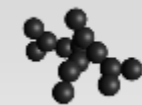


DIESEL PARTICULATE FILTER (DPF) PARTICLE NUMBER MODELLING FOR STAGE V NON ROAD APPLICATIONS

Srikanth Dabbikar, Darren Ellis & Ian Evans

Caterpillar, United Kingdom

28 June 2019



Cambridge Particle Meeting

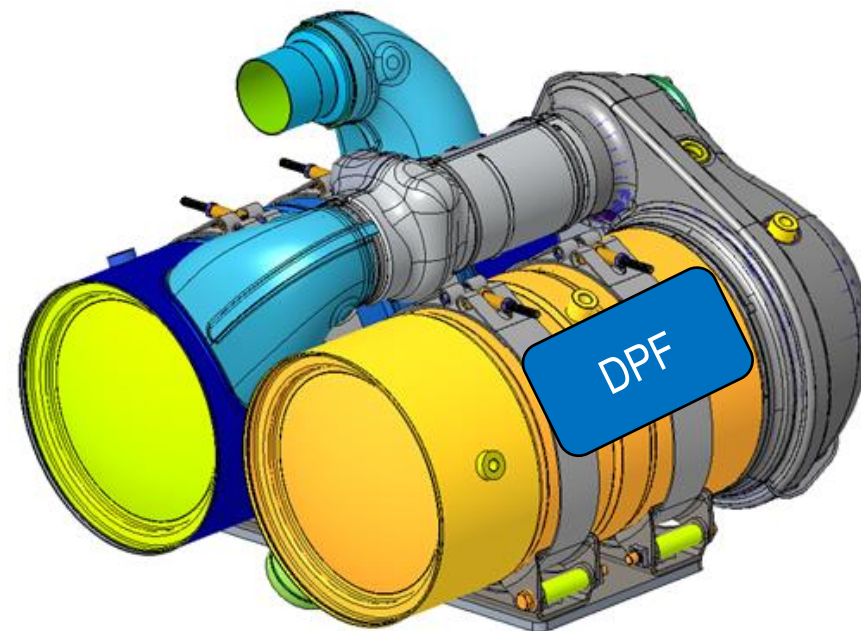
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Particle Matter/ Particle Number (PM/PN) Emissions (Stage V)

PN is introduced as regulated emission for Stage V non road applications



DPF is a best available technology to limit PM/PN



- Stage V legislative limits for non road applications¹

Power range kW	Year	CO	HC	NOx	PM	PN
		g/kWh				1/kWh
56 ≤ P < 130	2020	5	0.19	0.4	0.015	1E+12
130 ≤ P ≤ 560	2019	3.5	0.19	0.4	0.015	1E+12
P > 560	2019	3.5	0.19	3.5	0.045	-

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1. <https://www.dieselnet.com/standards/cycles/nre.php>

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Challenges :Tail Pipe (TP) Particle Number (PN)

- **Understanding Micro phenomena^{2,3}**
 - Soot cake internal characteristics
- **Rapid fluctuations in Engine Speed and Load**
 - DPF mode of operation history i.e. Regen followed by Loading and Regen
 - Cold start and Warm up ⁴
- **NOx Vs Soot constrains**
 - Engine out NOx and Soot have influence on DPF mode of operation i.e. Loading or Regen
- **Higher regen rates⁵**
 - DPF in temperatures >400-450°C leads to Regen thus results into lower filtration efficiency (FE).
- **Legislature protocol**
 - It is mandatory as per the protocol that engine operating points must select randomly for the certification to measure Tail Pipe PN. However, each point has to spend a specific time (minimum of 3mins). Hence,FE can affect with high temps and higher times.
- **TP PN measurement over entire engine operation**
 - It involves significant resources and time to measure TP PN over entire engine operating regime.

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2.SAE 2000-01-1016 Fundamental Studies of Diesel Particulate Filters: Transient Loading, Regeneration and Aging

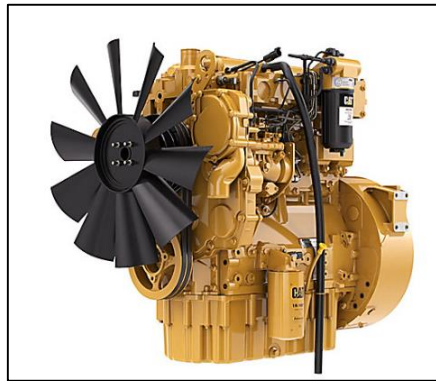
3.SAE 2012-01-0363 Measurement and Prediction of Filtration Efficiency Evolution of Soot Loaded Diesel Particulate Filters

4.SAE 2014-01-1516 An Investigative Study of Sudden Pressure Increase Phenomenon Across the DPF

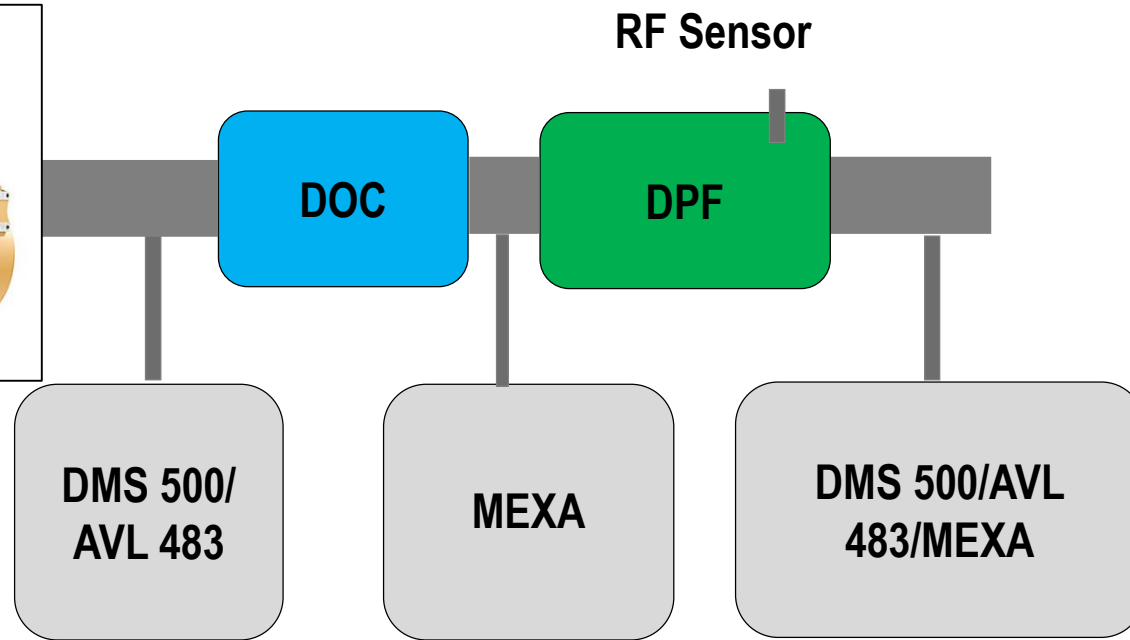
5.Impact of particle number limitations on engine and exhaust aftertreatment layout ,10th International Exhaust Gas and Particulate Emissions Forum

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Test Set up and Measurements



**CAT Production
Intent Stage V
Engine**



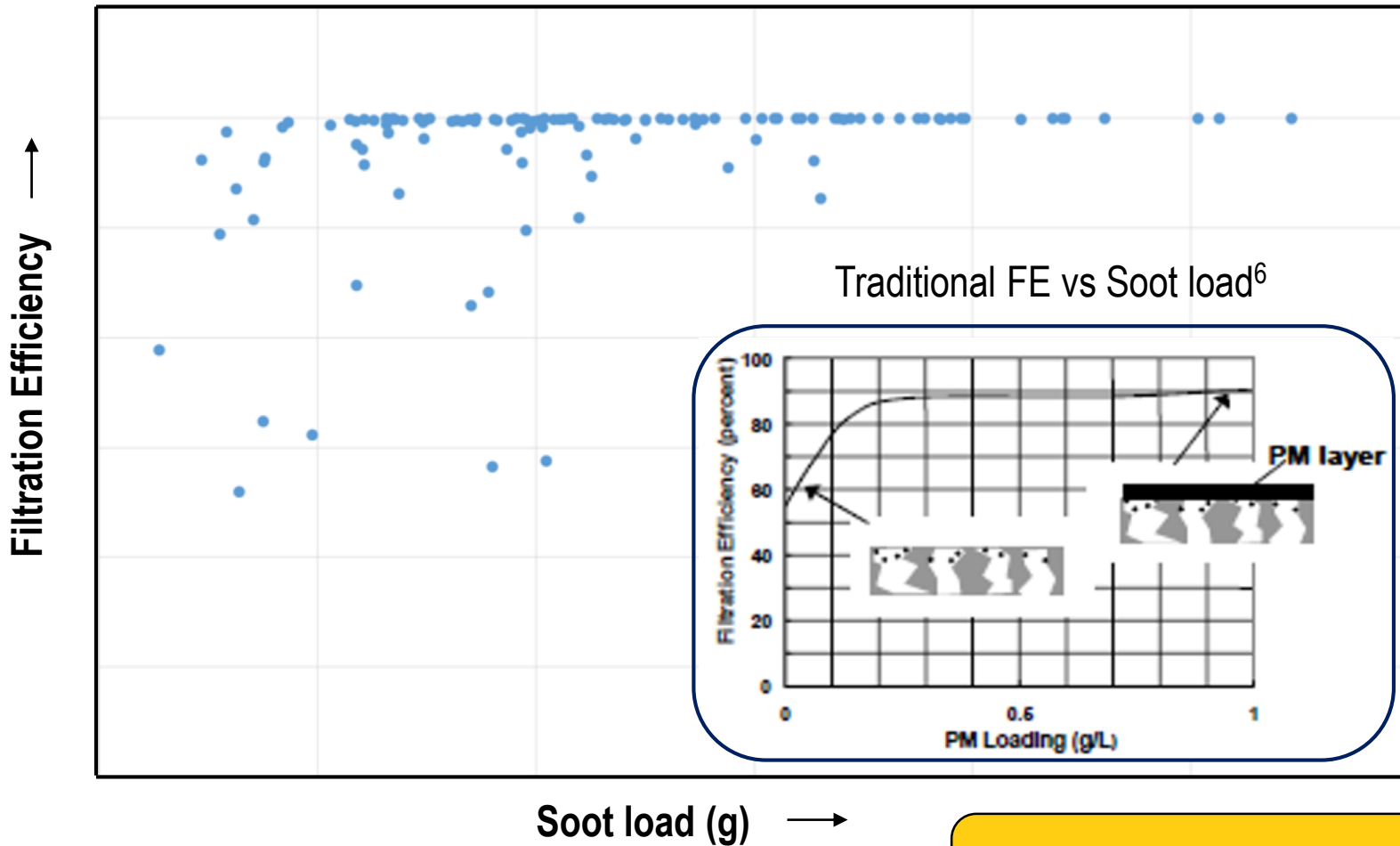
DPF is pre conditioned with different soot loads and tests run with selected engine operating points for each soot loading

Engine out mean particle size variation is not significant across engine operating points from DMS data

Partial after treatment system (Without including SCR) is employed to perform this test work

RF sensor is calibrated with respect to DPF In temperatures and soot loadings ranging low to high

Test Results: Filtration Efficiency (FE) Vs Soot Load



- Filtration Efficiency typically increases with DPF soot load.
- Observed much more scatter in test data than traditional filtration efficiency vs soot load curve.

Maintaining adequate filtration efficiency requires more than having enough soot in the filter

It is important to understand DPF soot cake characteristics and DPF operation history to explain this phenomena

Mathematical modelling can provide a direction to comprehend this test data and provide insights about TP PN over engine operation

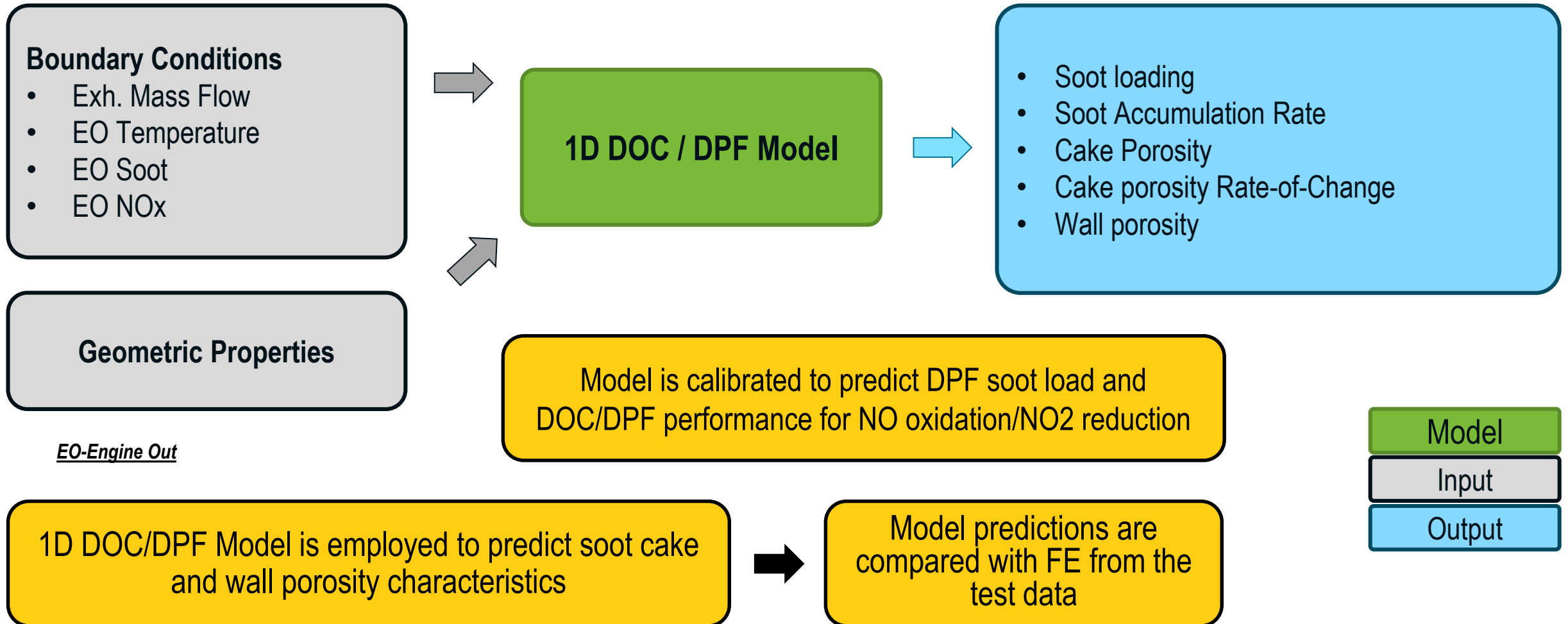
6. SAE 2007-01-0921, Filtration Behavior of Diesel Particulate Filters

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PN Modelling Layout-I

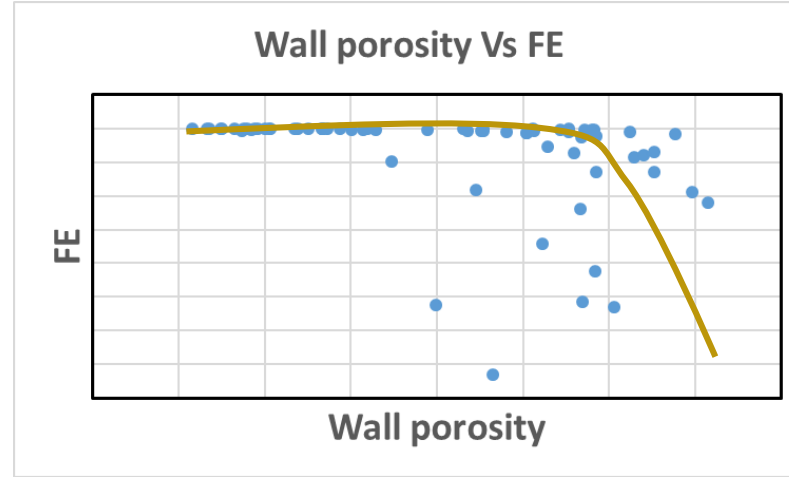
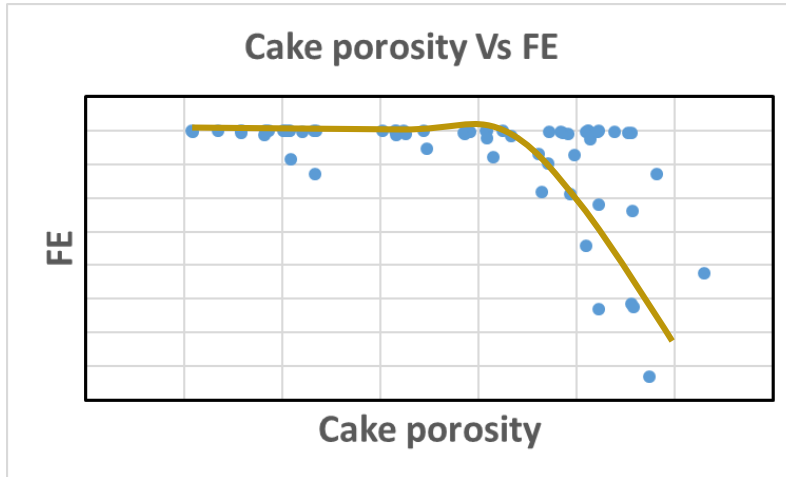
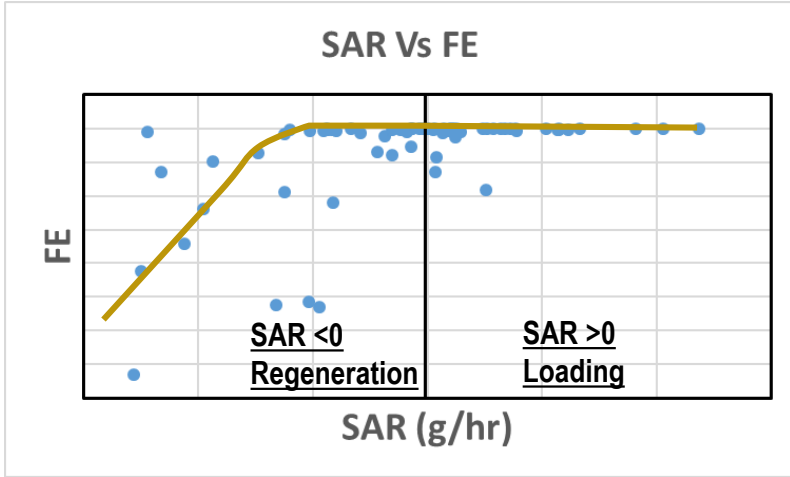


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Model Predictions: Regeneration and Loading



Soot Balance over DPF⁷

$$\frac{d(SL)}{dt} + (SL)(K) - (FE)(DPF_{in,Soot})$$

$$\frac{d(SL)}{dt} = \text{Soot Accumulation Rate (SAR)}$$

$SL = \text{Soot Load}$

$K = \text{Passive oxidation constant}$

$FE = \text{Filtration Efficiency}$

$DPF_{in,Soot} = \text{DPF In Soot}$

DPF Operation Modes

$$\frac{d(SL)}{dt} > 0 \text{ Loading}$$

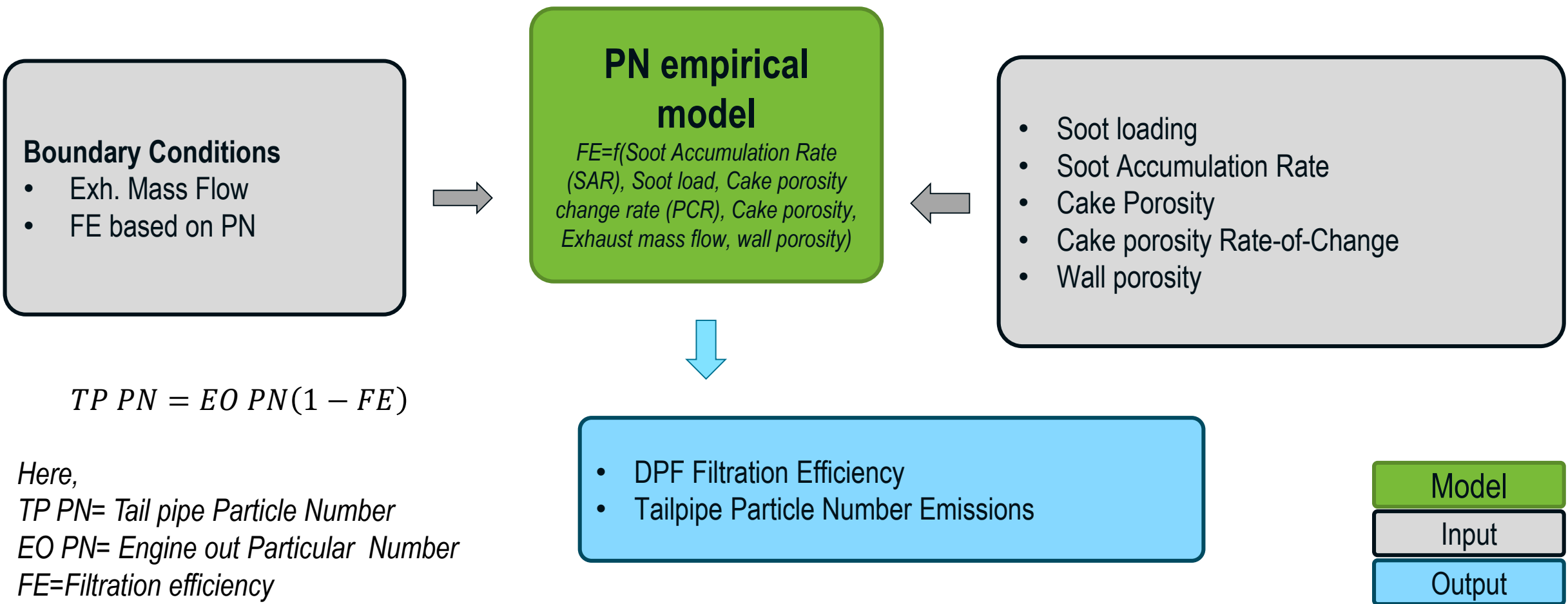
$$\frac{d(SL)}{dt} < 0 \text{ Regeneration}$$

$$\frac{d(SL)}{dt} = 0 \text{ Balancing}$$

Imaginary lines are drawn to show non linear behaviour of FE with SAR , cake and wall porosity

FE=function(SAR, Exhaust mass flow, PCR, Soot Load , Cake porosity, Wall porosity)

PN Modelling Layout-II

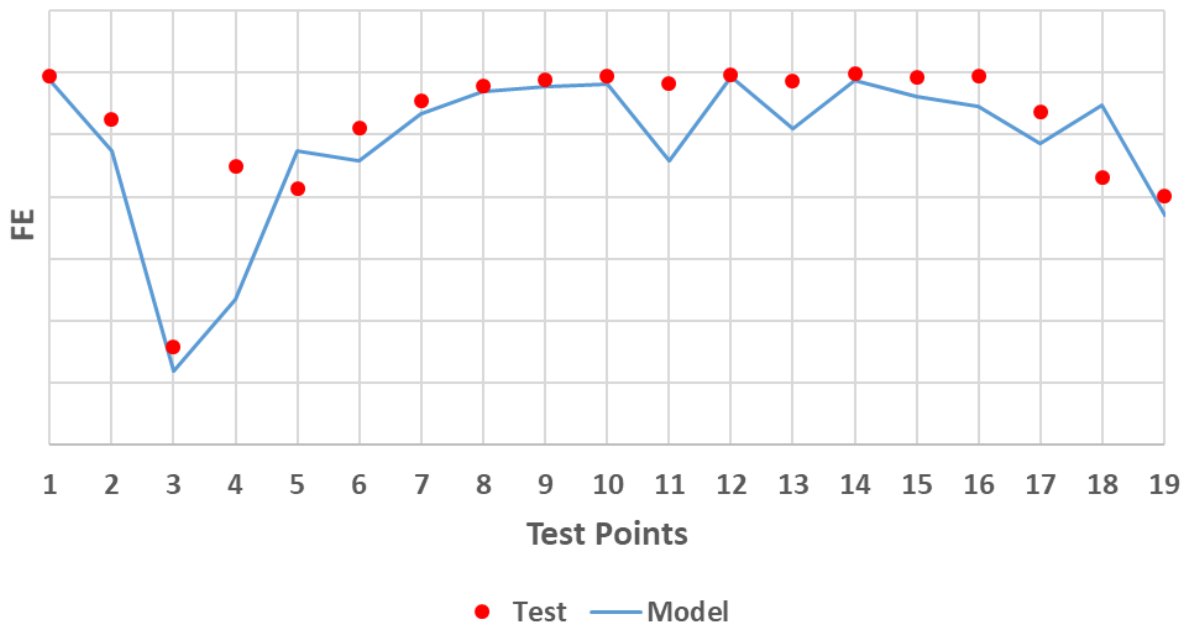


$$TP\ PN = EO\ PN(1 - FE)$$

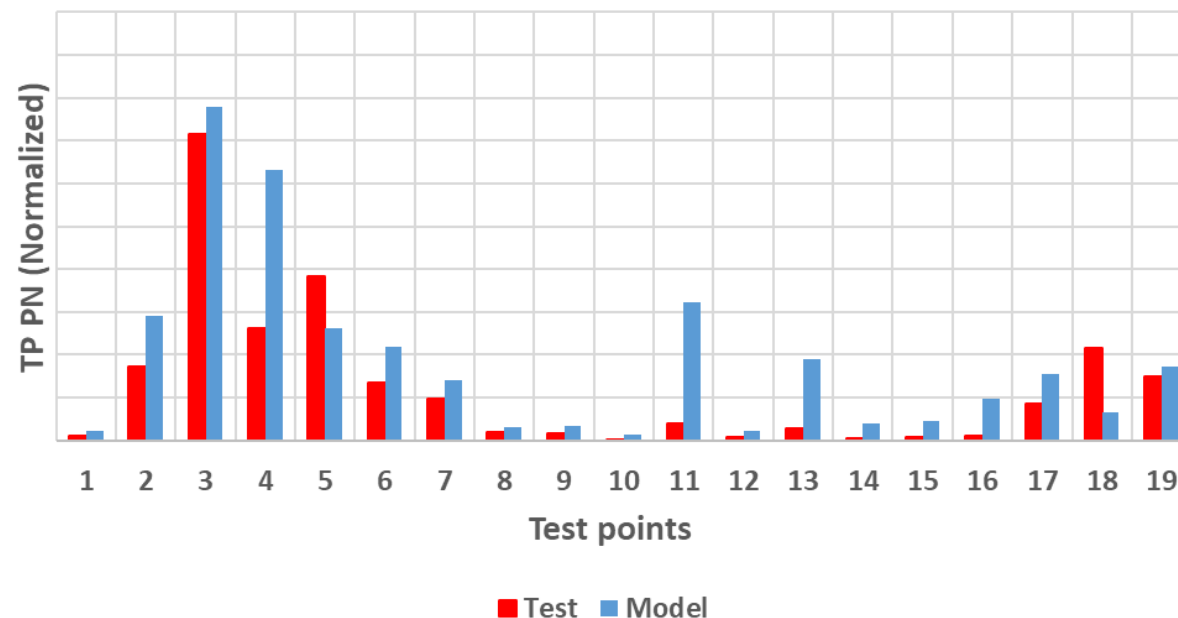
Here,
 TP PN= Tail pipe Particle Number
 EO PN= Engine out Particular Number
 FE= Filtration efficiency

PN Model Predictions (Validation Studies)

Comparison studies for FE between Model and Test



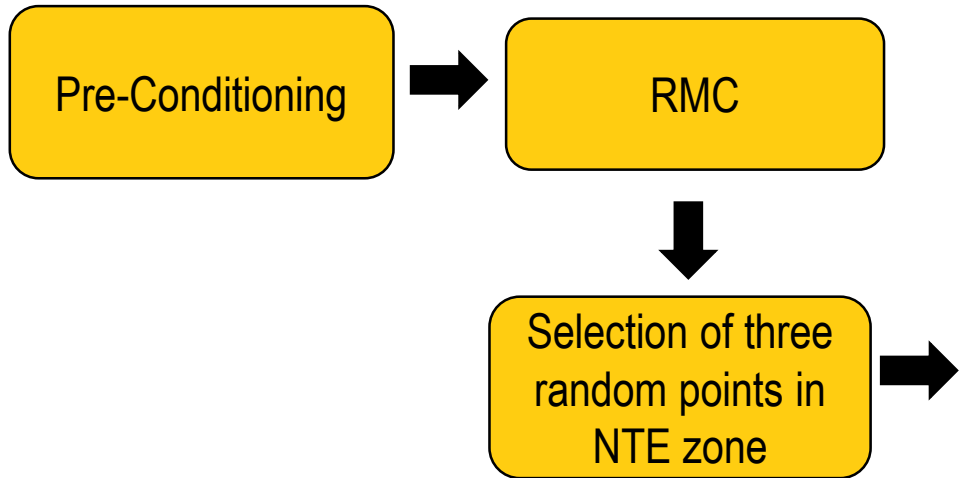
Comparison studies for TP PN between Model and Test



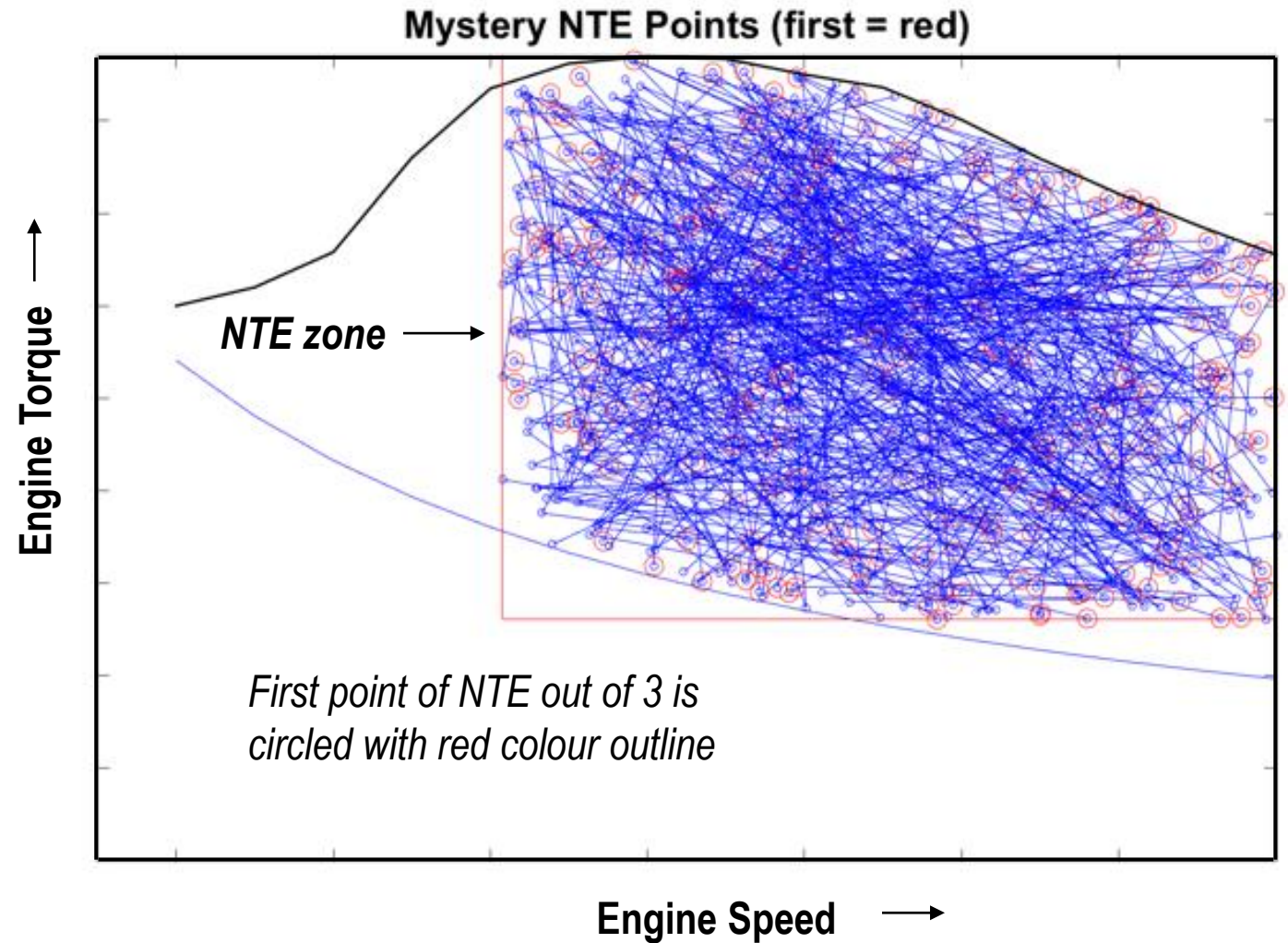
Model predictions are correlated with test data. However, it could not predict low TP PN observed during DPF regeneration.

Random Point Selection: TP PN Estimation

- Legislation Protocol

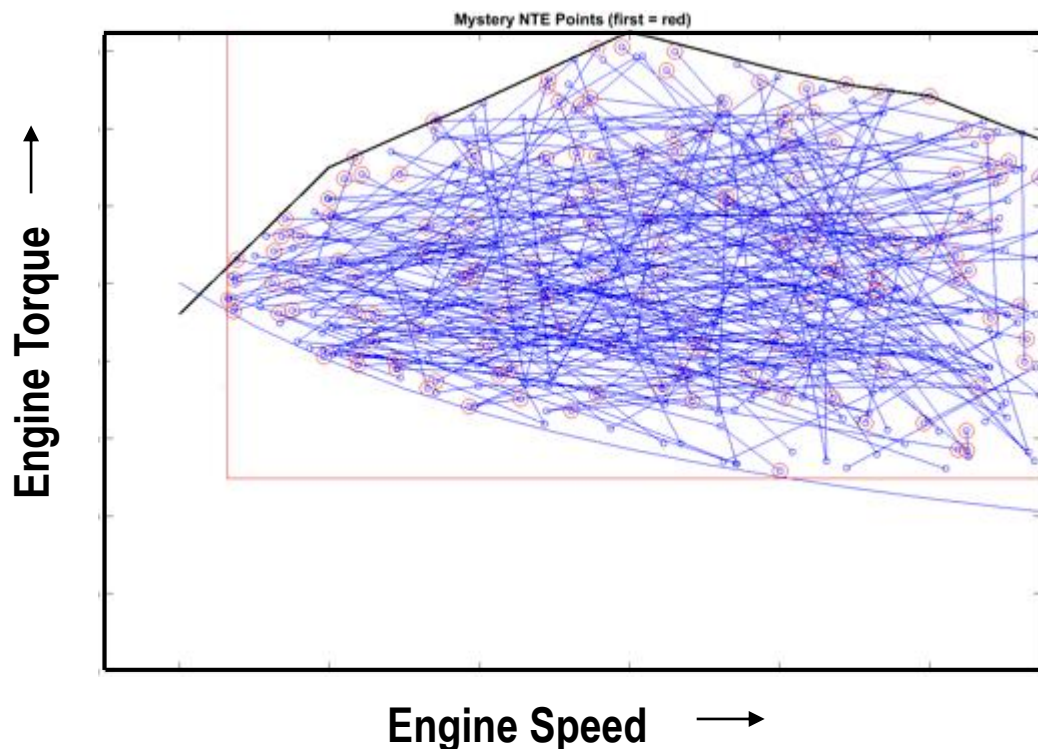


CAT Production Intent Stage V Engine is selected for random point generation and PN is predicted over NTE zone.



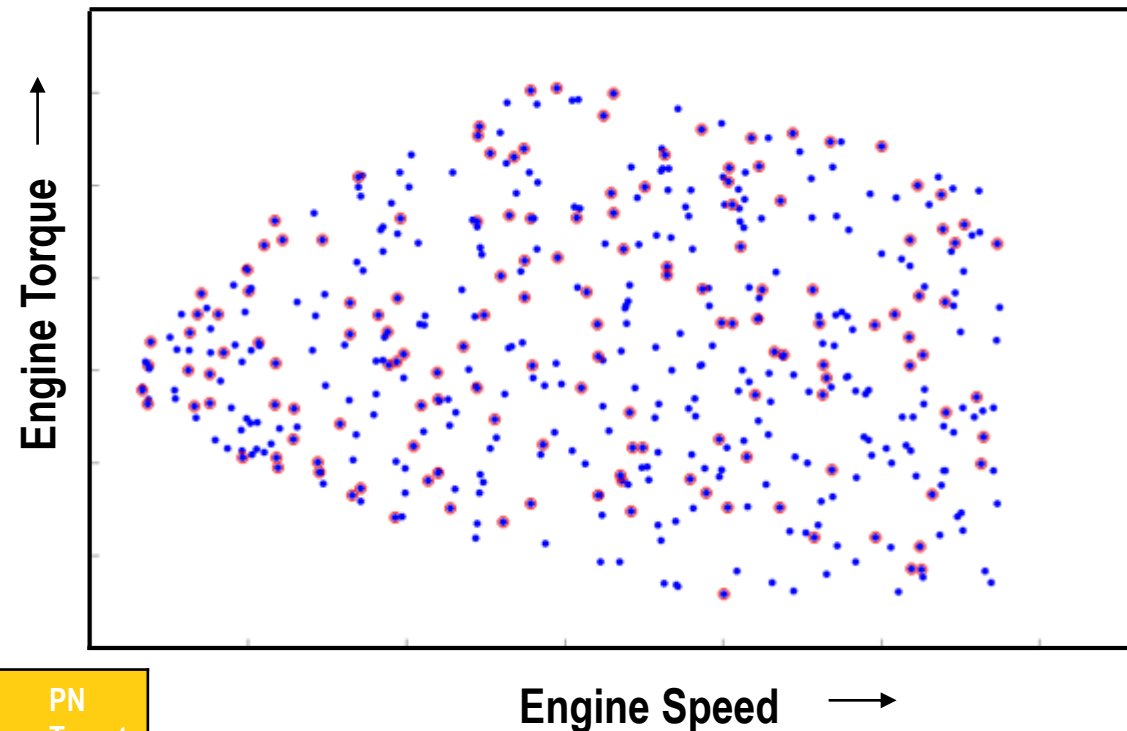
TP PN Predictions – CAT Production Intent Stage V Engine

NTE Random Points



Model predictions confirms that all NTE points are within the target. Test studies also confirmed the same behaviour.

TP PN Pass/Fail Chart



Probability To pass	PN Target
1 st Point	1
2 nd Point	1
3 rd Point	1

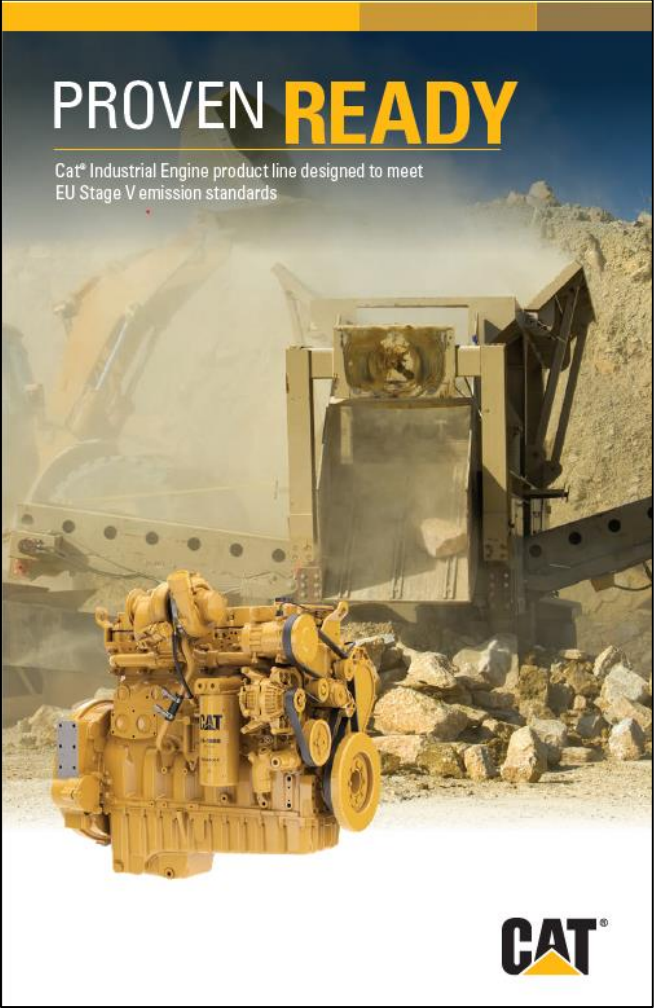
Legend:

- NTE FAIL
- NTE PASS
- NTE Point 1 of 3

Summary

- It is observed from this work that having enough soot load and engine NOx/Soot is not sufficient to maintain high FE to lower TP PN.
- It is found that soot cake porosity, DPF soot load, soot accumulation rate and rate of change in cake porosity are key parameters to affect FE and TP PN.
- Based on these observations, empirical model is developed, and it is found that predictions are well correlated with the test data.
- Model does have certain limitations, specifically it could not predict low TP PN observed during DPF regeneration.
- TP PN is estimated across different engines over NTE zones and found that PN is with in the target.

We Are Ready for Stage V



PROVEN READY

Cat® Industrial Engine product line designed to meet EU Stage V emission standards

CAT



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YOUR SOLUTIONS
ARE READY.**

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THANK YOU

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