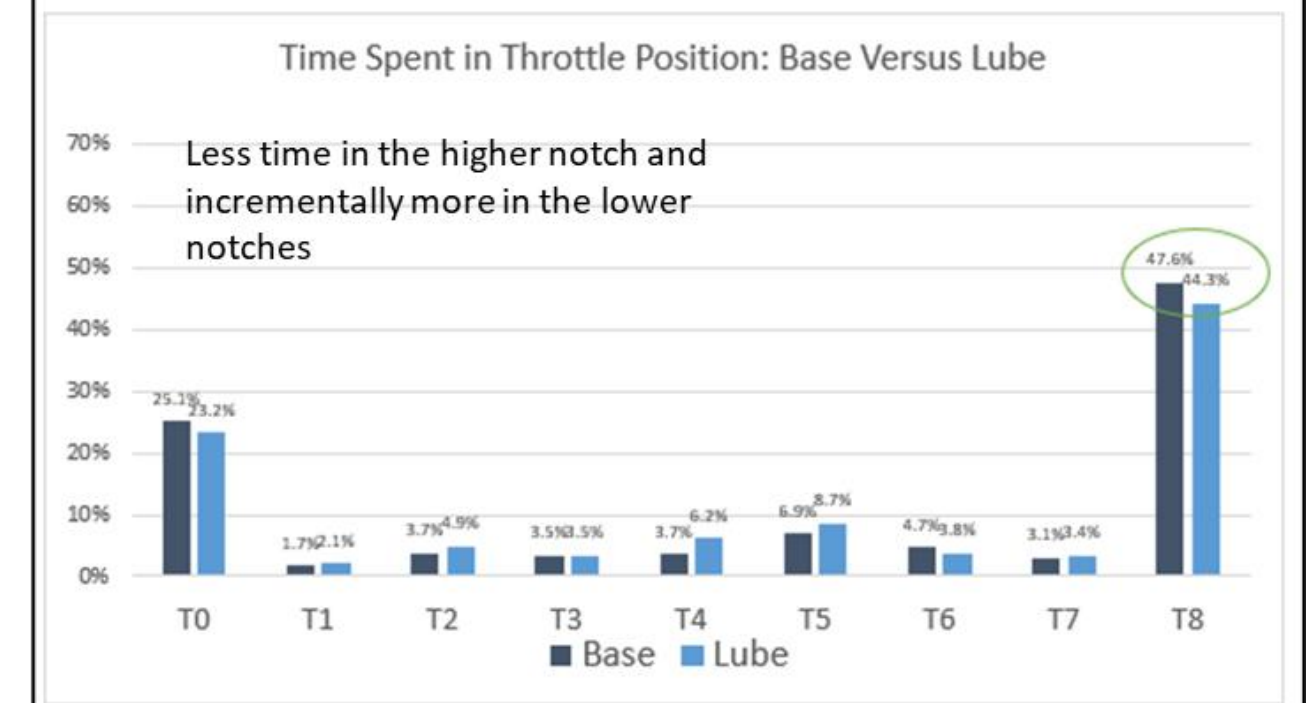
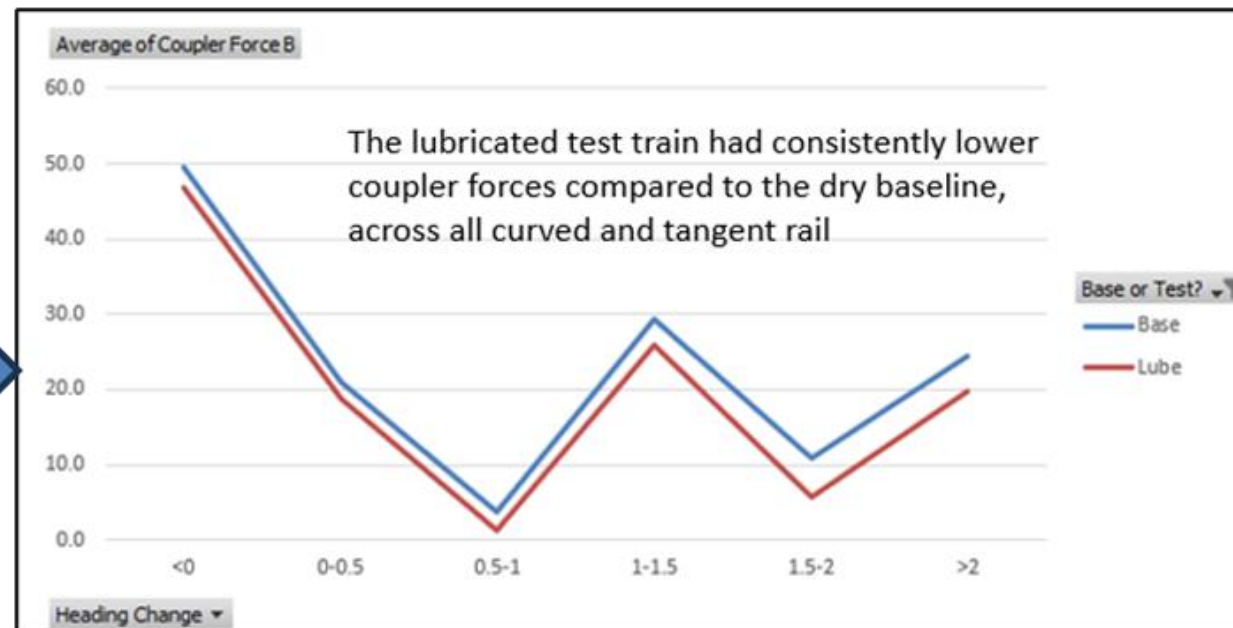


Figure 5 - Time Spent in Throttle Position

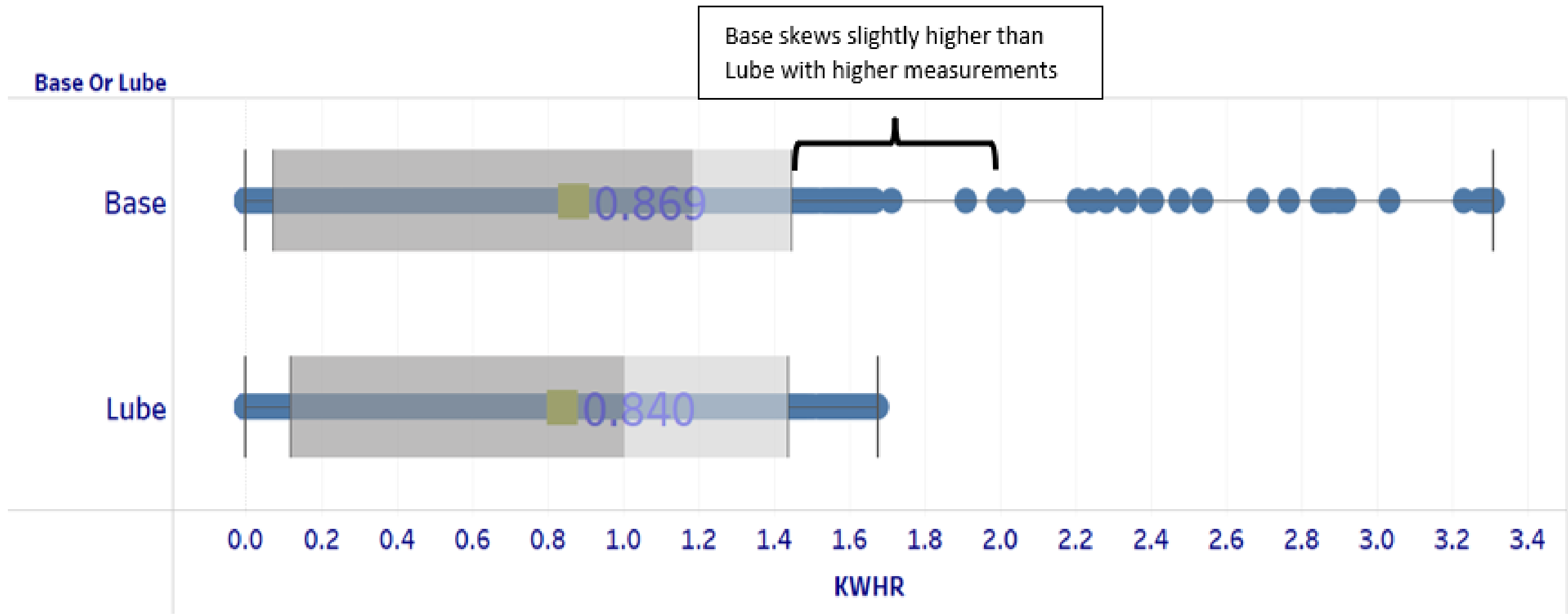


Energy savings increases as the degree of curvature increases due to flanging



UNDERSTANDING VARIATION IS KEY

"The central problem in management and leadership is failure to understand the information in variation." — W. Edwards Deming



Condition	Number of Observations	Mean	Standard Deviation
Base	8,681	0.869	0.659
Lube	11955	0.840	0.636

Standard Deviation is a measure of spread. Base has a greater range of energy measurements values.





COMPARISON TO CLINICAL TRIALS

Design and Analysis of Experiments

- Patients are randomly assigned to “investigational” and “control” groups.
- This reduces bias up-front
- Investigational group gets the “treatment” (stick lube)
- Control group gets “standard therapy” (base condition)
- Statistical models are used to analyze the outcomes.

CLINICAL TRIALS RANDOMIZATION

NATIONAL
CANCER
INSTITUTE



The computer randomly assigns patients to two or more groups, helping to prevent bias



Control group receives standard therapy



Investigational group receives new treatment

WHY NOT COMPARE RAW MEANS BETWEEN TEST AND CONTROL?

Pitfalls mitigated using statistical tools

- Looking at raw means alone, in a univariate sense, **does not account for other ancillary factors** that may also be driving the difference of the means.
- Statistical modeling using multivariate methods allow us to quantify those ancillary factors and **adjust the means** accordingly to have a more balanced comparison.
- Statistical models can assign a **degree of confidence** that the true effect (energy savings) is non-zero.
- Means are a single number – a point estimate. Statistical modeling can provide an estimate of the range of **potential outcomes**.

[Replace Image]

Linear Mixed Effect Model

$$\text{KWHR}_{ij} = \beta_0 + \beta_1 \cdot \text{TestCondition}_i + \beta_2 \cdot \text{Curvature}_{ij} + \beta_3 \cdot \text{ElevationChange}_{ij} + \beta_4 \cdot \text{TestTrack}_j + \epsilon_{ij}$$

Lube versus Base (control).

We need this to compute the least square (adjusted) means

Covariates that account for other, non-lube variation in KWHR.

These are used to make the adjustments to the Least Square Means (“all other things being equal”).

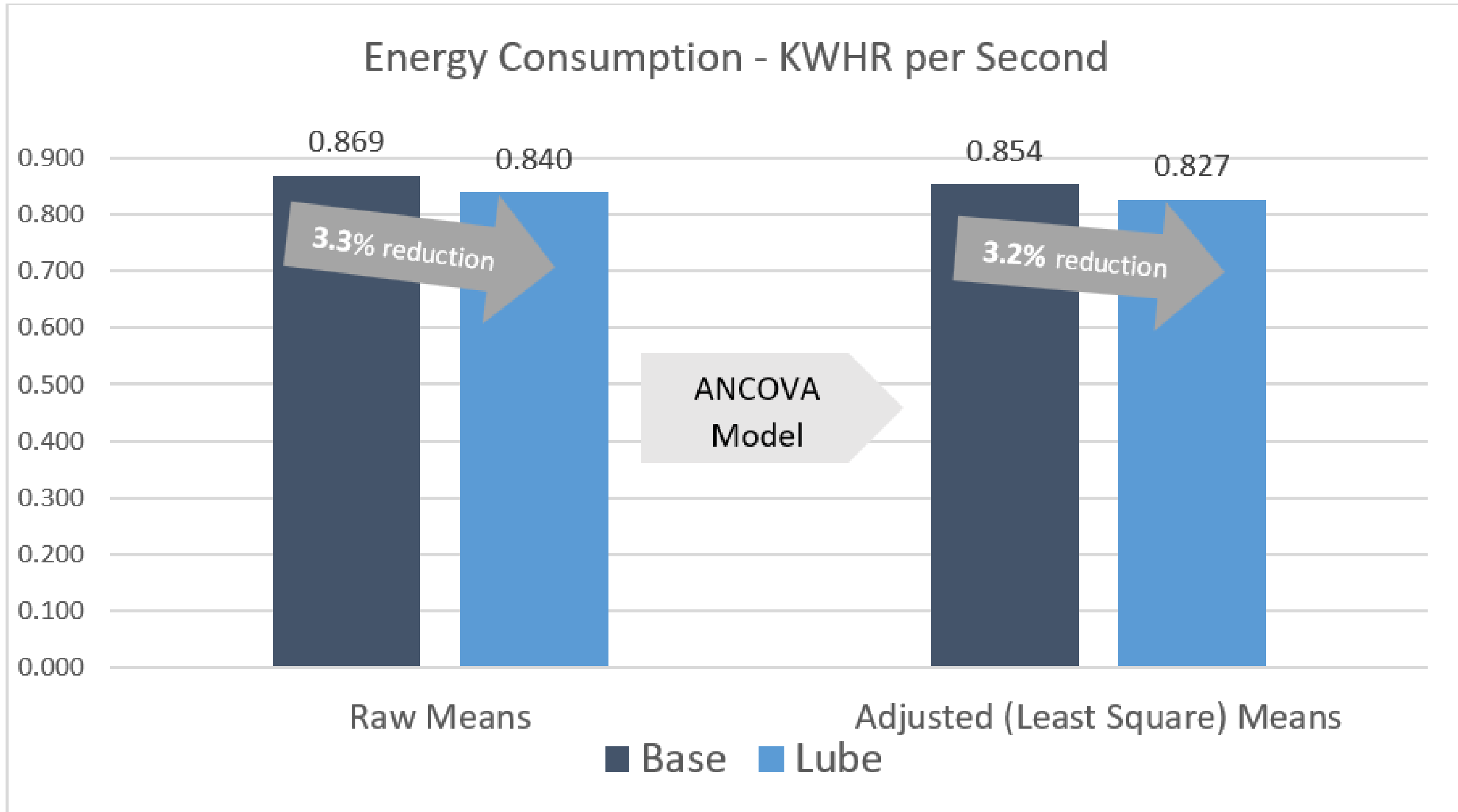
The coefficients vary across test tracks (WRM loop versus Transit Test Track). Thus, these the “random effects”

Fixed effect indicator for the test track: WRM Loop vs. Transit Test Track

ϵ_{ij} : residual error, assumed $\epsilon_{ij} \sim \mathcal{N}(0, \sigma^2)$

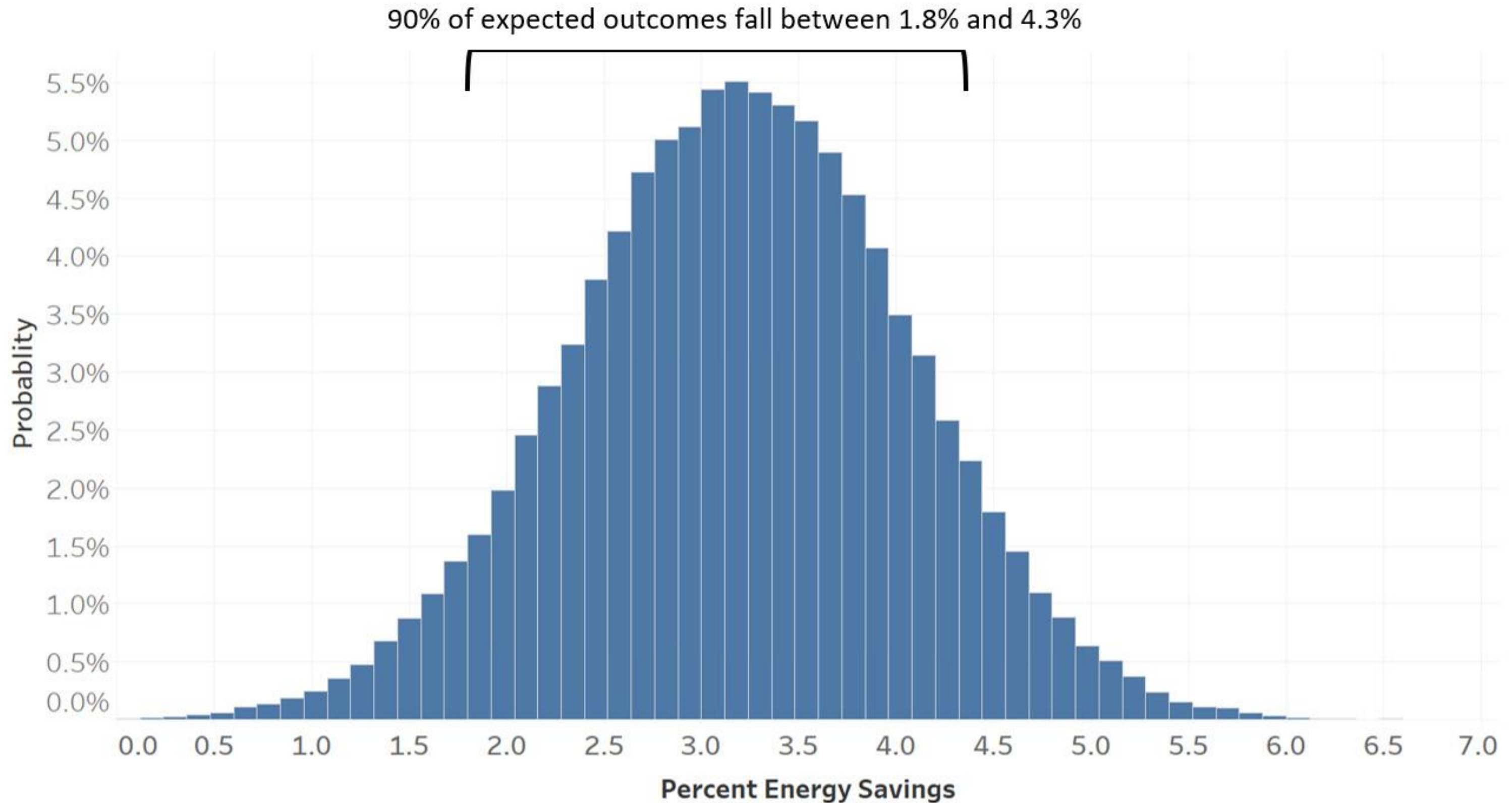


ANCOVA RESULTS



UNDERTANDING A RANGE OF OUTCOMES

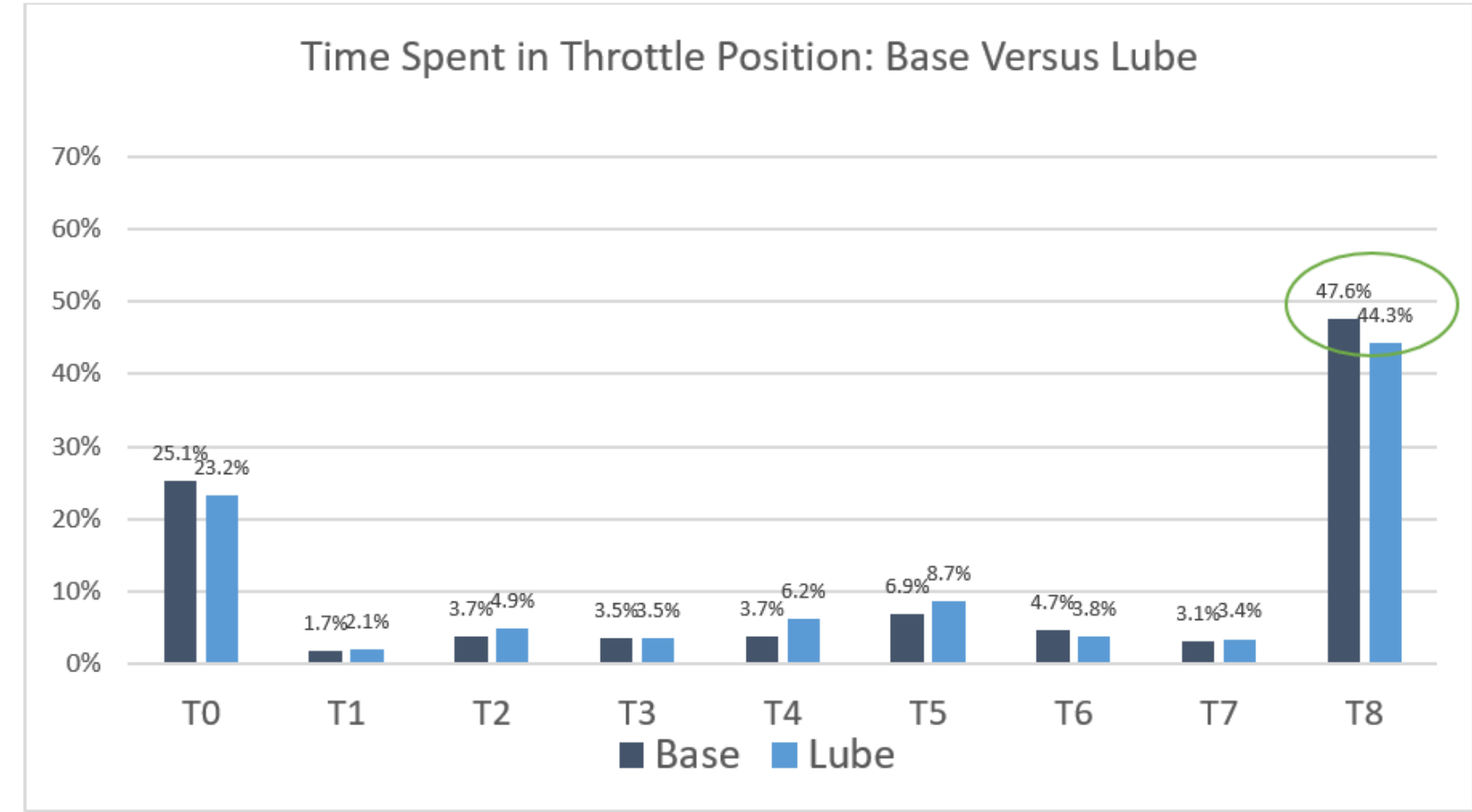
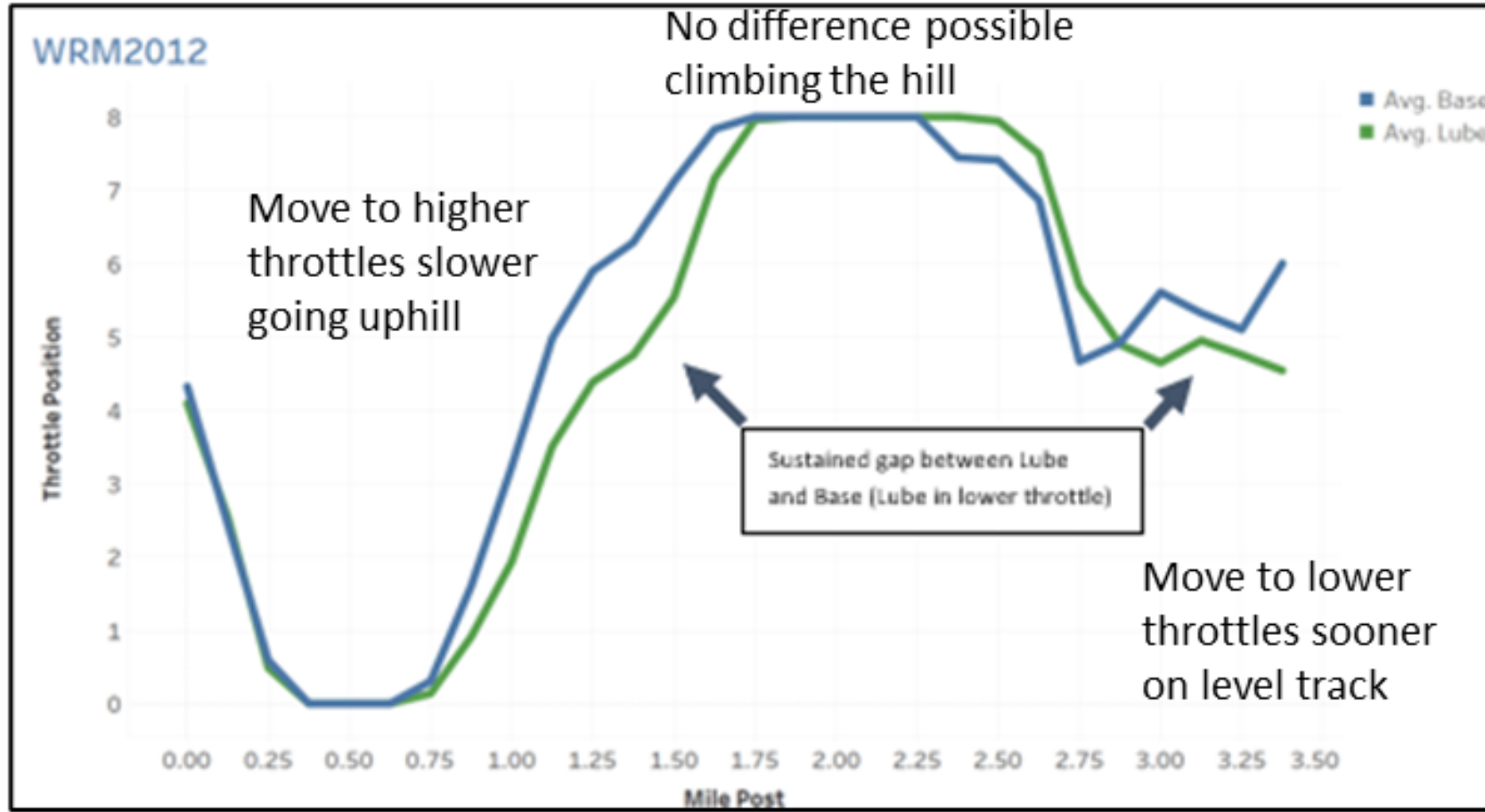
Monte Carlo Analysis



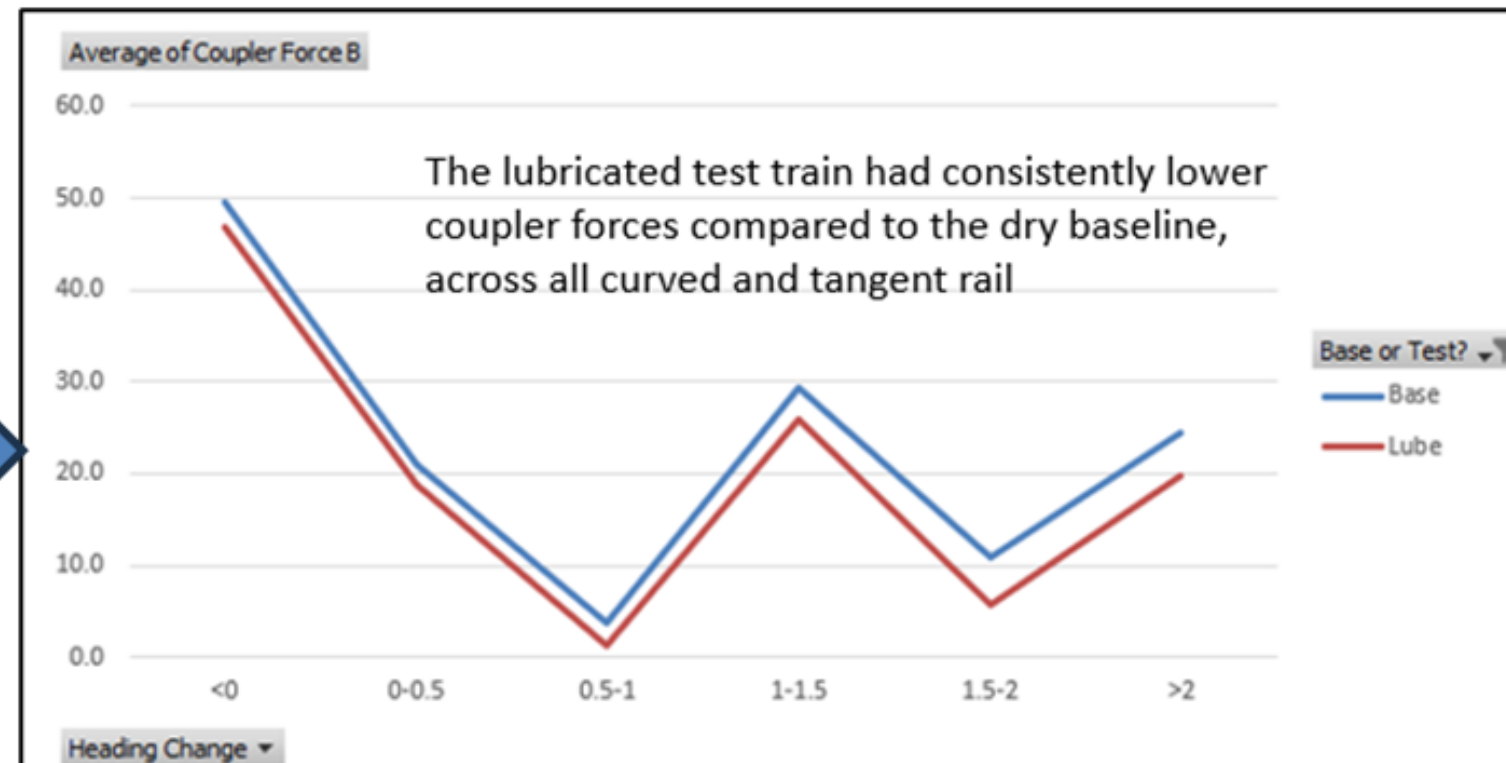
ADDITIONAL EVIDENCE



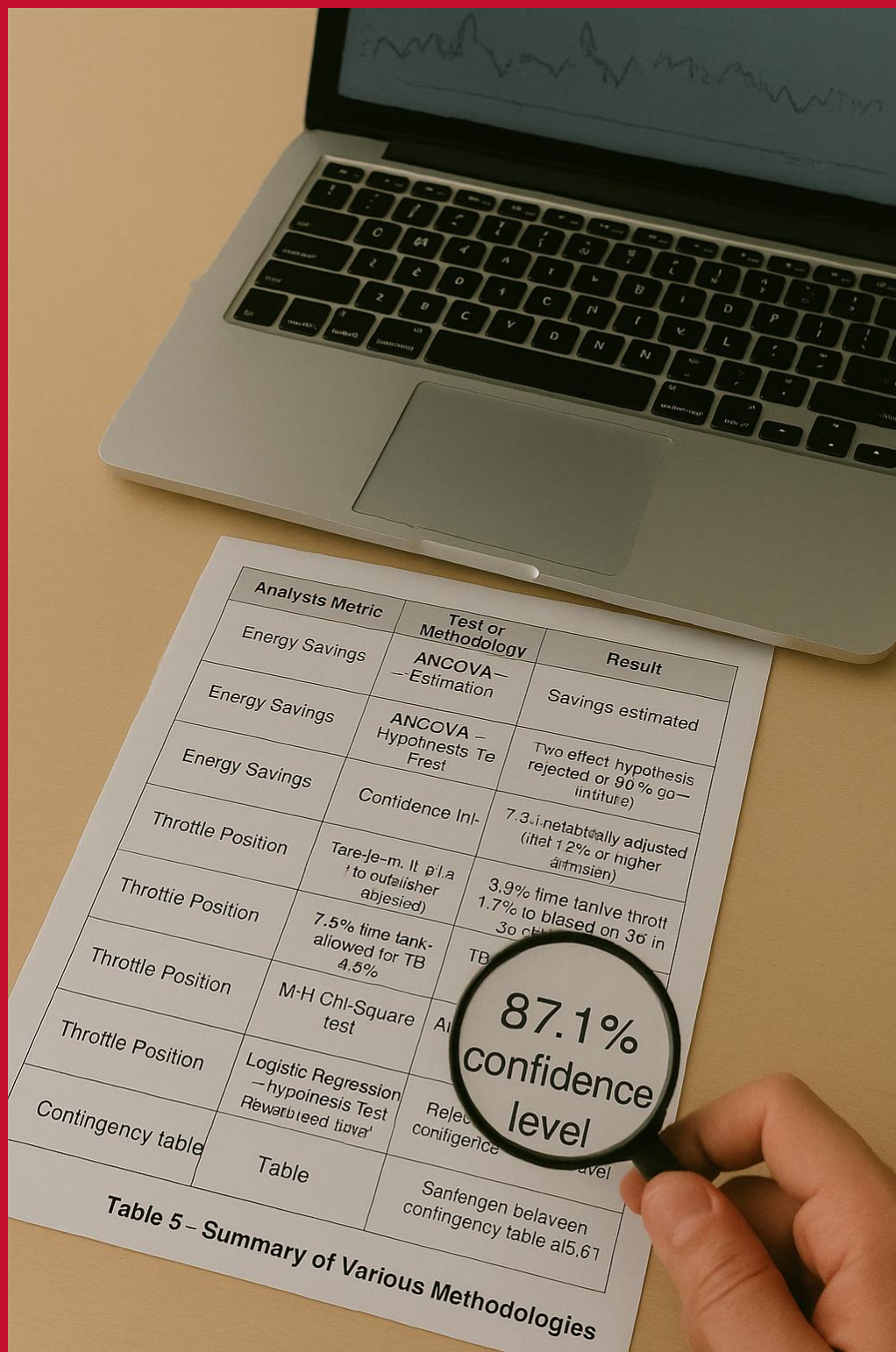
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Energy savings increases as the degree of curvature increases due to flanging



A Battery of Statistical Tests to Build Evidence



Analysis Metric	Test or Methodology	Result
Energy Savings	ANCOVA - Estimation	Savings estimated to be 3.2%
Energy Savings	ANCOVA - Hypothesis Test (t-test)	"No effect" hypothesis rejected at 99% confidence level
Energy Savings	Simple two-sample t-test	"No effect" hypothesis rejected at 99% confidence level
Energy Savings	Confidence Intervals	90% of expected outcomes are within 1.8% and 4.3%
Throttle Position	Simple statistics and visualization	7.1% less time spent in T8 (not statistically adjusted) More time spent in T4 and T5
Throttle Position	M-H Chi-Square test	Time spent in each throttle position, taken as a whole, is statistically different at the 90.1% confidence level
Throttle Position	Simple two-sample t-test	Average throttle position is statistically different at the 90.0% confidence level
Throttle Position	Logistic Regression - Estimation	Odds of being in T8 reduced by 4.8%
Throttle Position	Logistic Regression - Hypothesis Test (Wald Chi-Square)	"No effect" hypothesis on T8 reduction rejected at 87.1% confidence level.
Throttle Position	Visualizations	Visible gap between Lube and Base along the track mileage

Table 5 – Summary of Various Methodologies Applied



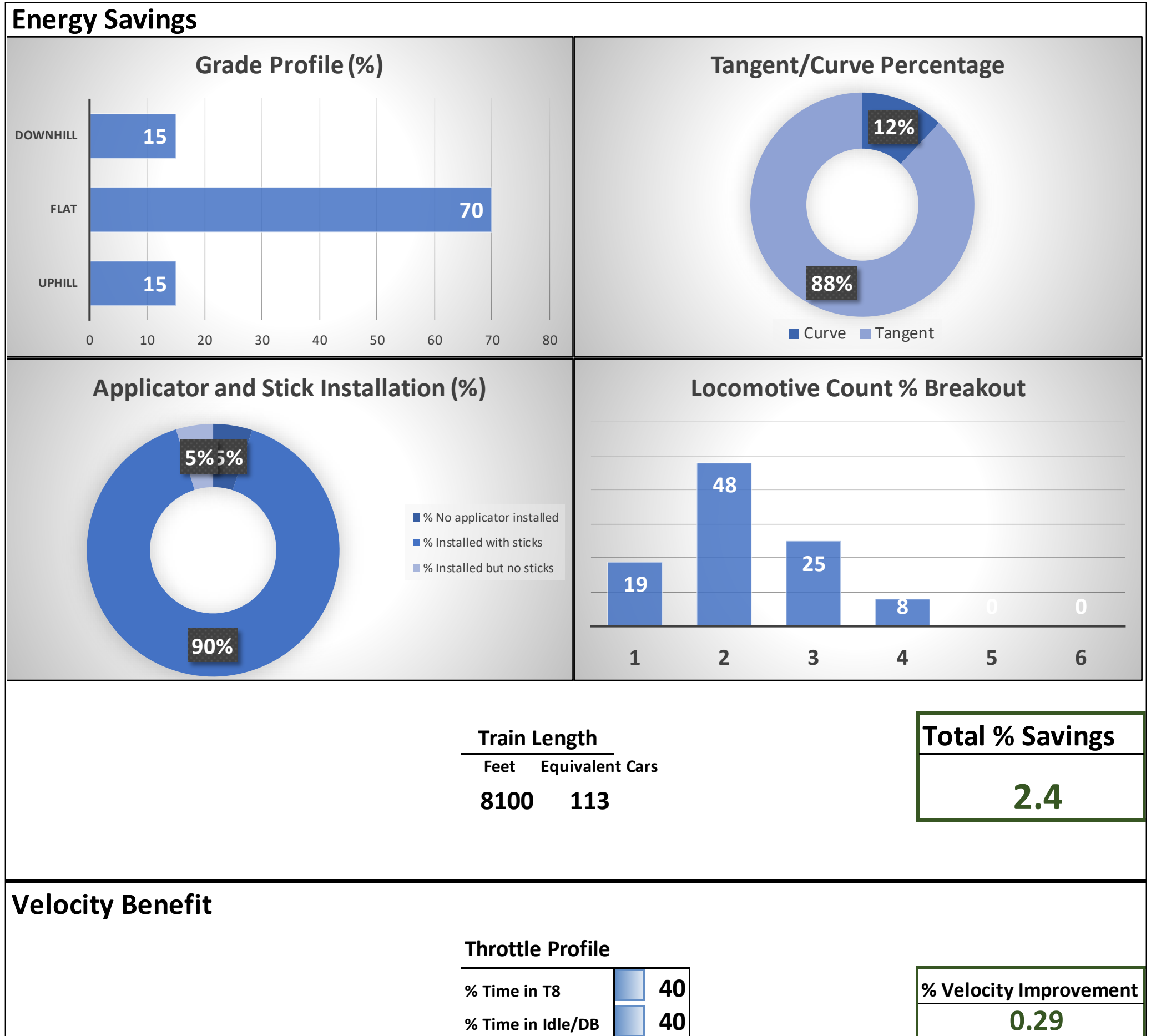


PROJECTING TEST FACILITY RESULTS BY RAILROAD



PROJECTING TTC / MxV RESULTS

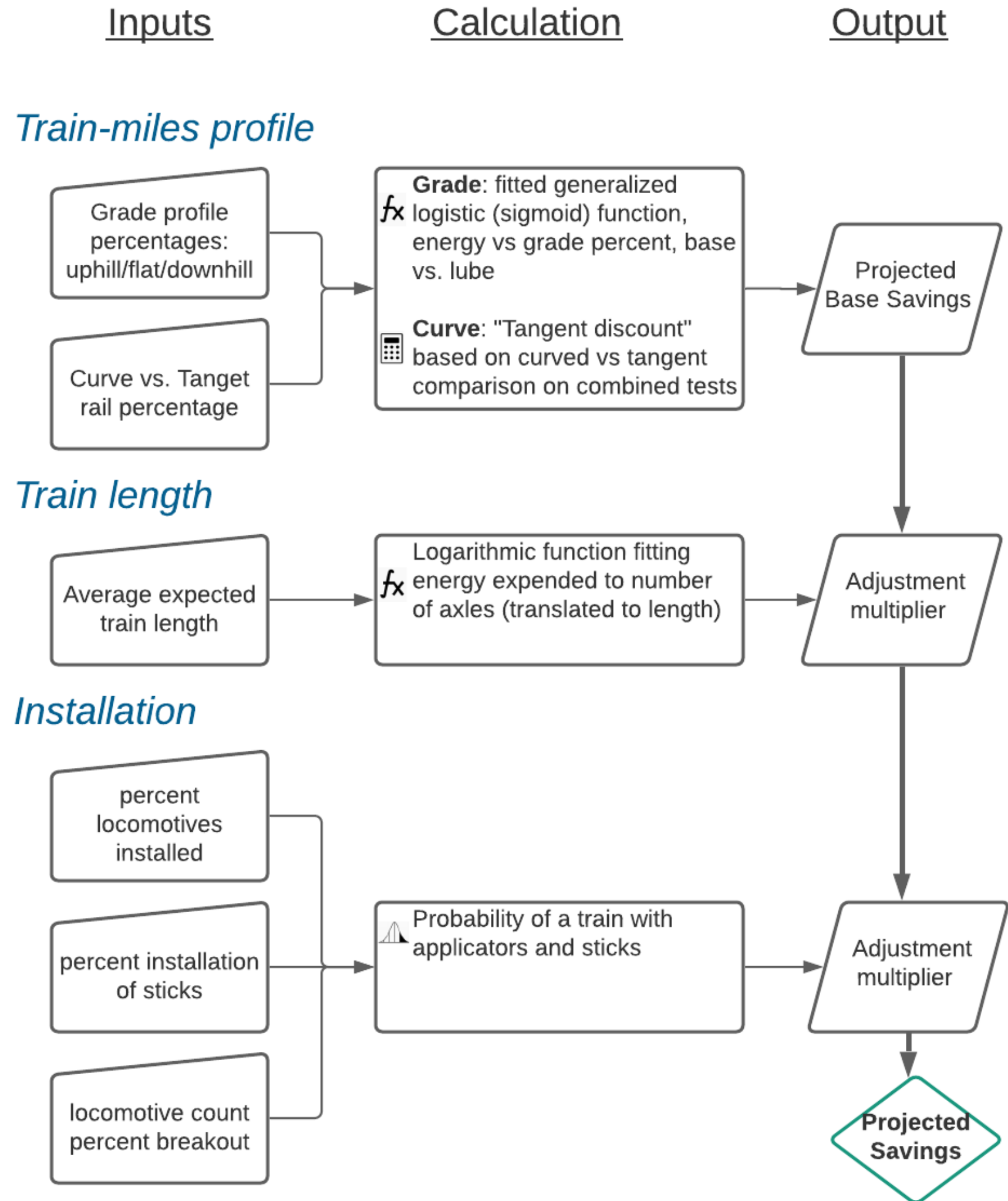
Based on a Railroad's Profile





PROJECTION MODEL

Based on a Railroad's Profile





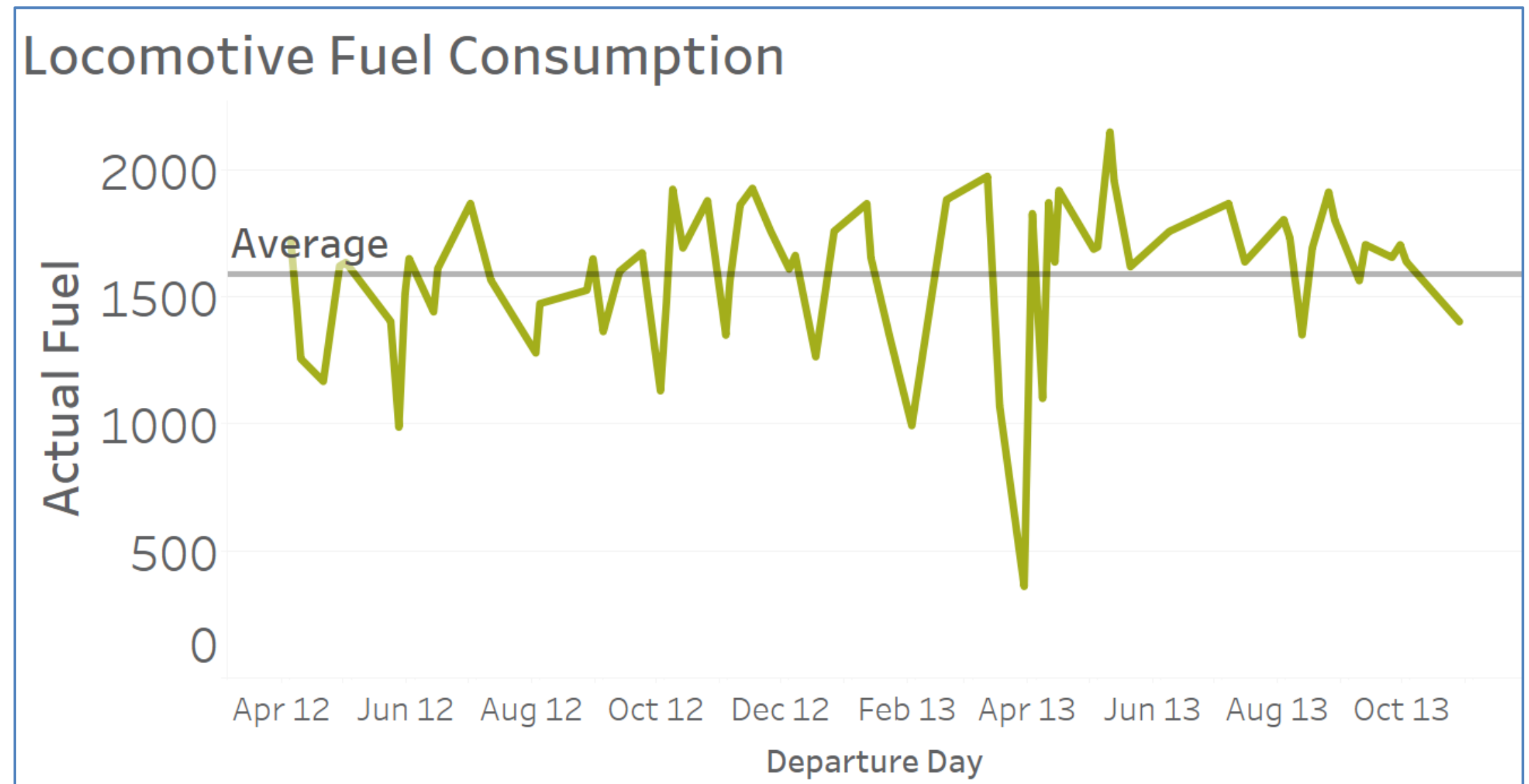
FUEL MEASUREMENT RELIABILITY



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FUEL MEASUREMENT DATA CAN BE NOISY

- Same origin-destination
- Same locomotive count
- Same horsepower
- Similar number of cars / tonnage (loaded coal)
- Same engineer



CREATING A RELIABLE FUEL METRIC



Raw Measurement



Business Rules



Statistical Imputation



Model Combination

Wi-Tronix



Event Recorder (Notch)



- Identification of “bad” records for each measurement type
- Statistical outlier detection
- Rules for combining data

Formal statistical methods to replace “bad” records with data- and model-based estimates

- Final estimate based on “jury of opinion” of the models.
- Rigorous methods, such as *Bayesian Model Averaging* (data-determined weighting)

COMPOSITE FUEL METRIC FEATURES AND BENEFITS



Consistency and reliability



Highly automated



Includes both human expertise and statistical modeling and algorithms

[Replace Image]



Reduces variation allowing for the ability to tease out fuel technology savings in the 2% range



Incorporates into existing data warehouse, dashboards and Tableau / PowerBI reports



Enables “what-if” scenarios such as testing technology X on Subdivision Y to calculate length of test and provide a realistic % savings rate

CONCLUSIONS FOR THE RAIL INDUSTRY

- ▶ Railroads are challenged to stay on their SBTi emissions reduction glideslopes
- ▶ Many available technologies exist that are not widely adopted due to uncertainty on fuel savings
- ▶ Locomotive wheel flange stick lubrication offers both fuel savings and wheel / rail reduction benefits
- ▶ A rigorous statistical approach is needed to prove fuel savings with a high degree of certainty
- ▶ Pooled testing / funding efforts for Pueblo testing is recommended to only have to prove it once
- ▶ Don't fall into the trap of “we can't prove it, so it must not save fuel or reduce wheel/rail wear”



CONTACT US



Wayne A. Kennedy
(402) 312-0713
wayne@kennedyconsultant.net



Rob Stevens
(630) 802-7194
rstevens@firstanalytics.com



www.firstanalytics.com



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