



Aleksander Zborowski, PhD. Eng.

DIGITALIZATION AUTOMATION & ARTIFICIAL INTELLIGENCE

AN OPPORTUNITY FOR TECHNOLOGICAL ACCELERATION
TOWARD SUSTAINABLE HIGHWAY ENGINEERING



DIGITALIZATION ARTIFICIAL INTELLIGENCE & AUTOMATION

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01 SUSTAINABLE HIGHWAY ENGINEERING



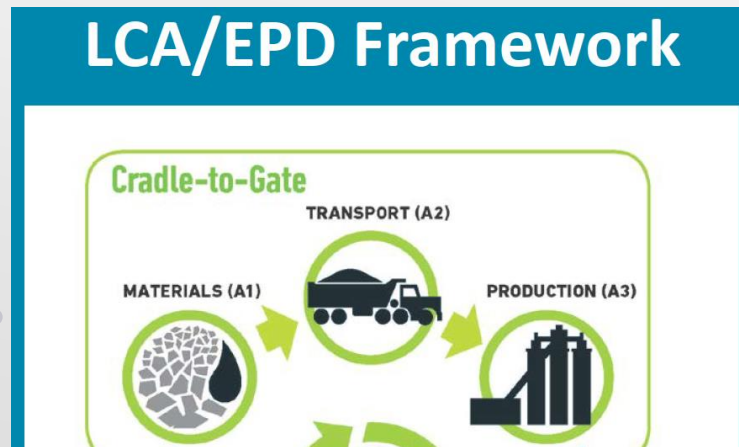
SUSTAINABLE HIGHWAY ENGINEERING

CHALLENGES

- EXTENTION OF LIFECYCLE
- REDUCTION OF ENVIRONMENTAL IMPACT
- CIRCULARITY
- ADAPTATION TO CLIMATE CHANGE - RESILIENT INFRASTRUCTURE

COST AND ENVIRONMENTAL IMPACT OF INFRASTRUCTURE CONTRACTS

CRADLE-TO-GATE ANALYSES ARE NECESSARY BUT NOT SUFFICIENT



COST AND ENVIRONMENTAL IMPACT OF INFRASTRUCTURE CONTRACTS

ONLY FULL LIFE CYCLE ASSESSMENTS ARE CORRECT



CONSTRUCTION WORKS LIFE CYCLE INFORMATION											
A1 - A3			A4 - A5		B1 - B7						
PRODUCT STAGE			CONSTRUCTION PROCESS STAGE		USE STAGE						
A1	A2	A3	A4	A5	B1	B2	B3	B4	B5	B6	B7
Raw material supply	Transport	Manufacturing	Transport	Construction - Installation process	Use	Maintenance	Repair	Replacement ¹	Refurbishment	Operational energy use	Operational water use
scenario	scenario	scenario	scenario	scenario	scenario	scenario	scenario	scenario	scenario	scenario	scenario
C1 - C4											
END OF LIFE STAGE											
C1	C2	C3	C4								
Deconstruction demolition	Transport	Waste processing	Disposal								
scenario	scenario	scenario	scenario								

- 20-50 years of exploitation
- Maintenance, repairs, rehabilitations
- Traffic delay cost

A RECIPE FOR DURABLE, COST-EFFECTIVE AND SUSTAINABLE HIGHWAY ENGINEERING

OPTIMAL PAVEMENT STRUCTURE DESIGN

- ✓ Longevity of pavement construction achieved through careful mechanistic analysis
- ✓ Increased structural performance - less, but better quality
- ✓ Balanced development of all pavement layers




HIGHER PRODUCTION AND CONSTRUCTION QUALITY

- ✓ Increased quality of production and workmanship through process automation and prediction of results
- ✓ Stricter adherence to the technological regime and recommendations through machine automation and process coordination

PROPER MATERIALS AND TECHNOLOGIES

- ✓ Materials better tailored to function and role in pavement
- ✓ Higher mechanical performance
- ✓ Innovative materials and technologies
- ✓ More use of local and recycled materials



*We have already done a lot on this issue as
an industry, academia and administration
but we need to accelerate the validation
and implementation of new solutions*

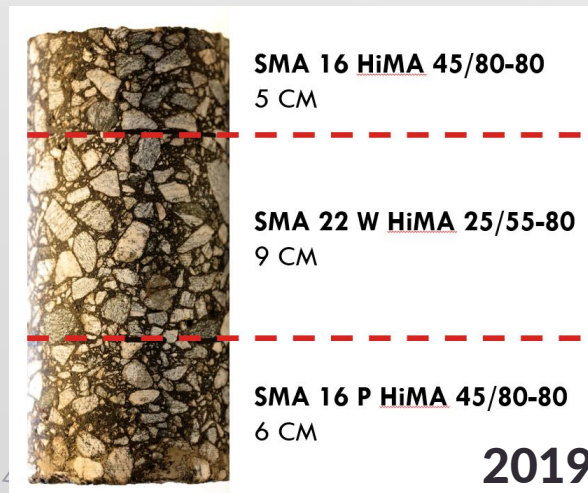
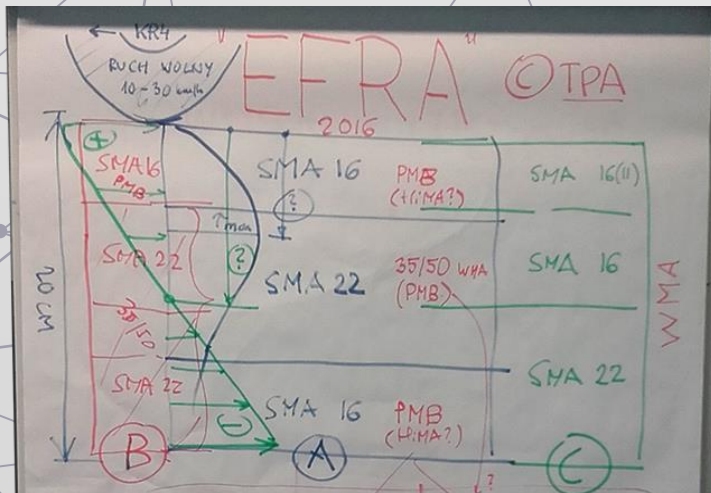
Just a few examples...

HIGH-PERFORMANCE PAVEMENTS 2015-2019

FLEXIBLE PERPETUAL PAVEMENT



FULL SMA Heavy Duty Pavement EFRA - LOTOS



HIGH-PERFORMANCE PAVEMENTS 2022



High-performance Asphalt Pavements – adapting for future road networks



EAPA Technical Review

3.5 New concepts for pavement structures

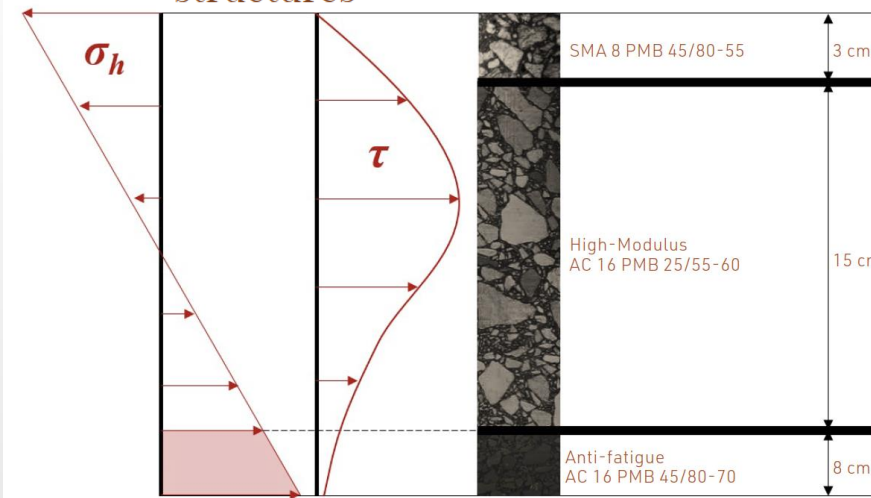


Figure 6. New pavement structure configuration incorporating anti-fatigue layer

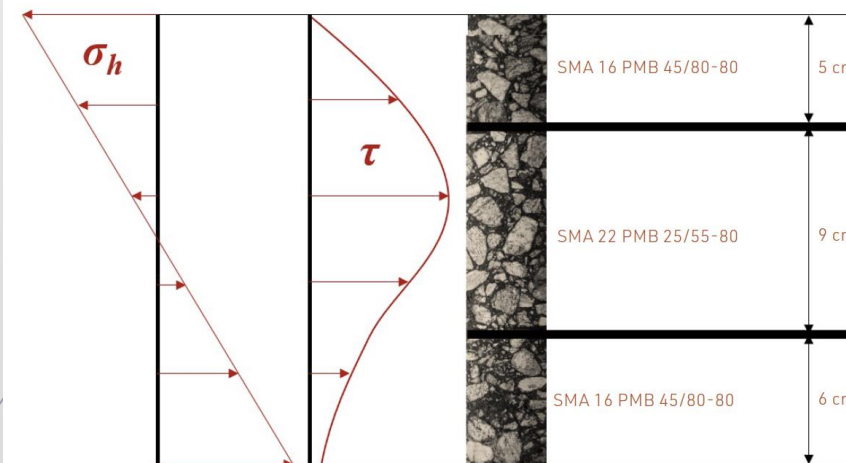
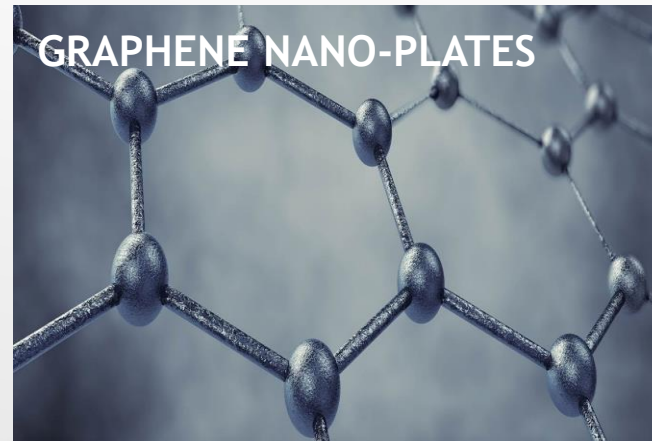


Figure 7. Triple-SMA pavement structure configuration

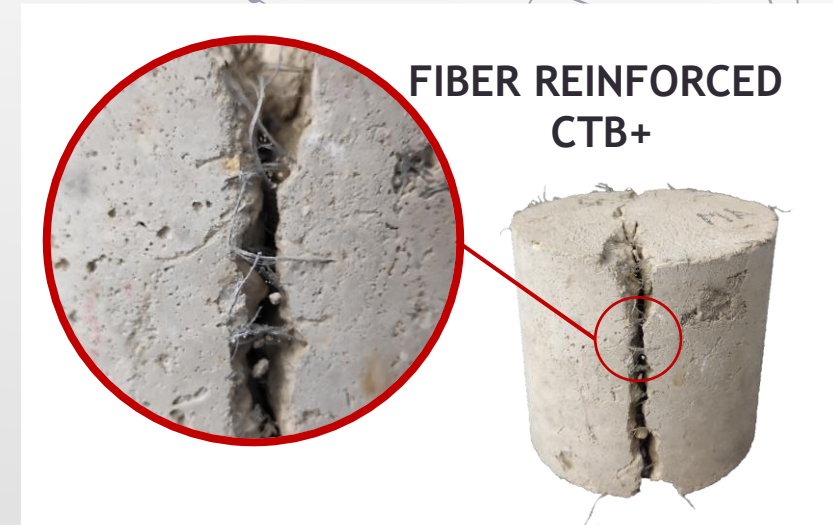
PROPER MATERIALS AND TECHNOLOGIES

INNOVATIVE, HIGH-PERFORMANCE, TAILOR-MADE MATERIALS



PROPER MATERIALS AND TECHNOLOGIES

INNOVATIVE, HIGH-PERFORMANCE, TAILOR-MADE MATERIALS

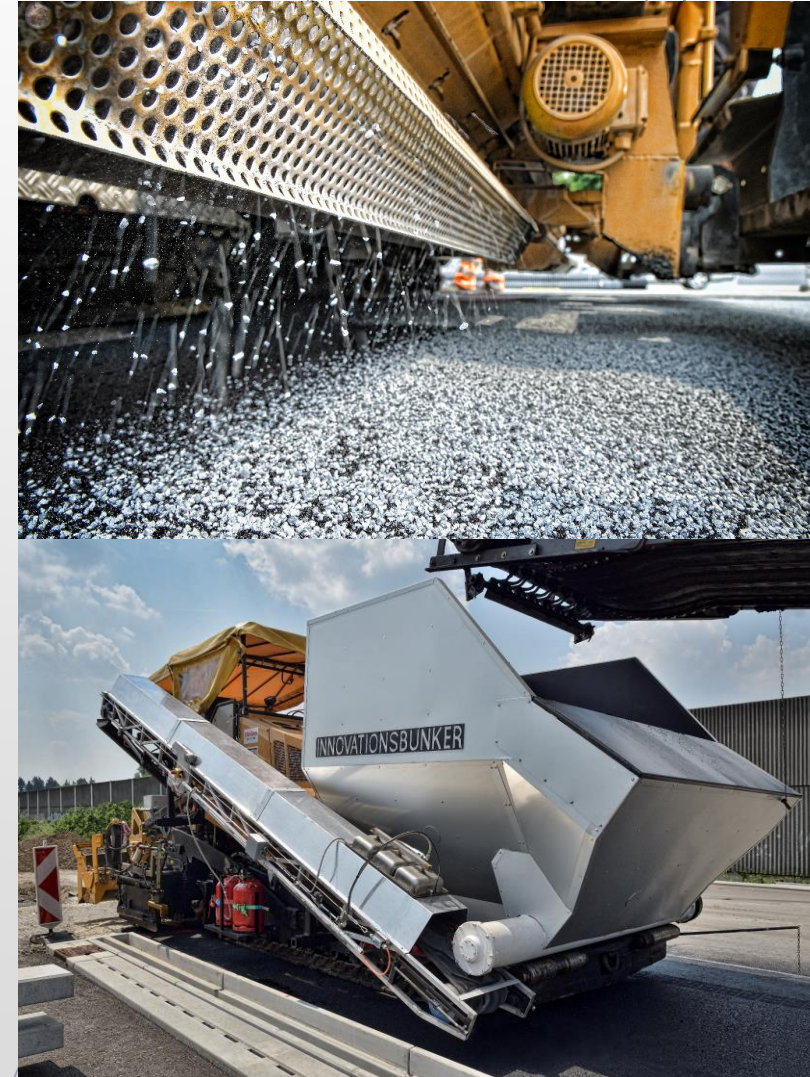


SUPERIOR CONSTRUCTION TECHNOLOGIES

KOMPAKTASPHALT



SPREADER INTEGRATED WITH PAVER



ADVANCED LAB AND FIELD TESTS FOR QC

E* Dynamic Stiffness Modulus, SVECD



DSR for G*, MSCR, LAS



PQI - nondestructive layer compaction



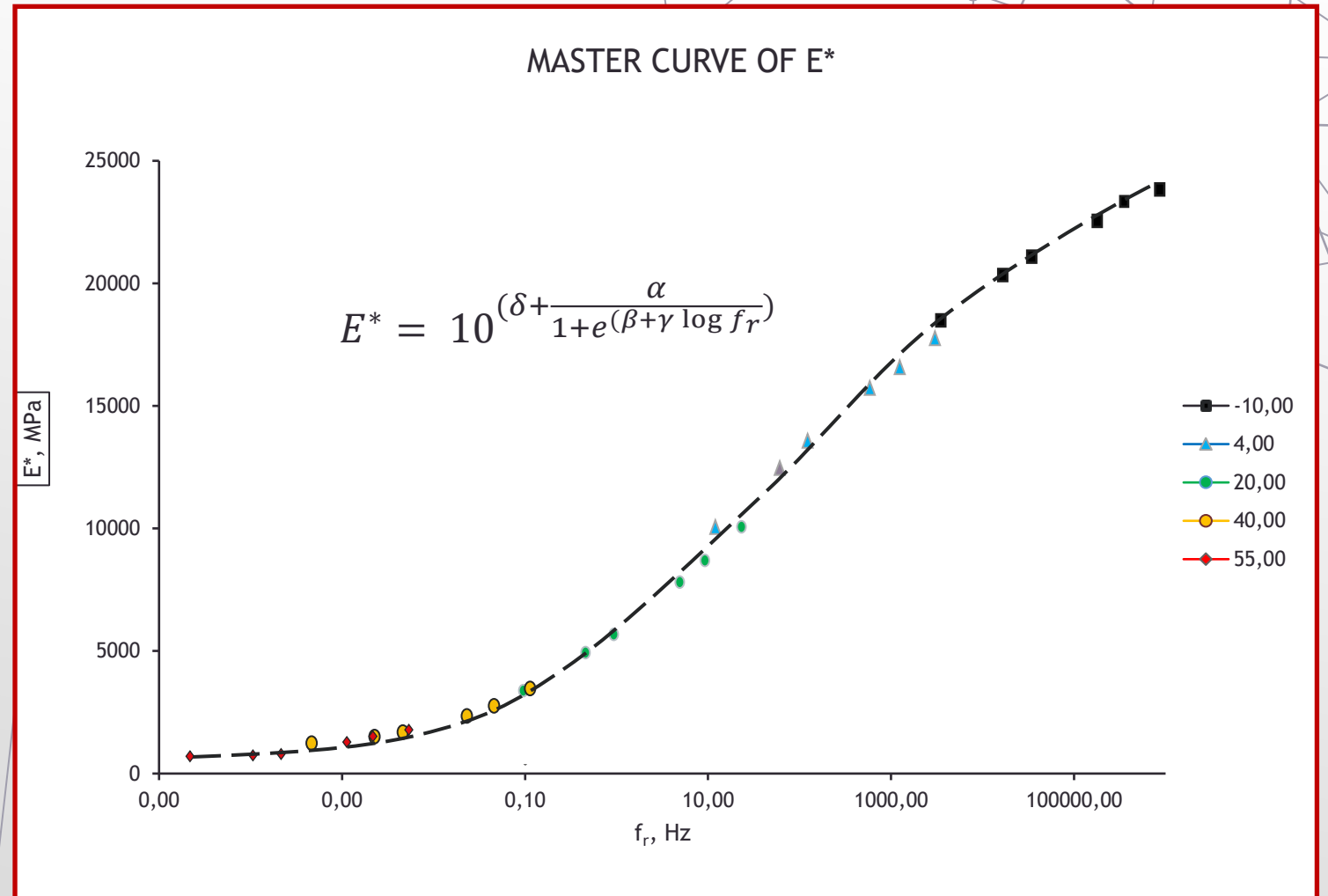
FTIR - laser spectrometry



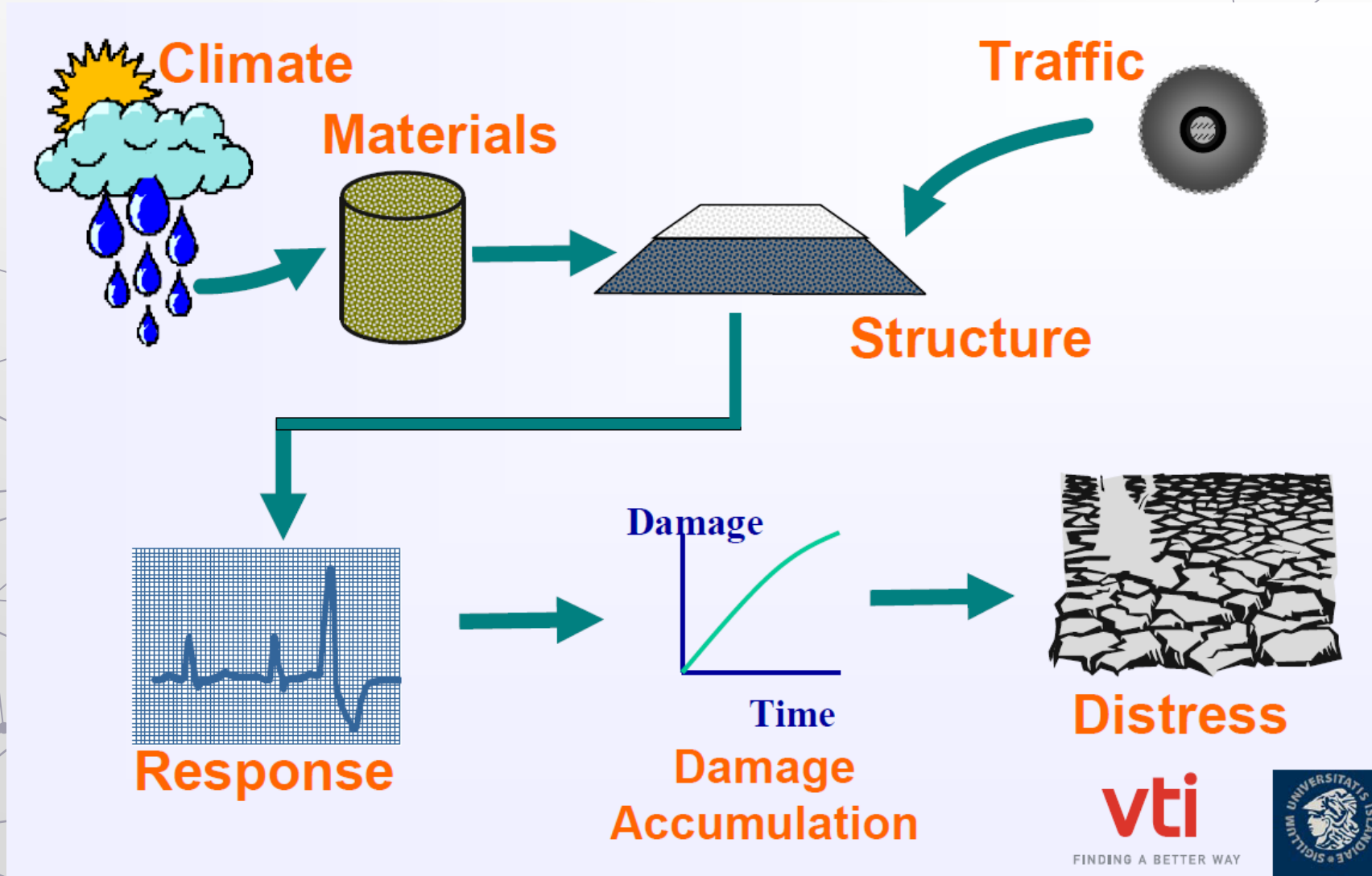
MIT-Scan T2 - nondestructive layer thickness



E* DYNAMIC STIFFNESS MODULUS

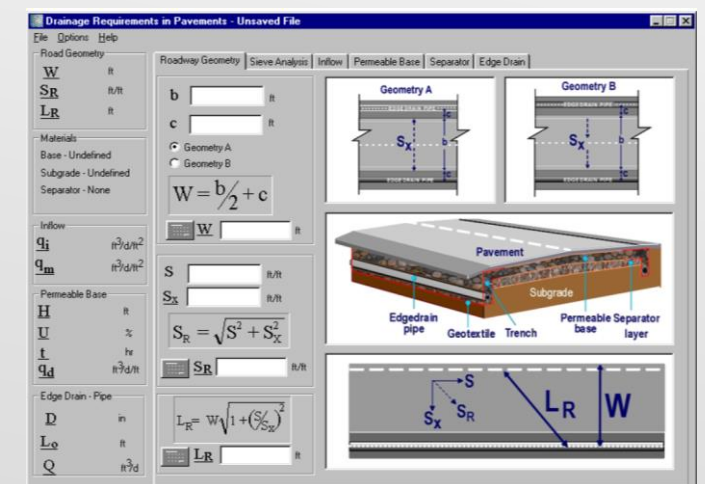
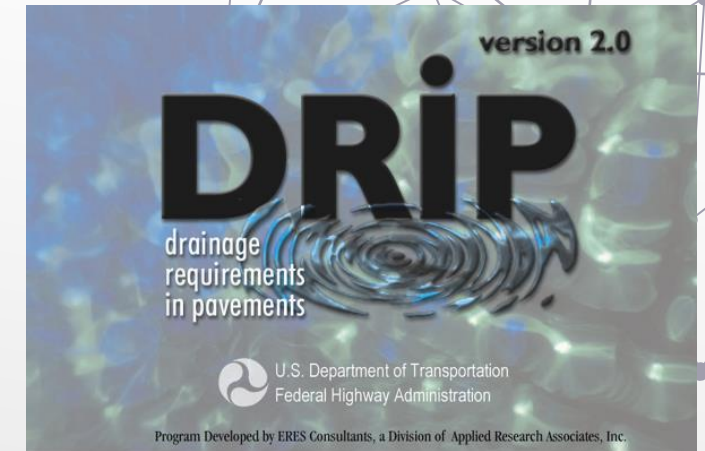
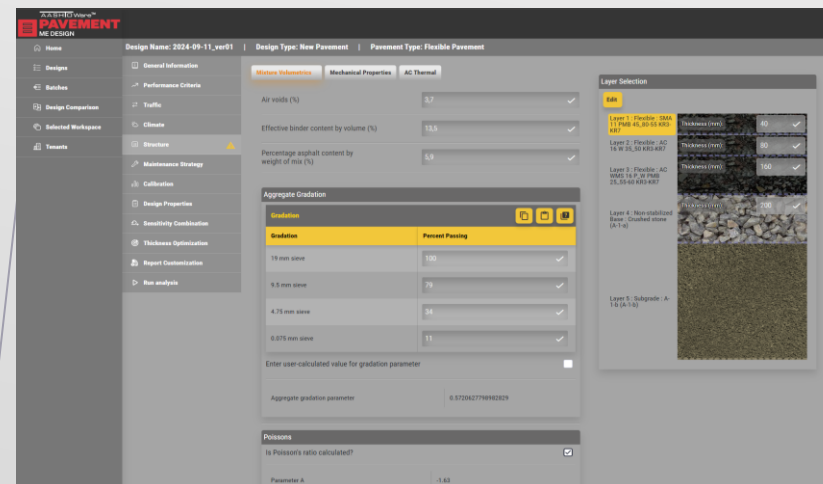
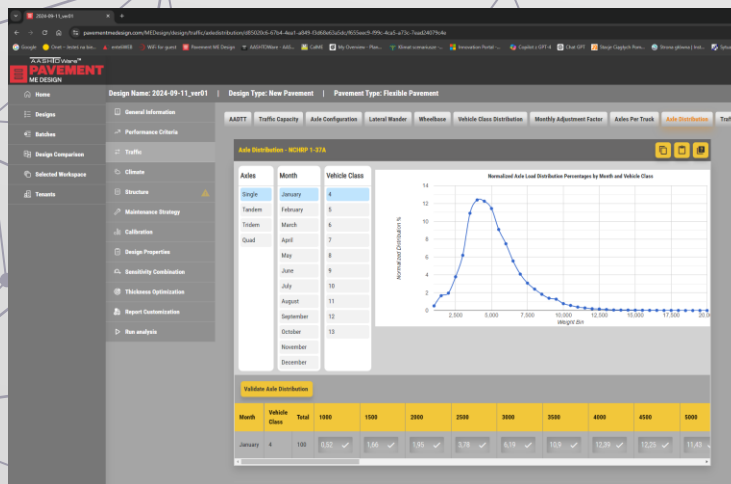
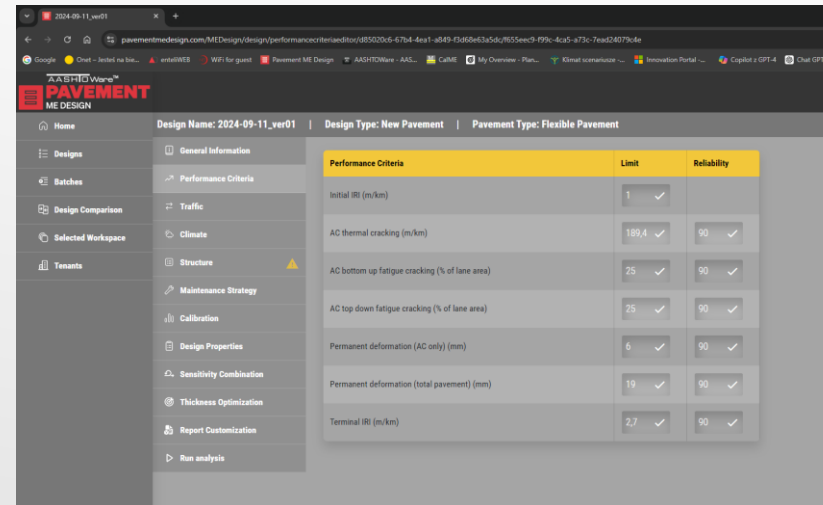
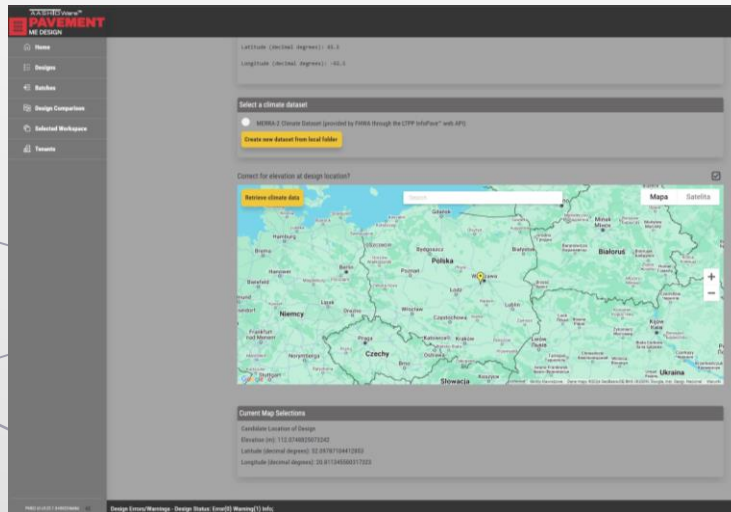


MECHANISTIC-EMPIRICAL ANALYSIS METHODS



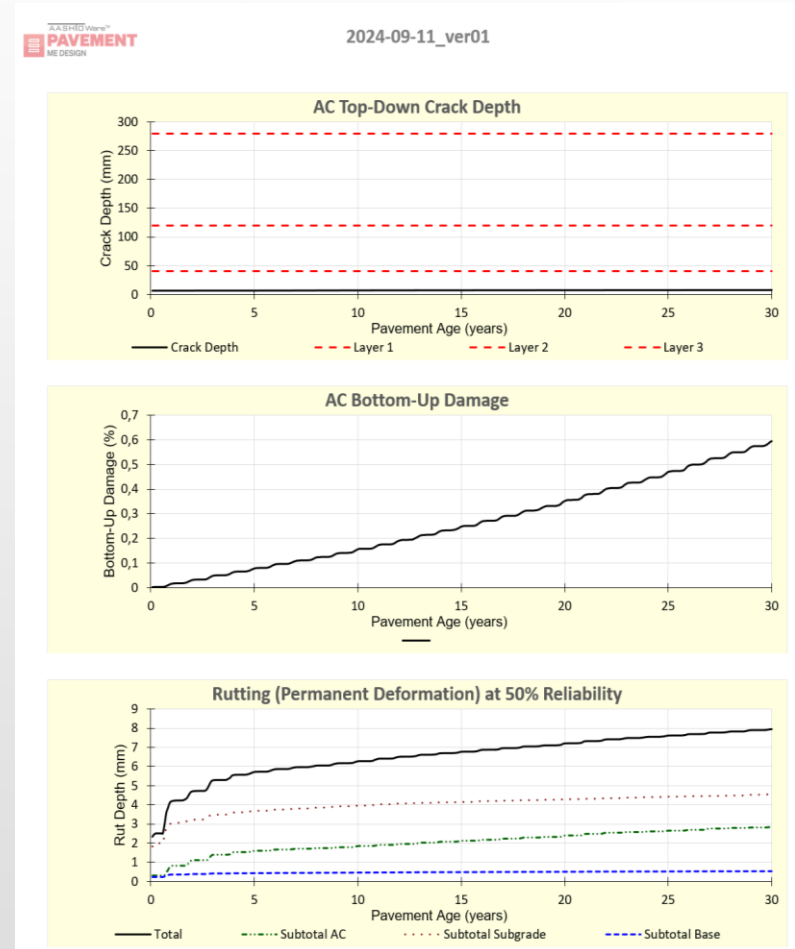
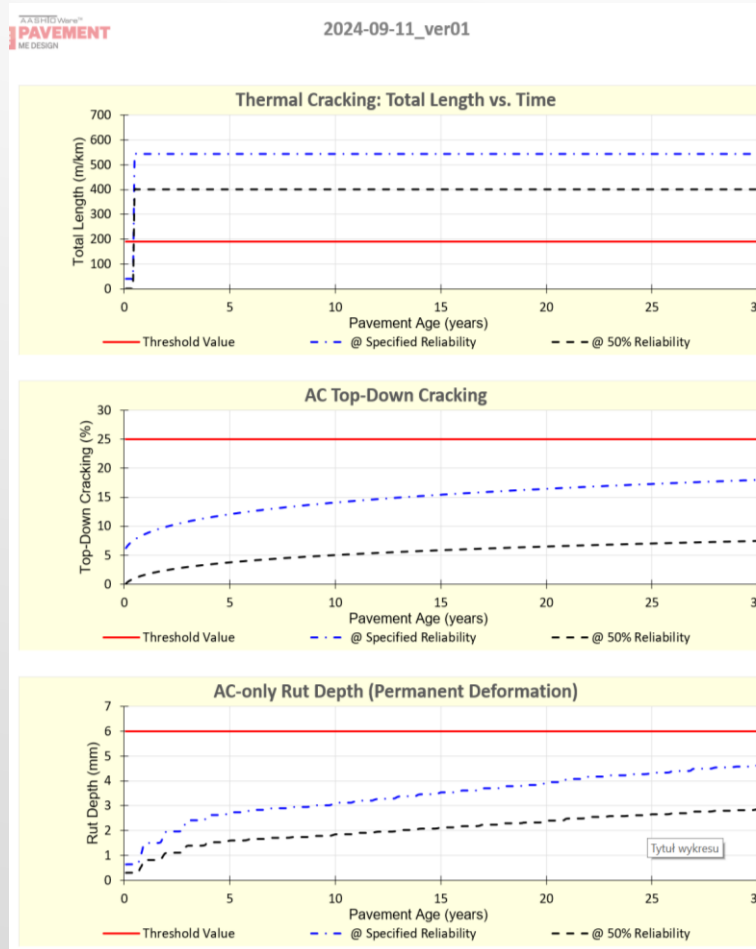
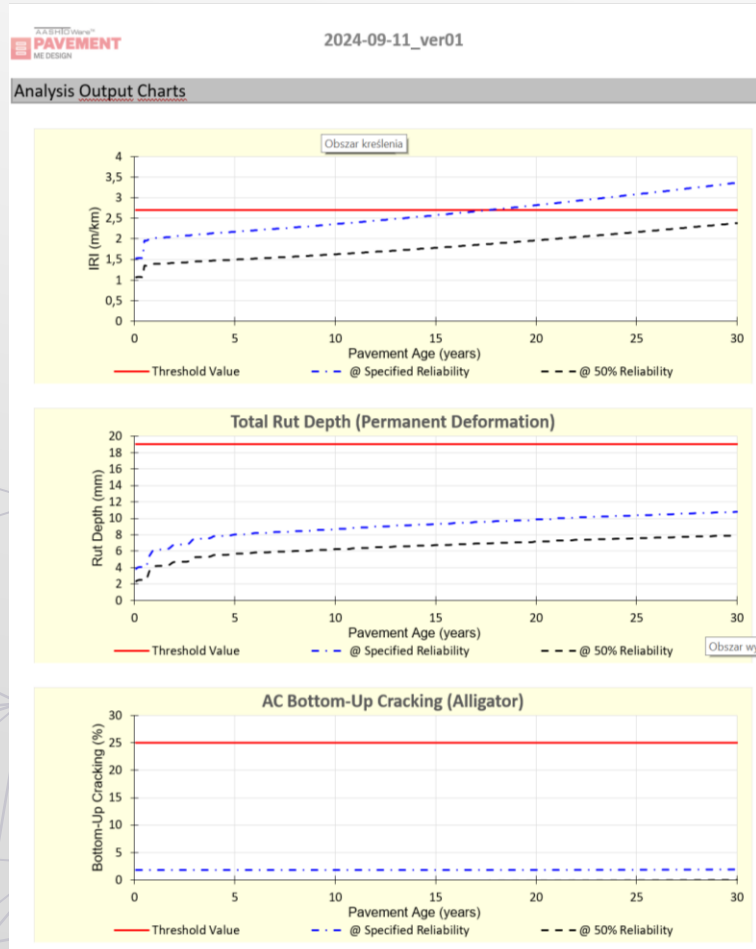
MECHANISTIC-EMPIRICAL ANALYSIS METHODS

AASHTOWare Pavement ME



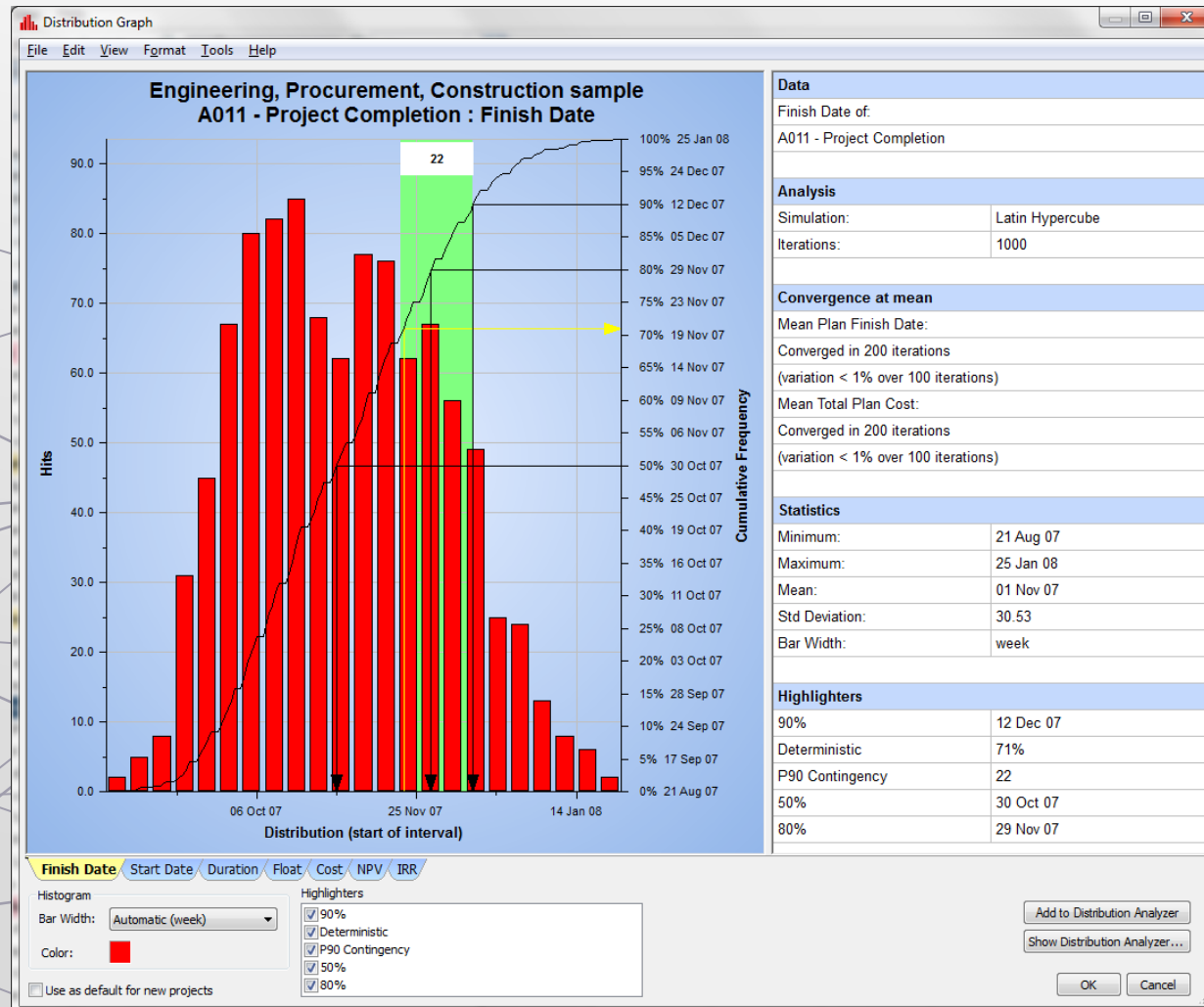
MECHANISTIC-EMPIRICAL ANALYSIS METHODS

MULTICRITERIA RESULTS OVER A FULL LIFECYCLE



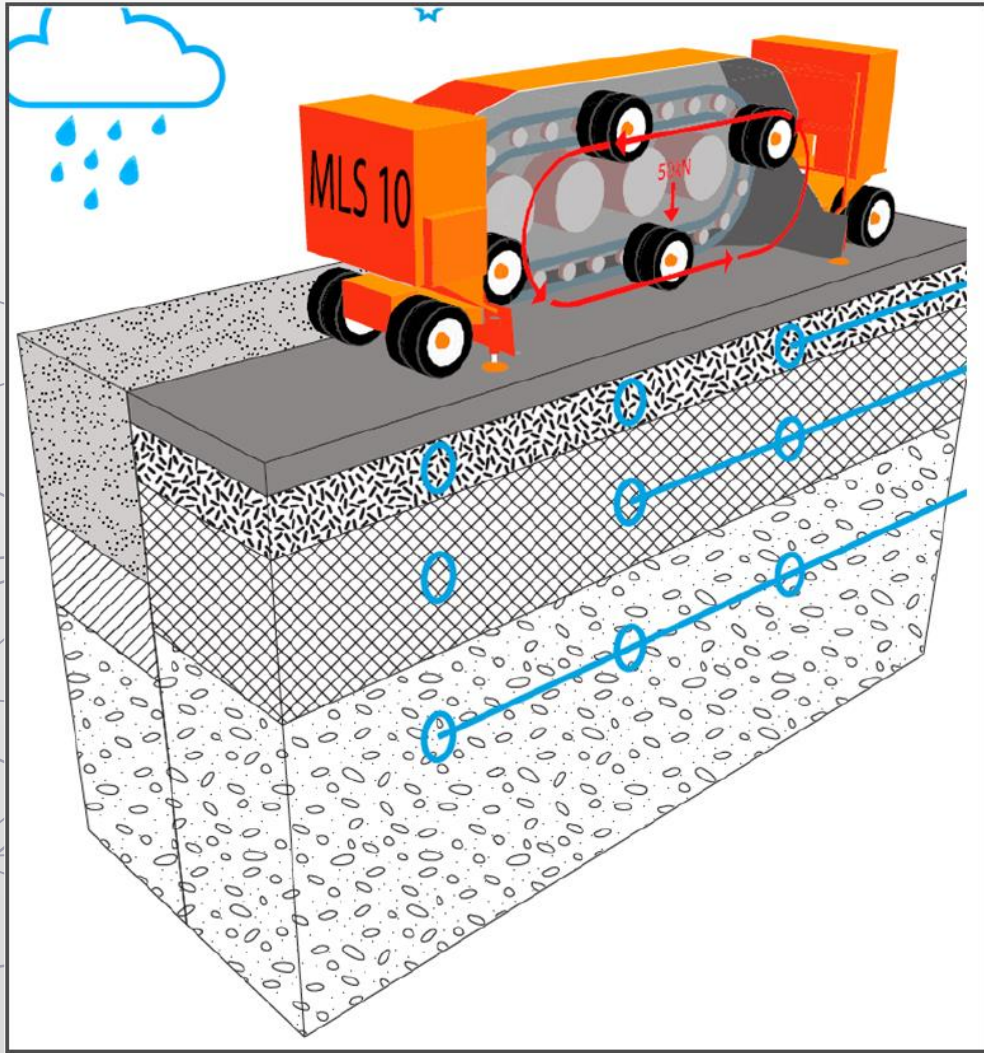
PROBABILISTIC ANALYSIS AND PREDICTION

MONTE CARLO METHOD

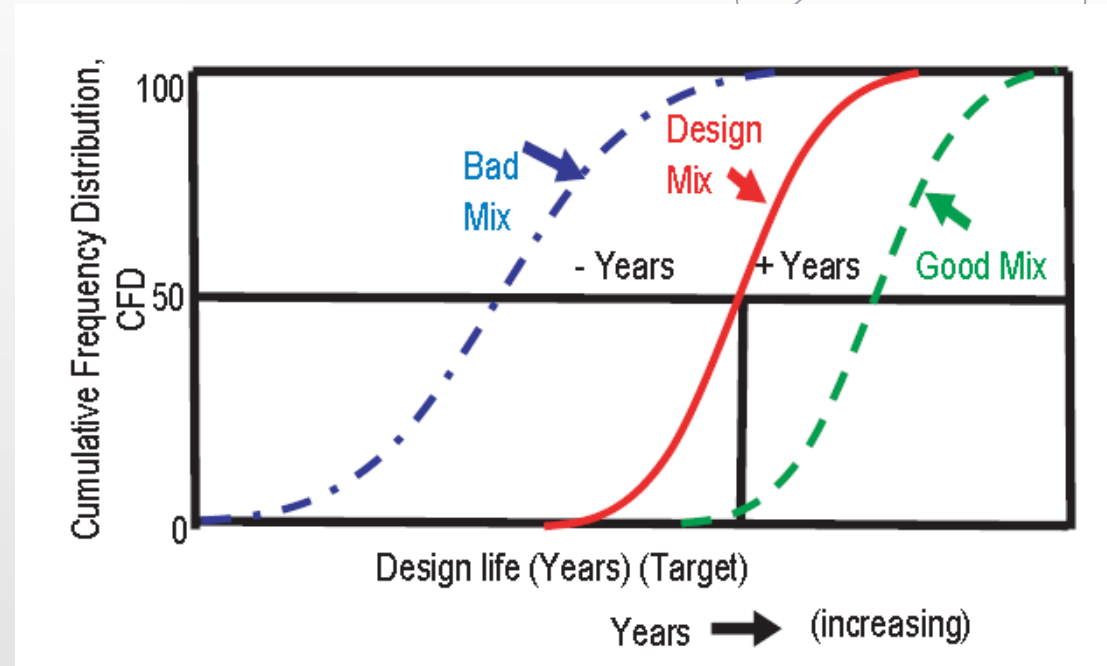
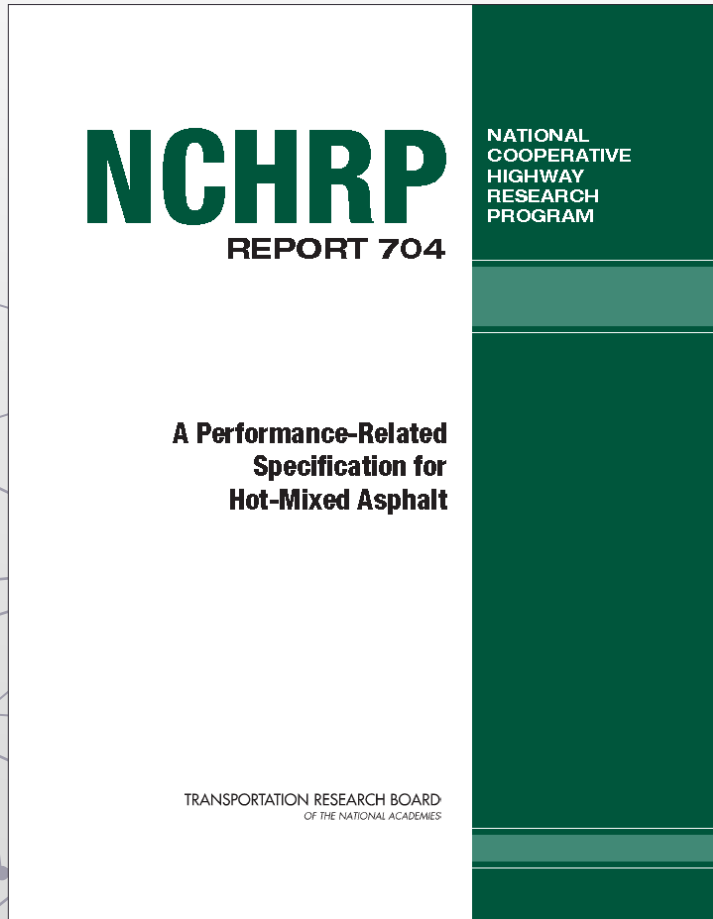


MOBILE LOAD SIMULATORS

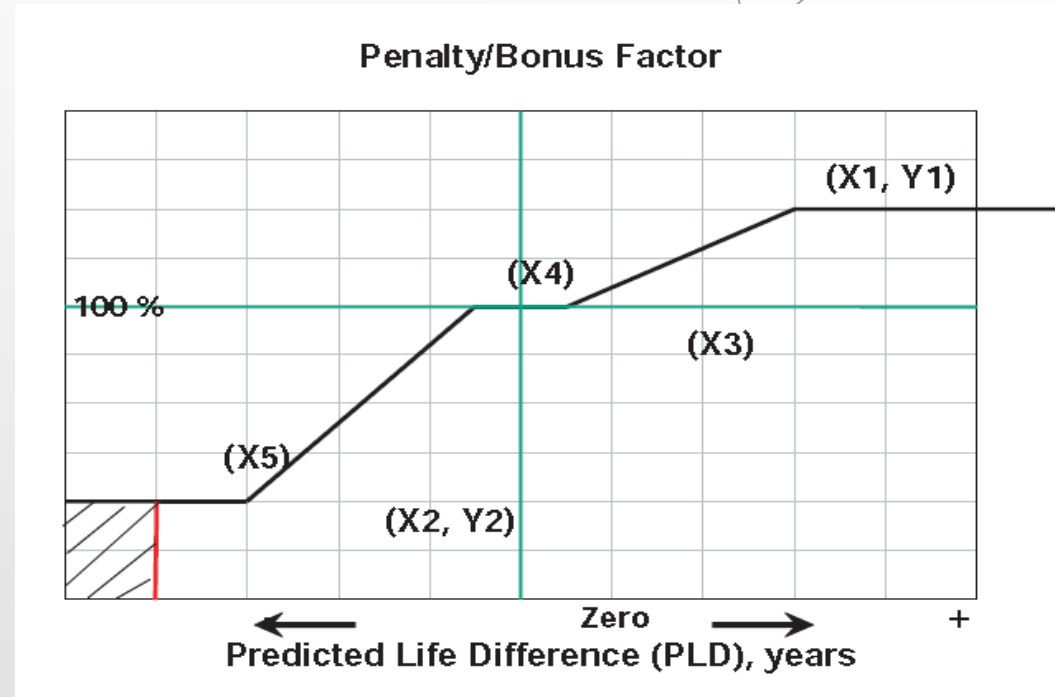
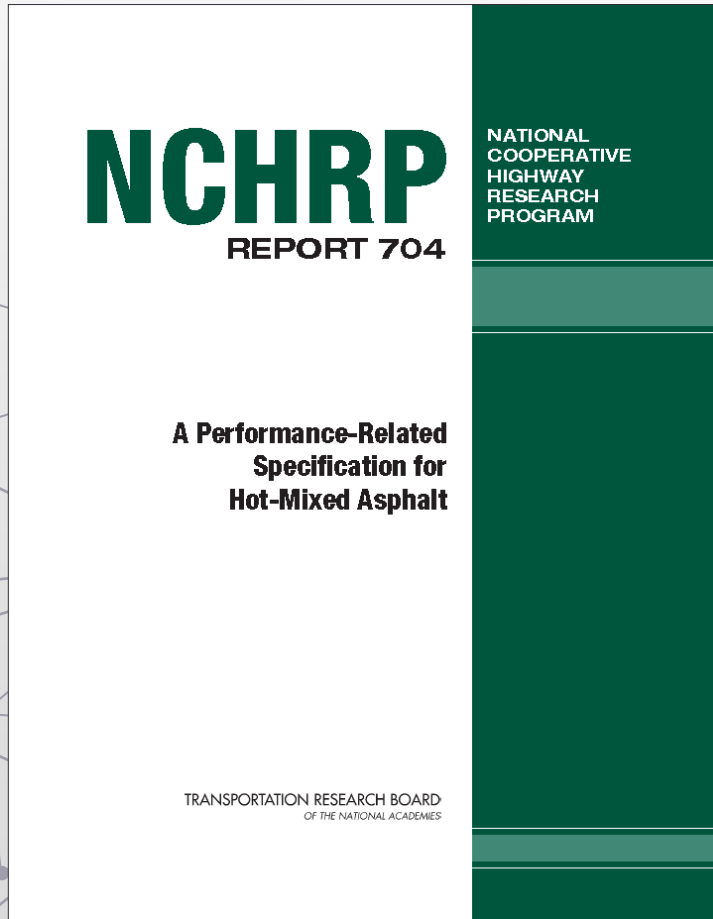
FULL SCALE ACCELERATED ROAD TEST FOR VERIFICATION AND VALIDATION



PERFORMANCE RELATED SPECIFICATIONS



PERFORMANCE RELATED SPECIFICATIONS





02

DIGITALIZATION FIRST

The background features a light gray gradient with abstract geometric patterns. On the left and right sides, there are complex networks of thin gray lines connecting small dark gray dots, resembling a digital or molecular structure. Several simple gray triangles of various sizes are scattered across the background, particularly in the upper and lower portions.

DIGITALIZATION

The first and most important task is to collect all the necessary **DATA** in the **DIGITAL FORM** and store them in a properly designed **DATABASE**.

THIS IS NOT DIGITAL FORM OF DATA

1. Odcinek od km 153+860 do km 159+200, jezdnia prawa, pas ze

Odcinek jednorodny	Lokalizacja		Ugięcie D0	Ugięcie maksymalne	Ugięcie średnie
	km	m	U_{s}^{FWD} μm	U_{smax}^{FWD} μm	U_{sred}^{FWD} μm
1	153	900	118	231	
		950	126		
		000	142		
		050	179		
		100	104		
	154	150	209		
		200	141		
		250	144		
		300	231		
		350	202		
		400	123		
		450	141		
		500	126		
		550	131		
		600	77		
		650	110		
		700	136		
		750	192		
		800	152		
		850	140		
		900	181		
		950	191		



1/25

155

154

153

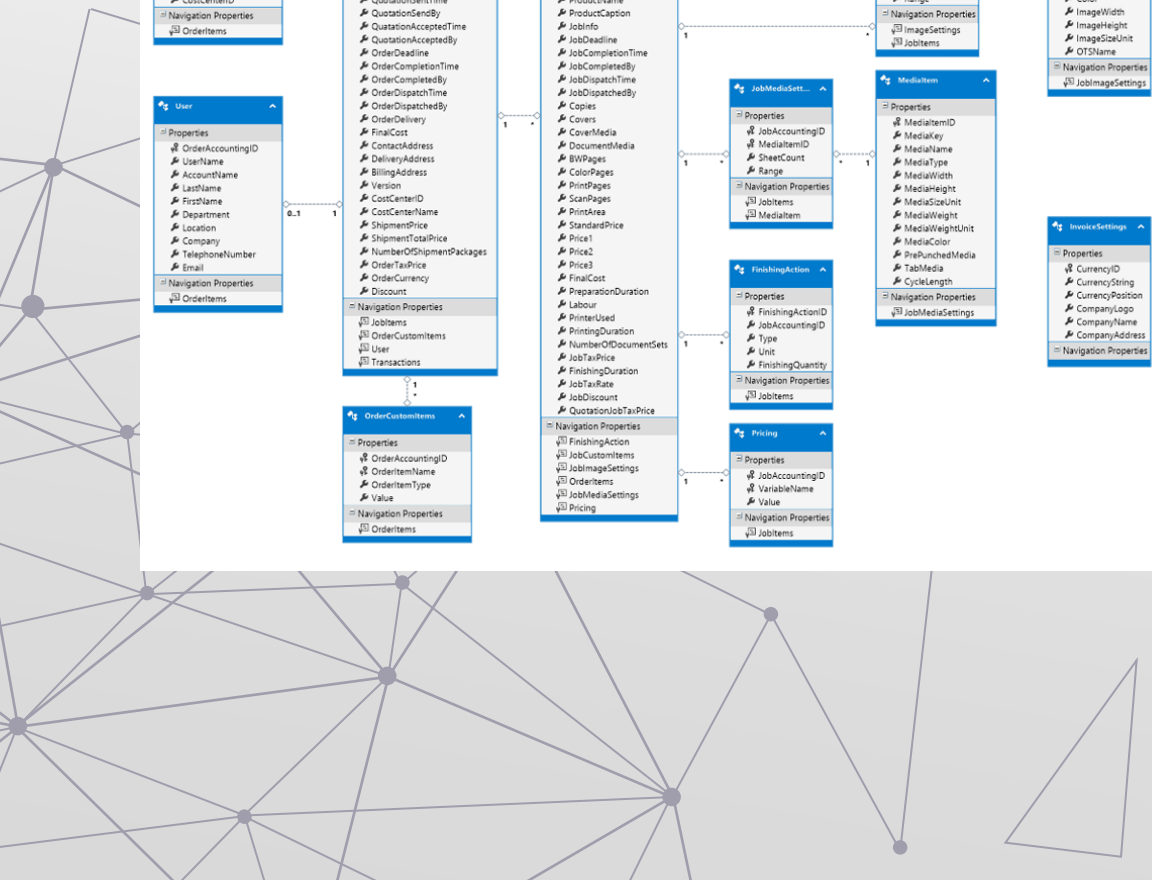
154

49.6	122	106	106	101	100	82	66	53	42	9	11:11:01:39
57.1	138	119	119	114	113	93	75	60	48	9	11:11:01:46
49.9	131	113	115	108	108	88	70	55	44	9	11:11:02:39
57.1	148	128	131	122	122	100	80	63	52	9	11:11:02:47
50.1	131	111	113	107	106	88	71	56	45	9	10:11:03:38
57.8	146	127	127	122	121	100	81	64	52	9	10:11:03:46
50.2	131	117	118	112	111	89	69	53	41	9	9:11:04:37
57.8	147	132	133	126	126	101	78	60	46	9	9:11:04:44
50.2	121	105	106	101	100	81	64	49	38	9	10:11:05:38
57.3	136	119	120	114	112	91	72	54	42	9	10:11:05:46
49.8	122	108	108	103	101	83	66	51	41	8	9:11:06:39
57.5	138	122	122	116	113	93	74	58	45	8	9:11:06:47
50.1	137	120	122	116	115	93	72	56	44	8	10:11:07:38
57.7	154	135	137	130	129	104	82	63	50	8	10:11:07:46
49.9	126	111	112	105	105	85	67	53	41	8	9:11:08:41
57.4	142	124	125	119	118	95	75	59	43	8	9:11:08:49
50.1	147	129	126	121	117	92	70	53	40	8	10:11:09:42
57.4	164	144	141	135	131	103	77	56	43	8	10:11:09:50
49.6	163	137	140	128	129	101	77	58	44	8	10:11:10:43
57.3	184	155	159	146	147	120	86	69	51	8	10:11:10:51
50.2	158	136	135	130	126	99	79	58	48	9	10:11:11:45
57.6	175	153	151	147	142	107	90	69	53	9	10:11:11:53
49.5	147	133	133	129	126	105	81	63	50	9	11:11:12:48
57.3	167	152	151	146	143	119	93	72	56	9	11:11:12:55
50.7	159	139	138	132	130	106	83	65	51	9	10:11:14:00
57.9	175	152	151	144	142	115	90	70	55	9	10:11:14:08
51.3	62	11	32	8	21	11	5	7	18	9	14:11:15:08
58.6	66	13	34	14	31	12	10	28	9	9	14:11:15:21
49.8	121	104	104	100	99	82	66	52	43	10	11:11:16:15
57.1	137	119	119	114	113	93	75	60	47	10	11:11:16:23
49.6	128	112	112	107	106	86	69	54	43	10	11:11:17:18
57.4	145	126	126	121	118	96	76	59	47	10	11:11:17:25
50.1	142	123	119	117	112	93	75	60	48	9	11:11:18:30
57.8	160	140	135	133	127	105	86	69	55	9	11:11:18:37
49.7	143	126	126	121	119	99	80	58	59	10	11:11:19:29
57.2	160	142	141	136	134	111	92	70	55	10	11:11:19:37
49.9	123	111	112	108	108	89	76	62	50	10	11:11:20:33
57.6	139	124	125	121	121	102	83	67	56	10	11:11:20:41
49.9	142	121	121	114	112	89	72	57	45	10	11:11:21:32
57.3	160	136	136	129	125	100	82	65	51	10	11:11:21:39
50.4	122	111	113	107	108	89	72	56	43	10	12:11:22:53
57.6	138	125	127	122	121	102	81	54	48	10	12:11:23:00
49.9	119	108	111	104	105	86	70	56	45	10	11:11:24:11
57.4	134	121	124	117	118	97	79	62	49	10	11:11:24:18
50.2	119	109	109	106	105	88	72	57	46	10	12:11:25:10
57.4	133	122	124	117	118	98	81	64	52	10	12:11:25:17
49.6	127	117	119	112	113	96	78	63	50	10	11:11:26:39
57.4	145	133	134	129	129	110	89	72	57	10	11:11:26:46
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58.0	117	107	108	105	104	88	74	59	48	10	12:11:27:45
49.7	131	120	121	116	115	95	76	58	45	10	12:11:28:59
57.1	148	135	136	131	129	107	86	68	52	10	12:11:29:07
50.4	116	105	106	102	101	84	68	55	44	10	11:11:29:59
58.1	131	119	120	115	114	95	77	61	49	10	11:11:30:06
50.0	102	93	93	91	89	76	63	50	40	10	10:11:31:17
57.5	114	105	105	102	100	85	70	56	44	10	10:11:31:24
49.7	137	121	121	115	116	101	84	69	55	9	11:11:32:22
57.2	154	136	137	129	131	114	94	77	61	9	11:11:32:29

153

151

An abstract geometric pattern consisting of a network of thin, dark grey lines connecting small, solid dark grey dots. The dots are positioned at various points, and the lines form a complex web of triangles and polygons. The pattern is set against a light grey background and is partially cut off by the right edge of the image.

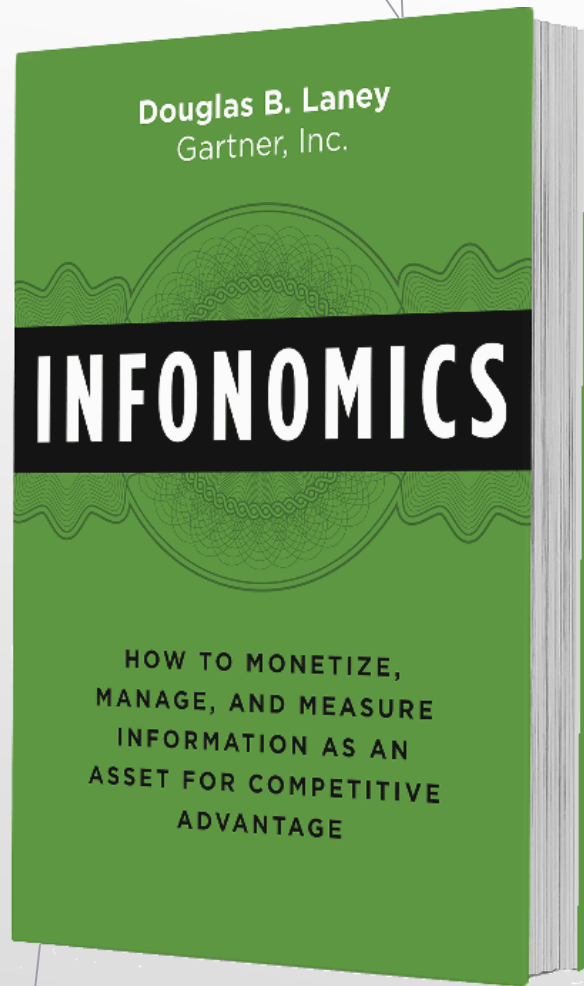


DATA is the oil of
the 21st century





INFORMATION + ECONOMICS

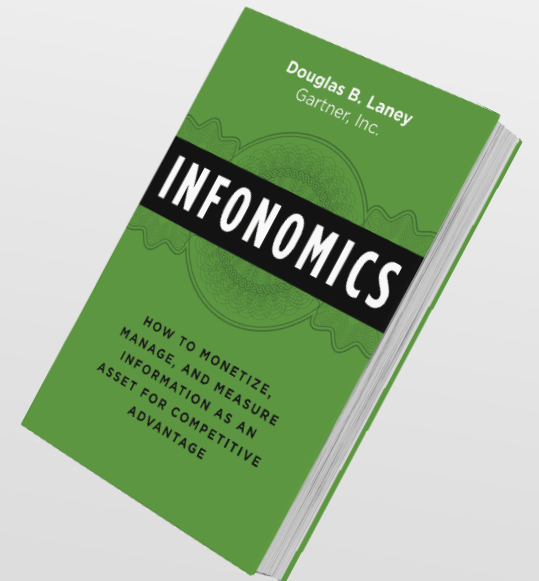


INFONOMICS

Business Information Economics
and Data Monetization

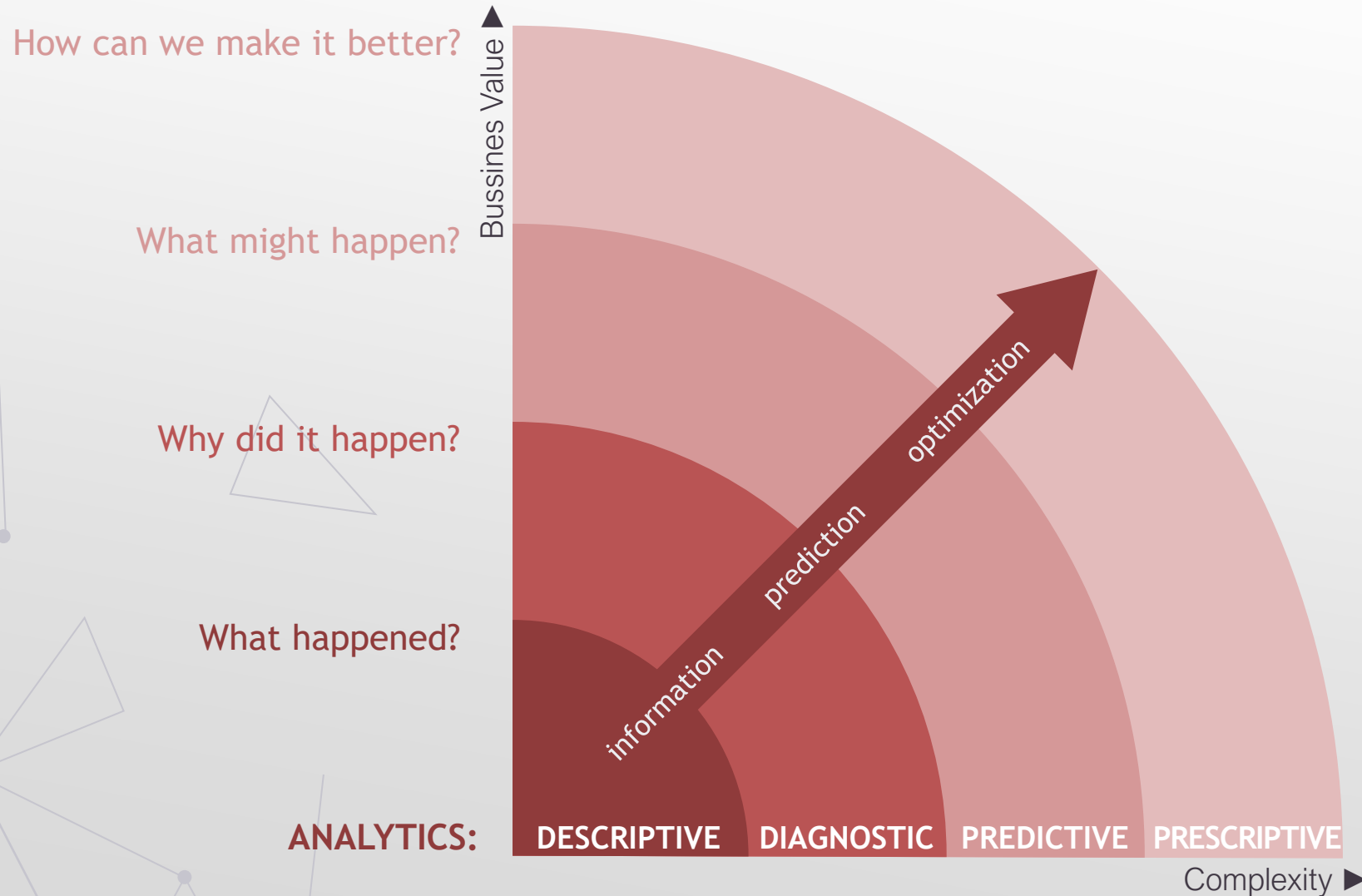
”

Information overload has become a **curse**,
but properly analyzed data may become
a **blessing and fortune**



PRESCRIPTIVE ANALYTICS

*The Holy Grail of
Information Management*





03

ARTIFICIAL INTELLIGENCE

CAN IT BE USEFUL FOR US?



03

ARTIFICIAL INTELLIGENCE

HOW CAN IT BE USEFUL FOR US?

ARTIFICIAL INTELLIGENCE

DEFINITION

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Artificial intelligence

From Wikipedia, the free encyclopedia

"AI" redirects here. For other uses, see [AI \(disambiguation\)](#) and [Artificial intelligence \(disambiguation\)](#).

Artificial intelligence (AI) is [intelligence](#) demonstrated by [machines](#), unlike the [natural intelligence](#) displayed by [humans](#) and [animals](#), which involves consciousness and emotionality. The distinction between the former and the latter categories is often revealed by the acronym chosen. 'Strong' AI is usually labelled as AGI (Artificial General Intelligence) while attempts to emulate 'natural' intelligence have been called ABI (Artificial Biological Intelligence). Leading AI textbooks define the field as the study of "intelligent agents": any device that perceives its environment and takes actions that maximize its chance of successfully achieving its goals.^[3] Colloquially, the term "artificial intelligence" is often used to describe machines (or computers) that mimic "cognitive" functions that humans associate with the [human mind](#), such as "learning" and "problem solving".^[4]

As machines become increasingly capable, tasks considered to require "intelligence" are often removed from the definition of AI, a phenomenon known as the [AI effect](#).^[5] A quip in [Tesler's Theorem](#) says "AI is whatever hasn't been done yet."^[6] For instance, [optical character recognition](#) is frequently excluded from things considered to be AI,^[7] having become a routine technology.^[8] Modern machine capabilities generally classified as AI include successfully understanding human speech,^[9] competing at the highest level in [strategic game systems](#) (such as [chess](#) and [Go](#)),^[10] autonomously operating cars, intelligent routing in [content delivery networks](#), and [military simulations](#).^[11]

Artificial intelligence was founded as an academic discipline in 1955, and in the years since has experienced several waves of optimism,^{[12][13]} followed by disappointment and the loss of funding (known as an "[AI winter](#)"),^{[14][15]} followed by new approaches, success and renewed funding.^{[13][16]} After [AlphaGo](#) successfully defeated a professional [Go](#) player in 2015, artificial intelligence once again attracted widespread global attention.^[17] For most of its history, AI research has been divided into sub-fields that often fail to communicate with each other.^[18] These sub-fields are based on technical considerations, such as particular goals (e.g. "[robotics](#)" or "[machine learning](#)"),^[19] the use of particular tools ("[logic](#)" or [artificial neural networks](#)), or deep philosophical differences.^{[22][23][24]} Sub-fields have also been based on social factors (particular institutions or the work of particular researchers).^[18]

The traditional problems (or goals) of AI research include [reasoning](#), [knowledge representation](#), [planning](#), [learning](#), [natural language processing](#), [perception](#) and the ability to move and manipulate objects.^[19] General intelligence is among the field's long-term goals.^[25] Approaches include [statistical methods](#), [computational intelligence](#), and [traditional symbolic AI](#). Many tools are used in AI, including versions of [search](#) and [mathematical optimization](#), [artificial neural networks](#), and [methods based on statistics, probability and economics](#). The AI field draws upon computer science, information engineering, mathematics, psychology, linguistics, philosophy, and many other fields.

The field was founded on the assumption that human intelligence "can be so precisely described that a machine can be made to simulate it".^[26] This raises philosophical arguments about the mind and the ethics of creating artificial beings endowed with human-like intelligence. These issues have been explored by [myth](#), [fiction](#) and [philosophy](#) since [antiquity](#).^[31] Some people also consider AI to be a [danger to humanity](#) if it progresses unabated.^{[32][33]} Others believe that AI, unlike previous technological revolutions, will create a [risk of mass unemployment](#).^[34]

In the twenty-first century, AI techniques have experienced a resurgence following concurrent advances in [computer power](#), large amounts of [data](#), and theoretical understanding; and AI techniques have become an essential part of the [technology industry](#), helping to solve many challenging problems in computer science, [software engineering](#) and [operations research](#).^{[35][16]}

Part of a series on

Artificial intelligence

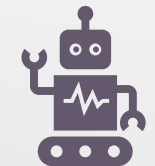
Major goals	[show]
Approaches	[show]
Philosophy	[show]
History	[show]
Technology	[show]
Glossary	[show]

• • •

mimics „cognitive” functions,
such as „learning” and
„problem solving”



works much better than standard
algorithms in case of
insufficient amount of data



doesn't involve consciousness
and personality



WHAT IS AN AI TODAY?

THE FUTURE IS NOW



SOCIAL MEDIA

user feeds showing individually selected set of data and commercials



E-COMERCE

logistics optimization based on predictions of user behaviors (big data predictive analysis)



AUTONOMOUS CARS

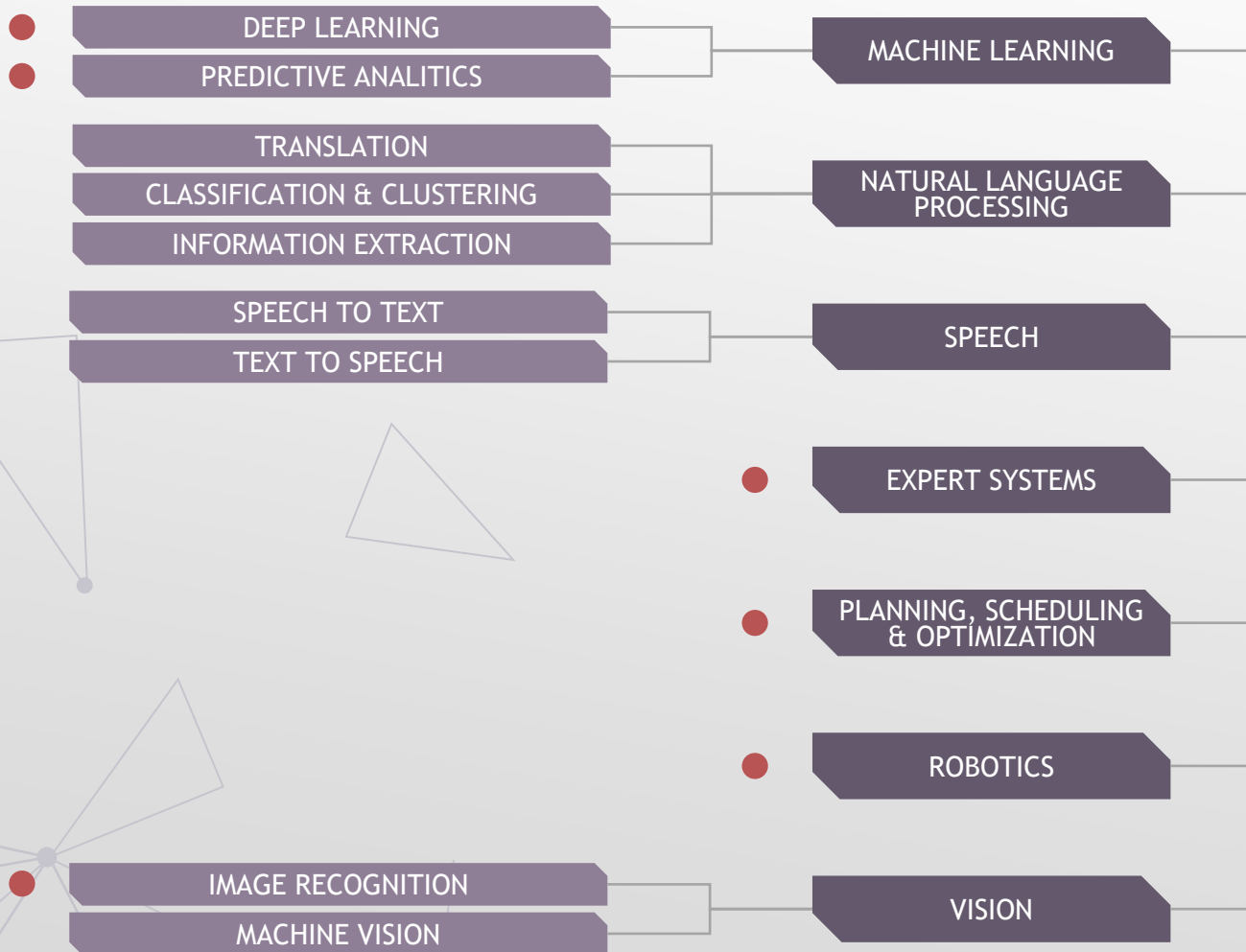
AI Autopilot: machine vision, neural networks, autonomy algorithms



SELF-LANDING ROCKETS

AI Autopilot: controlling the rocket launches, flights and landings

ARTIFICIAL INTELLIGENCE SCHEME



ARTIFICIAL NEURAL NETWORKS

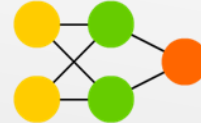
HOW IT WORKS?

- Backfed Input Cell
- Input Cell
- △ Noisy Input Cell
- Hidden Cell
- Probabilistic Hidden Cell
- △ Spiking Hidden Cell
- Output Cell
- Match Input Output Cell
- Recurrent Cell
- Memory Cell
- △ Open Memory Cell
- Scanning Filter
- Convolution

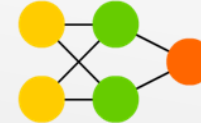
Feed Forward And



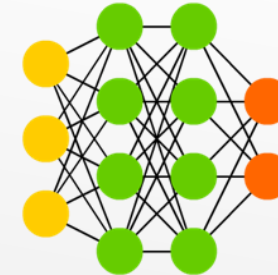
Feed Forward Xor



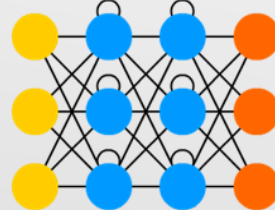
Radial Basis Network



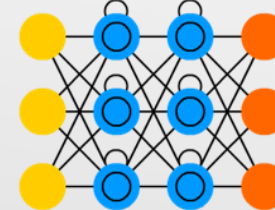
Deep Feed Forward



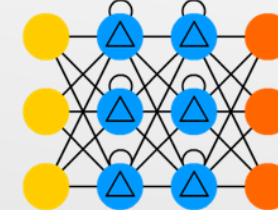
Recurrent Neural Network (bi)



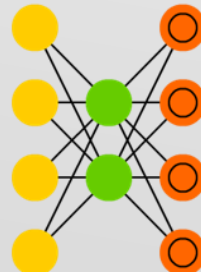
Long / Short Term Memory (bi)



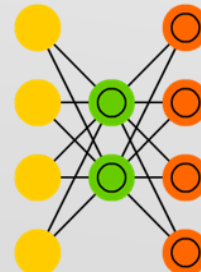
Gated Recurrent Unit (bi)



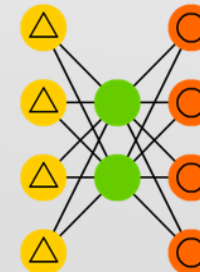
Auto Encoder



Variational Auto Encoder



Denosing Auto Encoder
















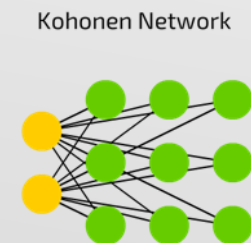
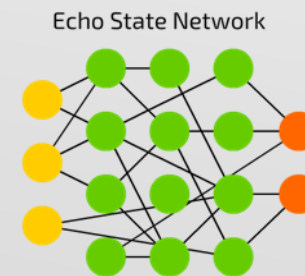
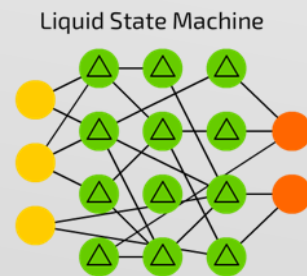
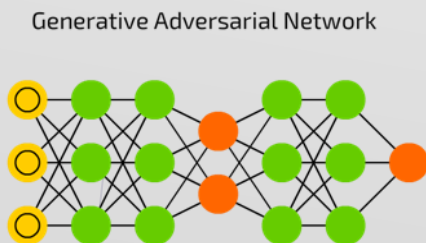
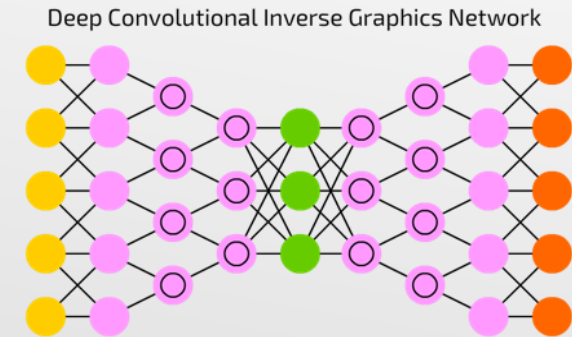
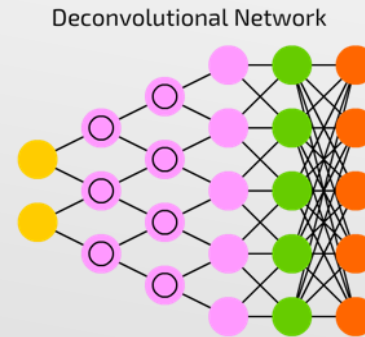
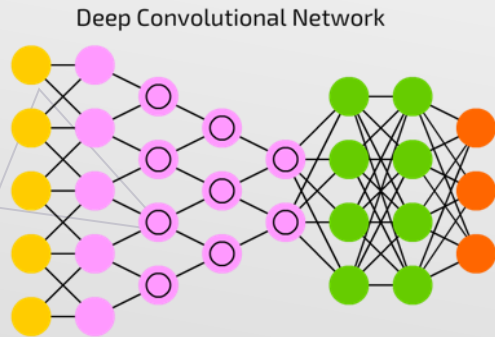
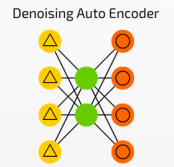
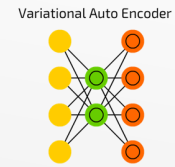
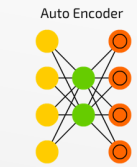
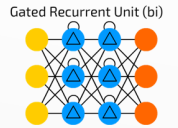
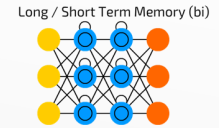
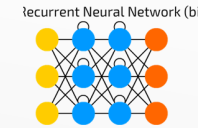
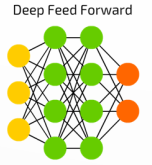
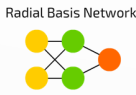
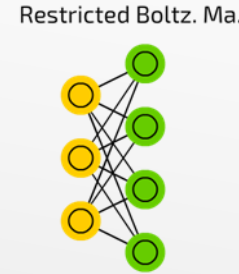
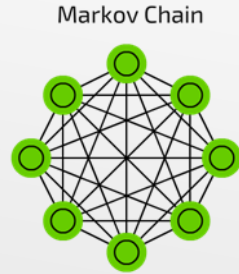
Sparse Auto Encoder



ARTIFICIAL NEURAL NETWORKS

HOW IT WORKS?

-  Backfed Input Cell
-  Input Cell
-  Noisy Input Cell
-  Hidden Cell
-  Probabilistic Hidden Cell
-  Spiking Hidden Cell
-  Output Cell
-  Match Input Output Cell
-  Recurrent Cell
-  Memory Cell
-  Open Memory Cell
-  Scanning Filter
-  Convolution



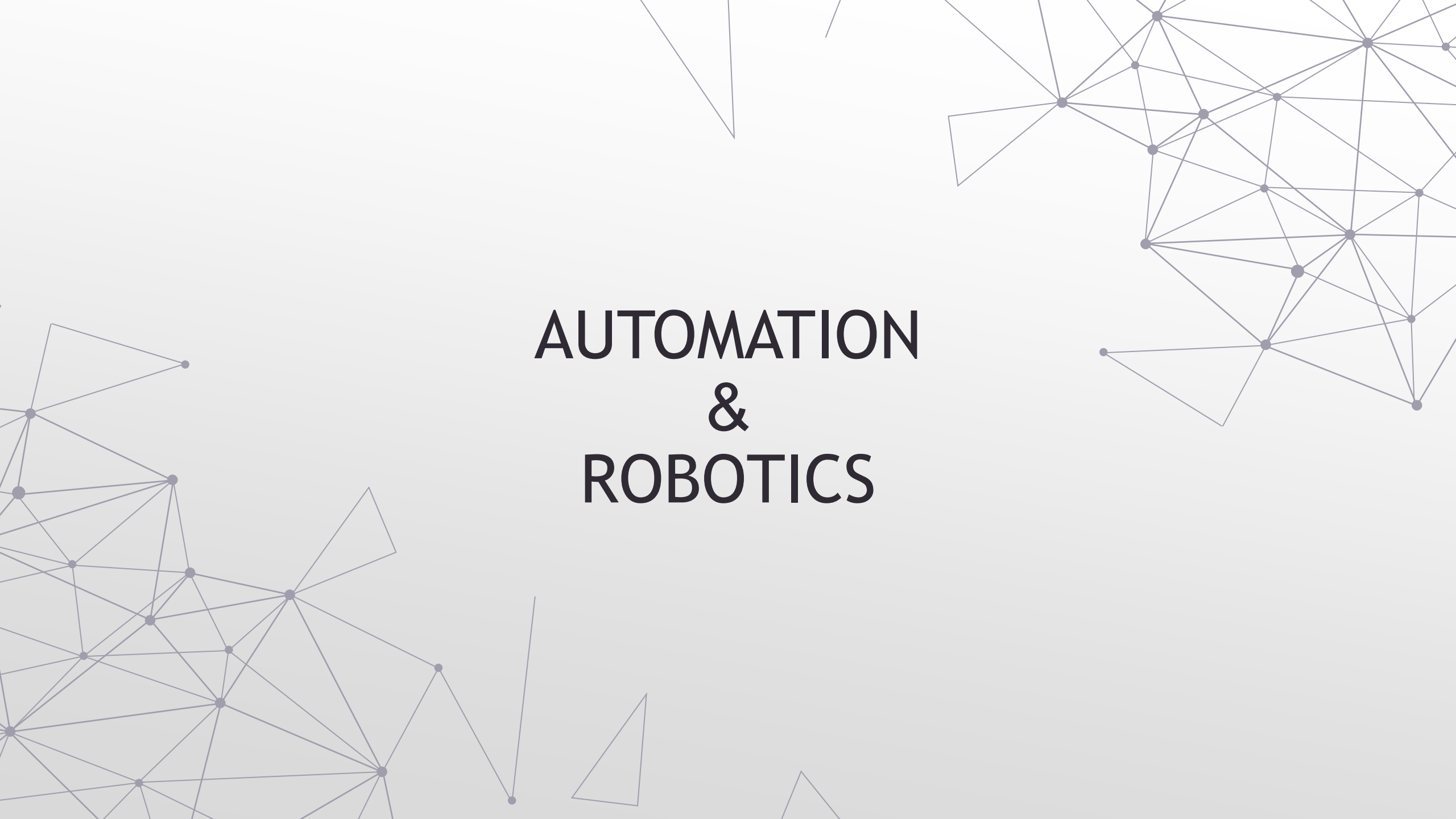


04

POSSIBLE APPLICATIONS IN HIGHWAY ENGINEERING

Just a few ideas...

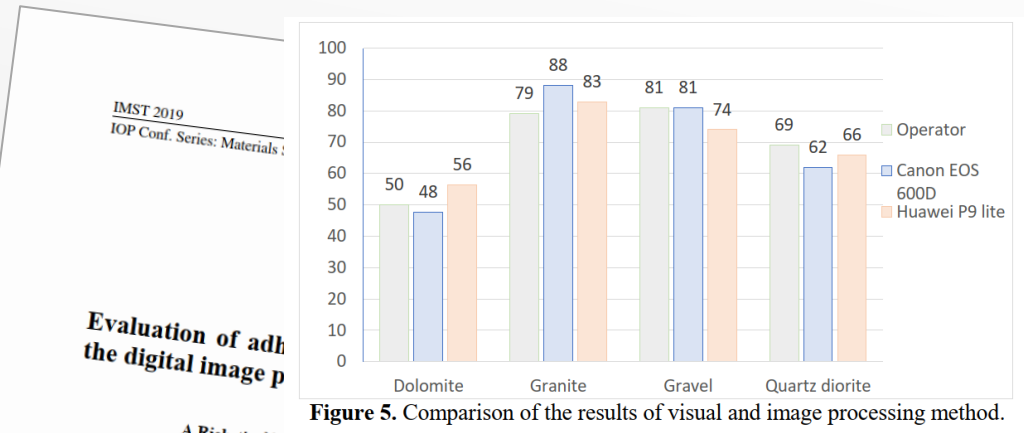
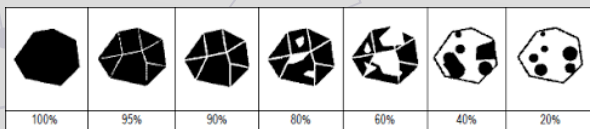
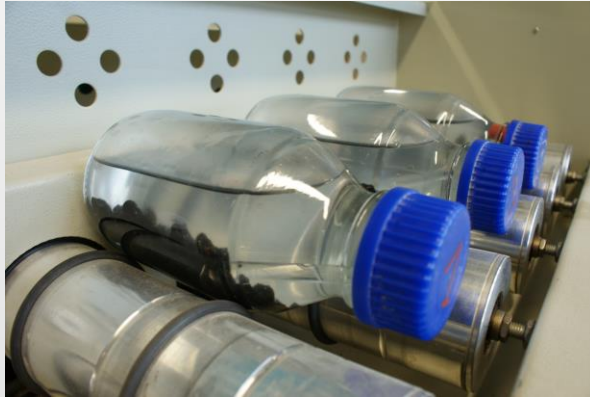




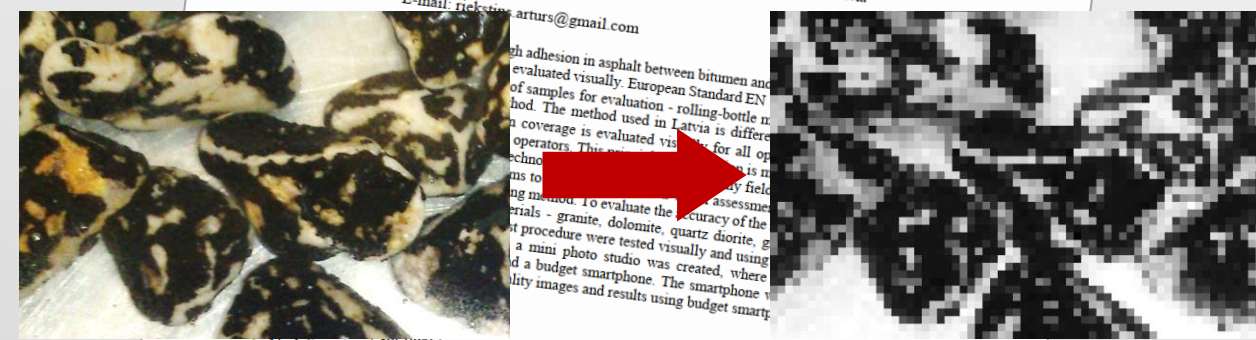
AUTOMATION & ROBOTICS

IMAGE RECOGNITION SYSTEMS

AGGREGATE COATING ANALYSES (EN 12697-11:2020-07)



A Riekstins^{1,2}, V Haritonovs¹ and A Balodis²
¹Riga Technical University, Department of Roads and Bridges, Riga, Latvia
²SJSC Latvian State Roads, Riga, Latvia
E-mail: riekstins.arturs@gmail.com

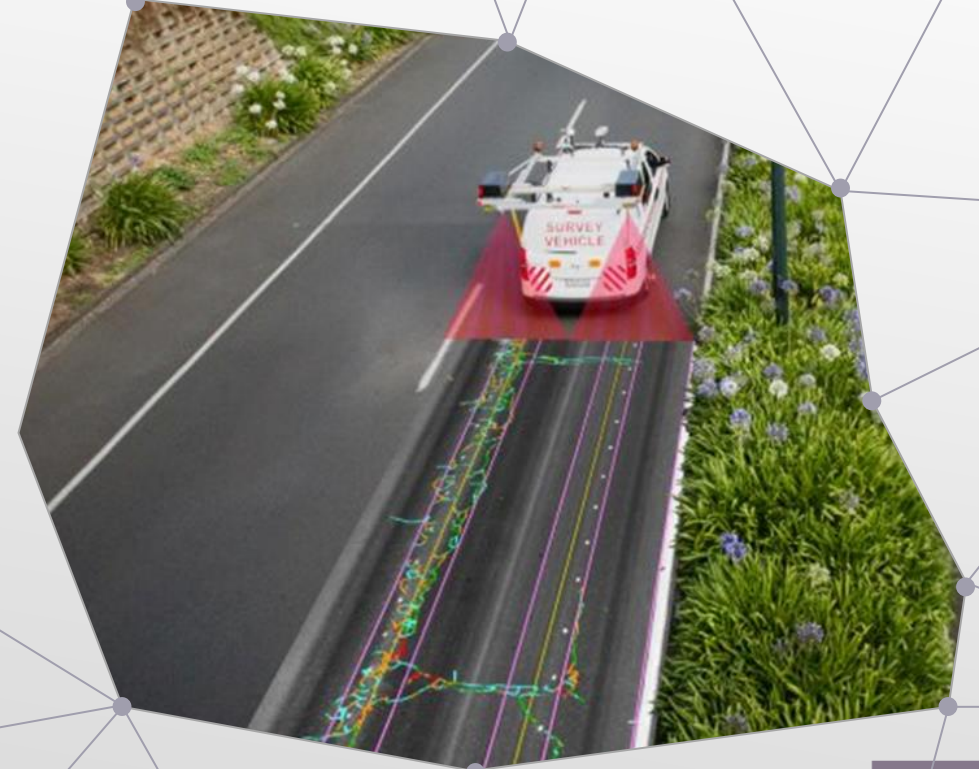
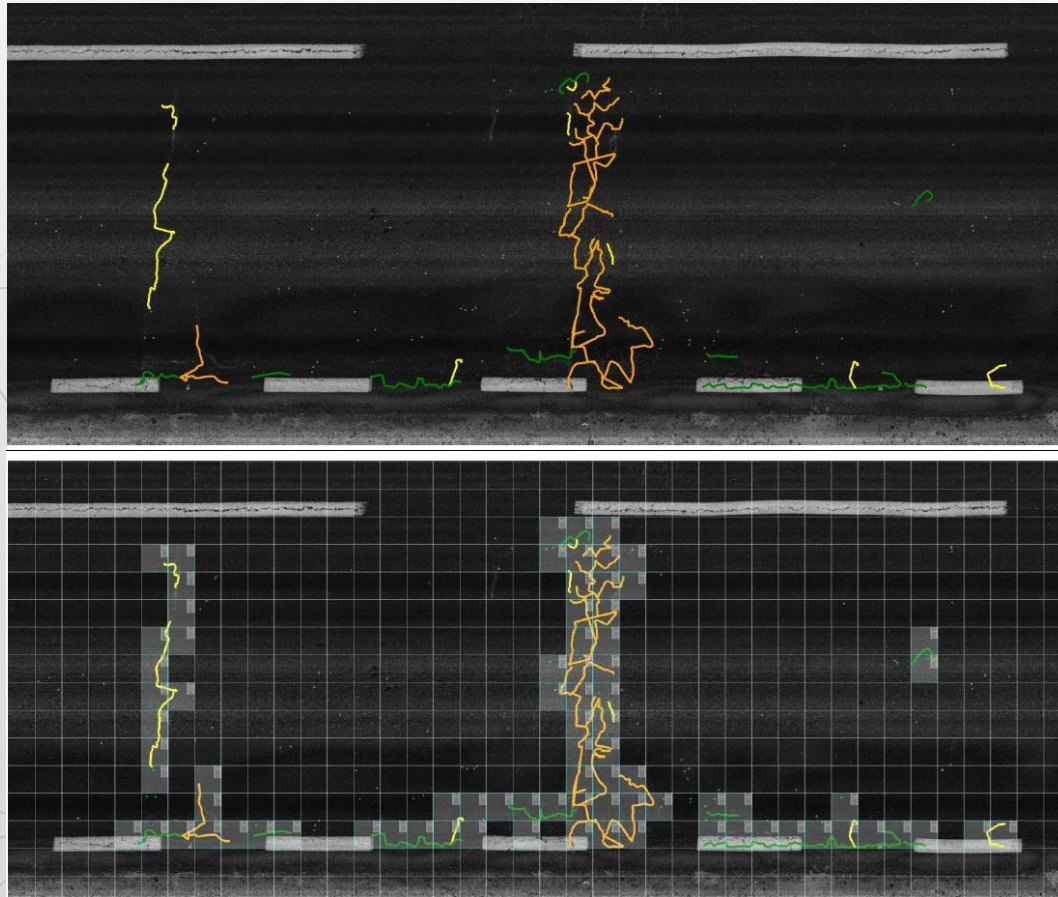


Adhesive properties of asphalt concrete are strong adhesion between bitumen and aggregates. [1, 2, 3]. Viscosity properties are known to be affected by the chemical composition, surface tension and amount of cut surface and porosity. [4, 5] To improve the adhesion properties, the bitumen is modified by the addition of a variety of improving additives [1].

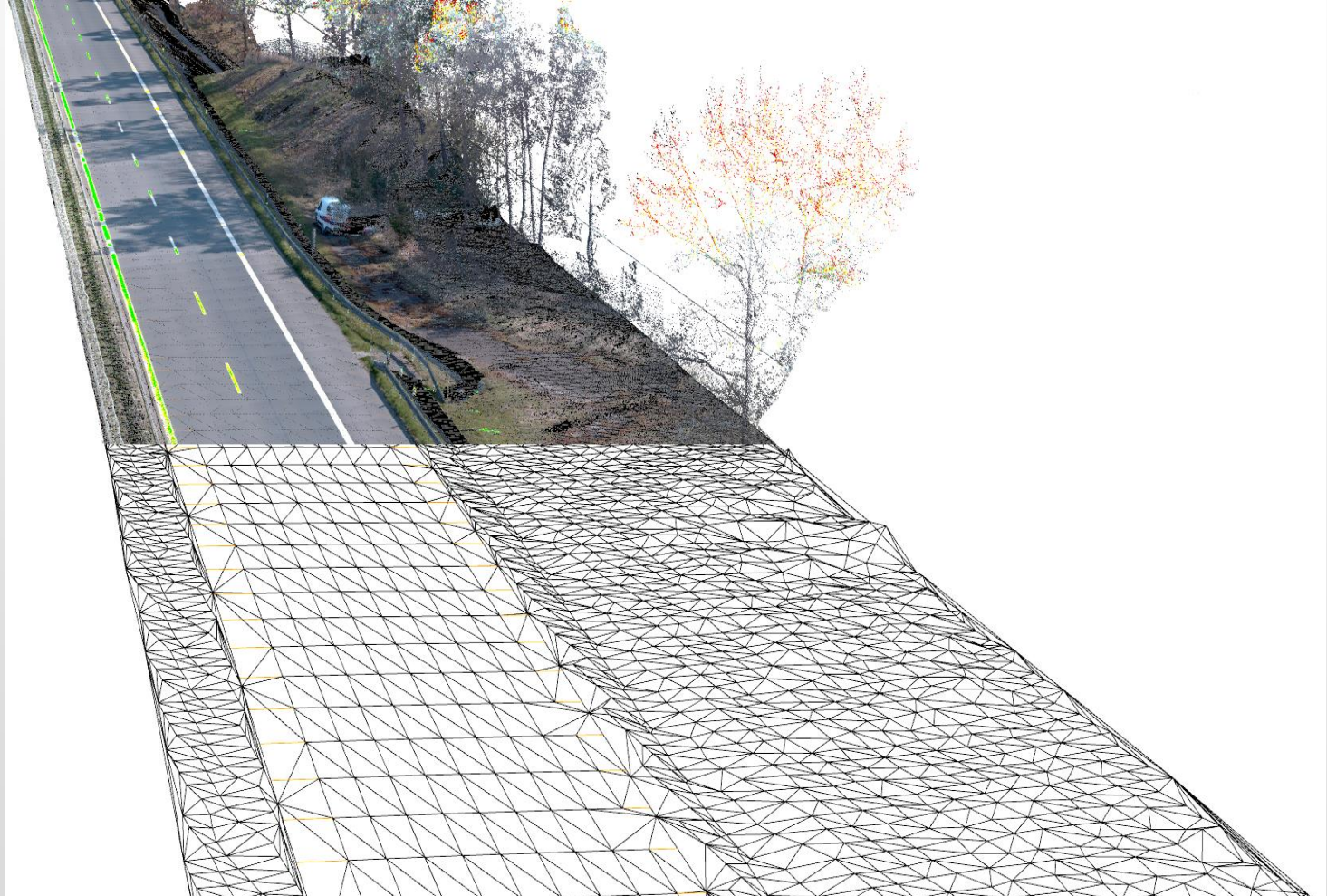
To test the adhesion properties between bitumen and aggregates, European Standard EN 12697-11 provides three different methods: rolling-bottle method, static method and boiling water stripping method [6]. In Latvia, the method used to evaluate adhesion has been remained from GOST standard and is described in Road Specifications 2019. [7] All of the methods mentioned above are done visually by two independent operators. The accuracy of visual assessment is 5%. In figure 1 can see the results of visual assessment.

IMAGE RECOGNITION SYSTEMS

DISTRESSES IDENTIFICATION FROM VIDEOREGISTRATION



AUTOMATIC DISTRESSES IDENTIFICATION FROM VIDEOREGISTRATION AND LIDAR



AUTOMATIC DISTRESSES IDENTIFICATION FROM VIDEOREGISTRATION AND LIDAR

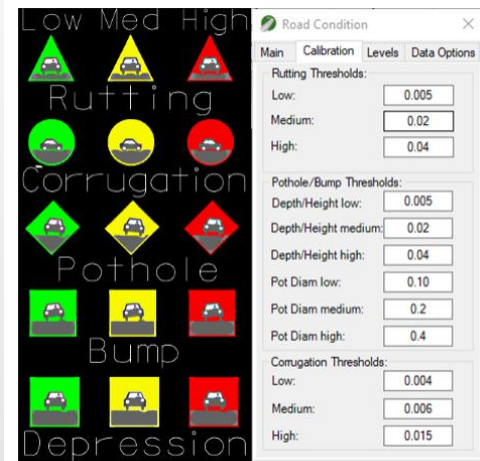
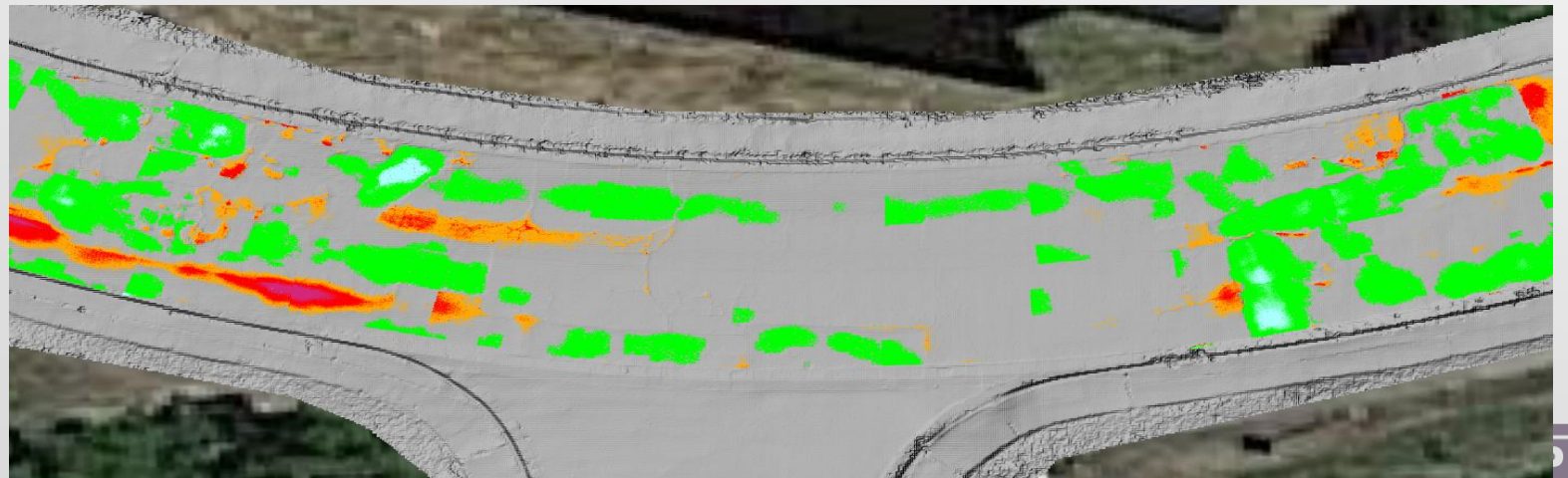
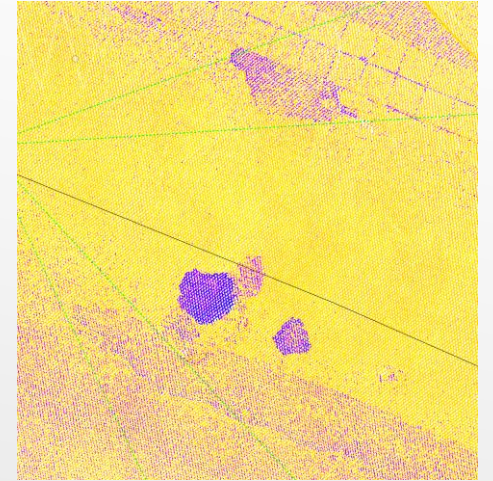


Figure 16 Flagging of different types of unevenness in the Road Condition tool in TopoDC



FULLY INTEGRATED ROAD SURFACE AND SUB-SURFACE CONDITION ASSESSMENT AT TRAFFIC SPEED

 HAWKEYE



The first fully integrated road surface and sub-surface condition assessment system, providing functional and structural data at highway speeds.



iPAVe

COVER STORY

iPAVE COST BENEFITS

The iPAVe is a powerful tool that uses advanced technologies to collect and analyse full-spectrum structural, surface and functional road condition data that is critical for the efficient life-cycle management of road networks, saving billions towards the fiscus by enabling optimal proactive, rather than reactive, maintenance strategies to be identified.

Benefits and uses include:

- Significant cost saving per test/metre over traditional structural testing methods
- The measured data is vigorously analysed and used towards the provision of safer road infrastructure
- Collects all pavement surface and structural parameters with high accuracy in one pass
- Ability to operate at traffic speeds, improving production, safety and efficiency
- Continuous measurements at significantly higher resolution than traditional techniques such as FWD
- Provides comprehensive data with which to make better informed decisions for financially and technically appropriate rehabilitation and surfacing treatments
- Better QA/QC for road agencies, consultants and contractors to monitor accountability

across the world in diverse regions that include Australia, the UK, USA, China, and several European countries. ARRB Systems has two iPAVe vehicles deployed in South Africa and has surveyed more than 76 000 km of the country's paved road network since 2016. The iPAVe regularly undertakes surveys for provincial, metropolitan and national road authorities and consulting engineers under taking project level design work.

Meanwhile, ARRB Systems' global teams have collectively surveyed over 750 000 km to date. In the USA, the TSD technology has surveyed roads in 30 states, with New Mexico being the latest state to award a multi-year routine TSD testing contract for pavement management and rehabilitation purposes.

ARRB Systems is also a member of the DaRTS (Deflection at Road Traffic Speed) focus group, which is a global forum of TSD operators and users that meets on a

bi-annual basis to share knowledge, discuss projects and give feedback on technological developments. Members include numerous state and federal road authorities in the USA, Europe and Australasia, as well as operators including the Australian Road Research Board, BAST (Germany), TRRL (UK), IBDAM (Poland) and the FHWA (USA)," says Balaram.

Removing the guesswork

The high accuracy and resolution of the iPAVe data enables engineers to pinpoint precise locations (down to 1 m) and

areas where the capacity of the pavement structure is of concern. iPAVe provides additional and essential input to network level assessment and evaluation, which is crucial for deterioration modelling and future maintenance budgeting based on accurate determination of the expected serviceable lifespan. This information also influences the selection of optimal maintenance and rehabilitation strategies.

"Engineers design roads based on their structure. In many parts of the world, though, road asset managers still maintain roads based on their surface characteristics. However, to reliably determine the remaining life of the pavement, both the structural and functional condition must be factored into the equation. This can only be truly

In South Africa and across the world, there's been a strong uptake in demand for iPAVe from design engineers and transportation specialists

ARRB Systems' iPAVe intelligent pavement assessment vehicle is the first and only comprehensive pavement measurement system in the world, providing seamlessly integrated structural and surface condition data at highway speeds.



AUTOMATIC AND INTELLIGENT PAVEMENT CONDITION CONDITION ASSESSMENT USING ANN



Article

Intelligent Assessment of Pavement Condition Indices Using Artificial Neural Networks

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Abstract: The traditional manual approach of pavement condition evaluation is being replaced by more sophisticated automated vehicle systems. Although these automated systems have eased and hastened pavement management processes, research is ongoing to further improve their performances. An average state road agency handles thousands of kilometers of the road network, most of which have multiple lanes. Yet, for practical reasons, these automated systems are designed to evaluate road networks one lane at a time. This requires time, energy, and possibly more equipment and manpower. Multiple Linear Regression (MLR) analysis and Artificial Neural Network (ANN) were employed to examine the feasibility of modeling and predicting pavement distresses of multiple lanes as functions of pavement distresses of a single adjacent lane. The successful implementation of this technique has the potential to cut the energy and time requirement at the condition evaluation stage by at least half, for a uniform multi-lane highway. Results showed promising model performances that indicate the possibility of evaluating a multi-lane highway pavement condition (PC) by single lane inspection. Traffic direction parameters, location, and lane matching parameters contributed significantly to the performance of the ANN PC prediction models.

Keywords: pavement condition; degradation; prediction; artificial intelligence; artificial neural network; regression analysis; pavement evaluation; Saudi Arabia

1. Introduction

Artificial intelligence (AI) is an emerging area of computer science that uses different types of machines and sensors to mimic intelligent human behavior. John McCarthy first introduced AI in 1956 [1]; however, lack of technological innovations by the time limited its applications. In the following decade (between 1960 to 1970) researchers explored AI through artificial neural networks (ANNs) and Knowledge-based systems (KBS) [1]. ANNs are systems of neurons connected in various layers and inspired by the human brain to solve various complex real-life tasks. On the other hand, KBS systems are computers that offer guidance based on pre-established rules based on the information fed to them by humans. Application of the latest Machine Learning (ML) and Deep Learning (DL) based technologies have revolutionized AI. ML and DL have found various applications in diverse fields such as face recognition and tracking [2], visual tracking [3,4], vision and language navigation [5–7], and image and video editing [8–10]. In recent years, application of such soft computing methodologies has received widespread applications for various civil and transportation engineering-related problems, including road safety [11–14], mode choice modeling [15], energy demand modeling for electric vehicles [16–18], and traffic sign detection and recognition [19,20]. Similarly, applications of these predictive modeling approaches are reshaping the field of pavement evaluation and management.

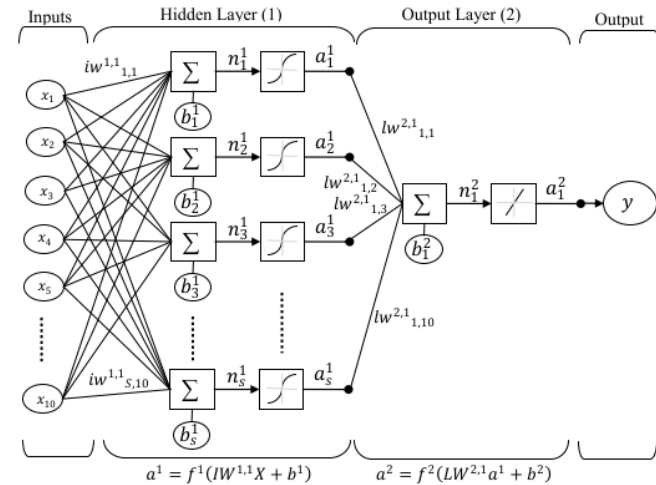


Figure 3. ANN Models Architecture.

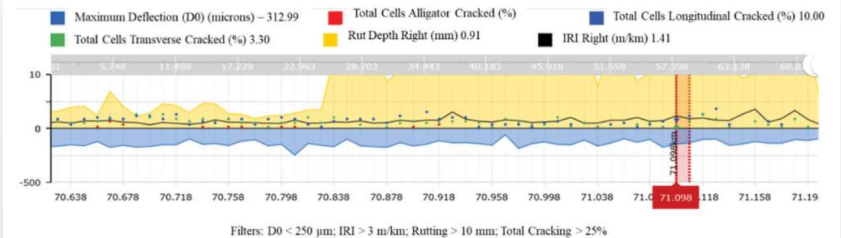
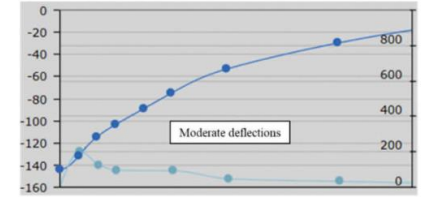


Figure 6. Low deflection and a rough, uneven road surface.



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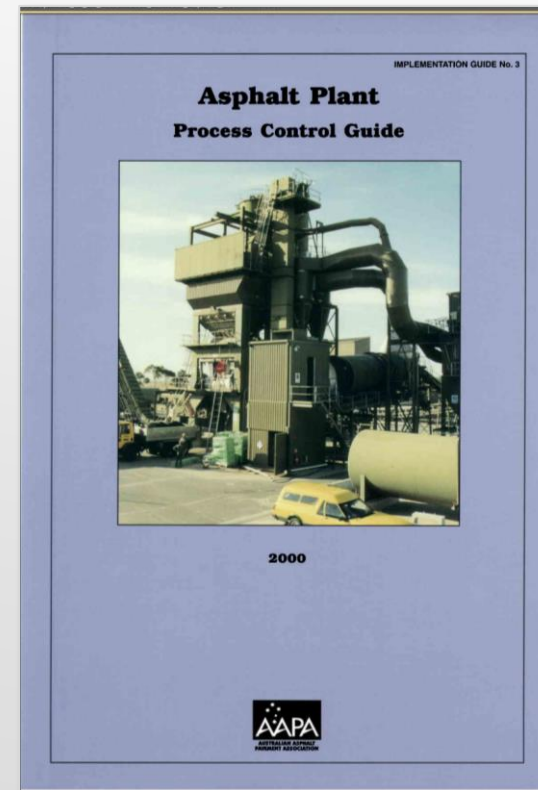
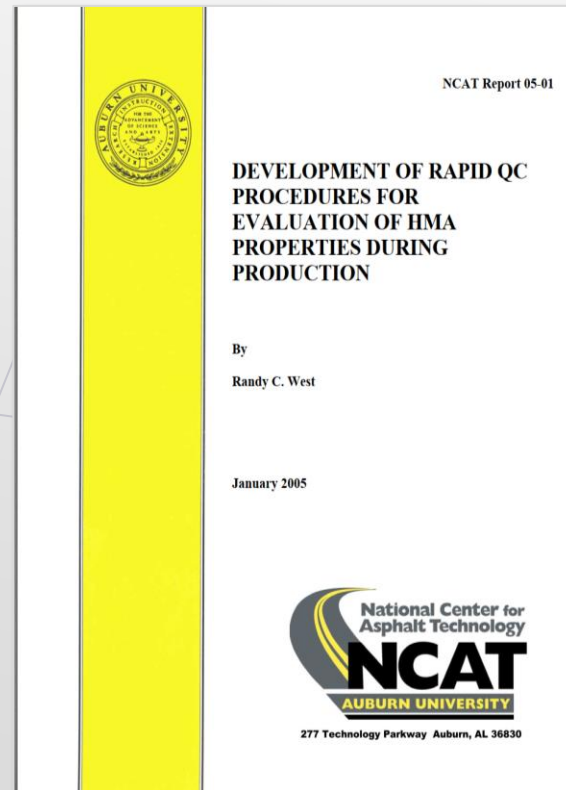
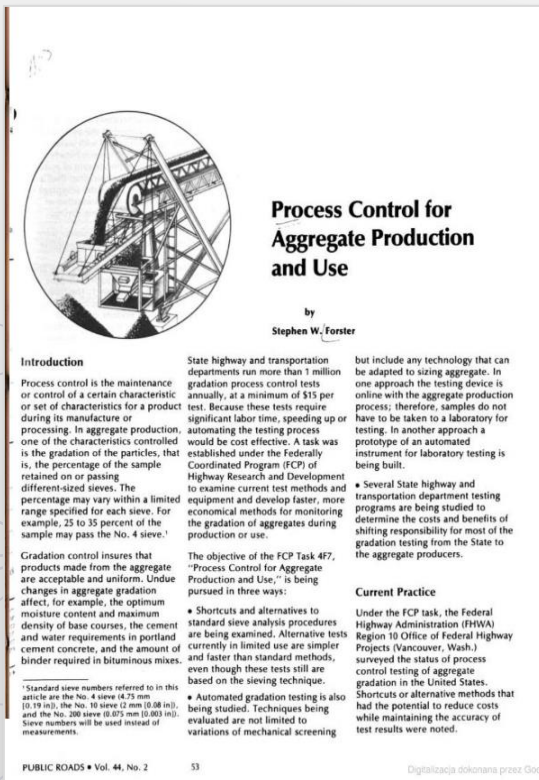
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INTEGRATED AUTOMATIC SYSTEM FOR QC OF MATERIAL PRODUCTION AND ASPHALT PAVING PROCESS



ROBOTIC MATERIAL SAMPLING AND AUTOMATIC TESTING SYSTEMS



Figure 4. Automated Gradation Device

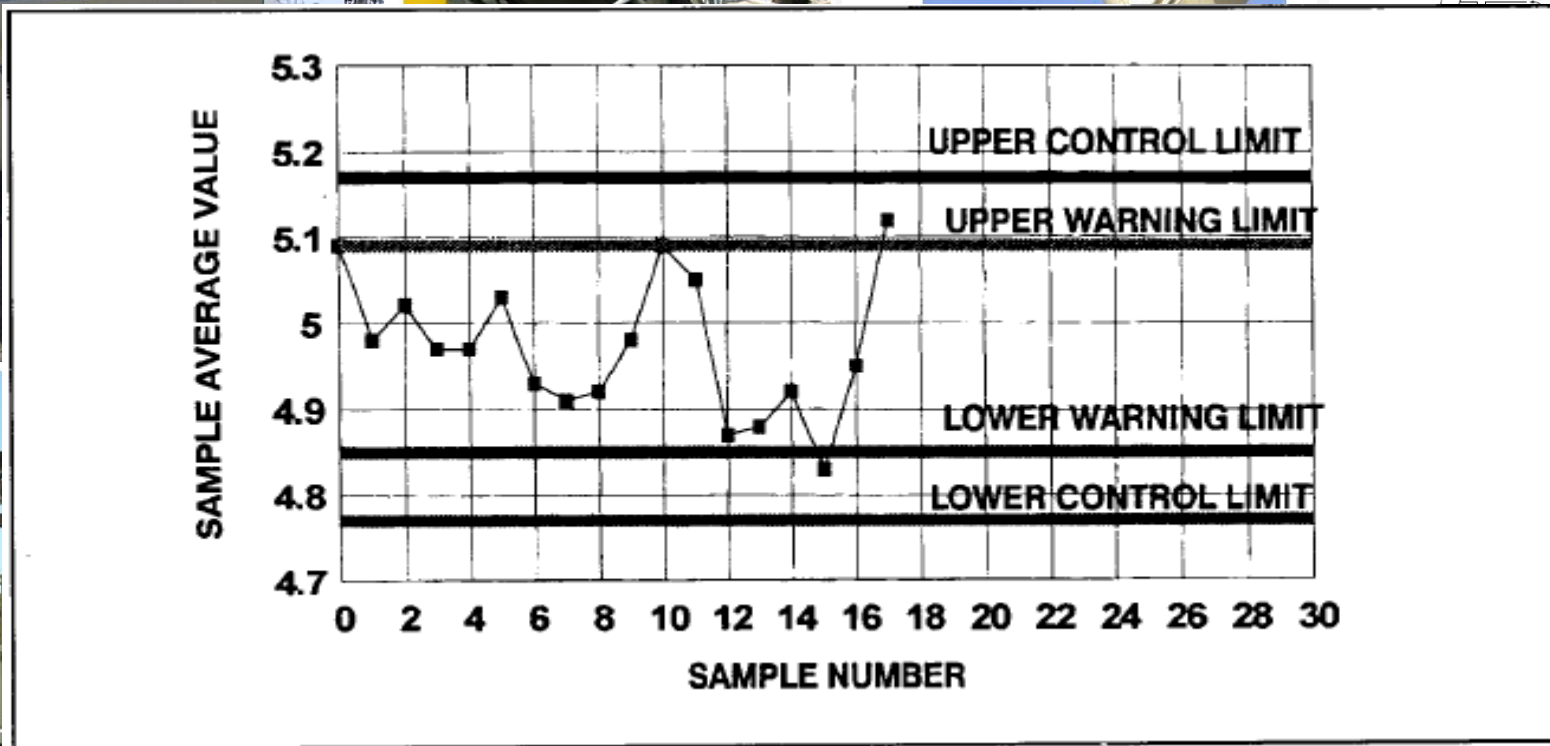


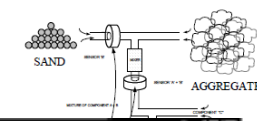
Figure 5. In-line Asphalt Viscometer



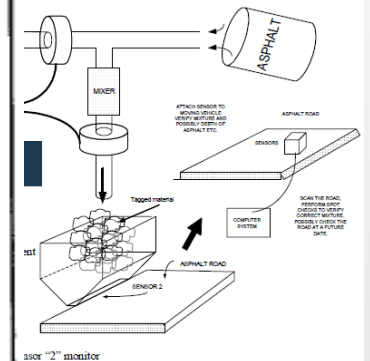
Figure 6. Asphalt Meter Calibration Tank



Figure 7. Robotic Truck Sampler



- 100% INSPECTION WHILE MIXING SAND AND AGGREGATES**
- 1) The sand is tagged
 - 2) Sensor "B" monitors the incoming sand
 - 3) Sensor "A" + "B" monitors the sand and aggregate
 - 4) The next component is mixed and tested with sensor "A" + "B" + "C"
 - 5) Each time a component is added the mixture is 100% inspected
 - 6) The final aggregate mix is ready for mixing with the asphalt.



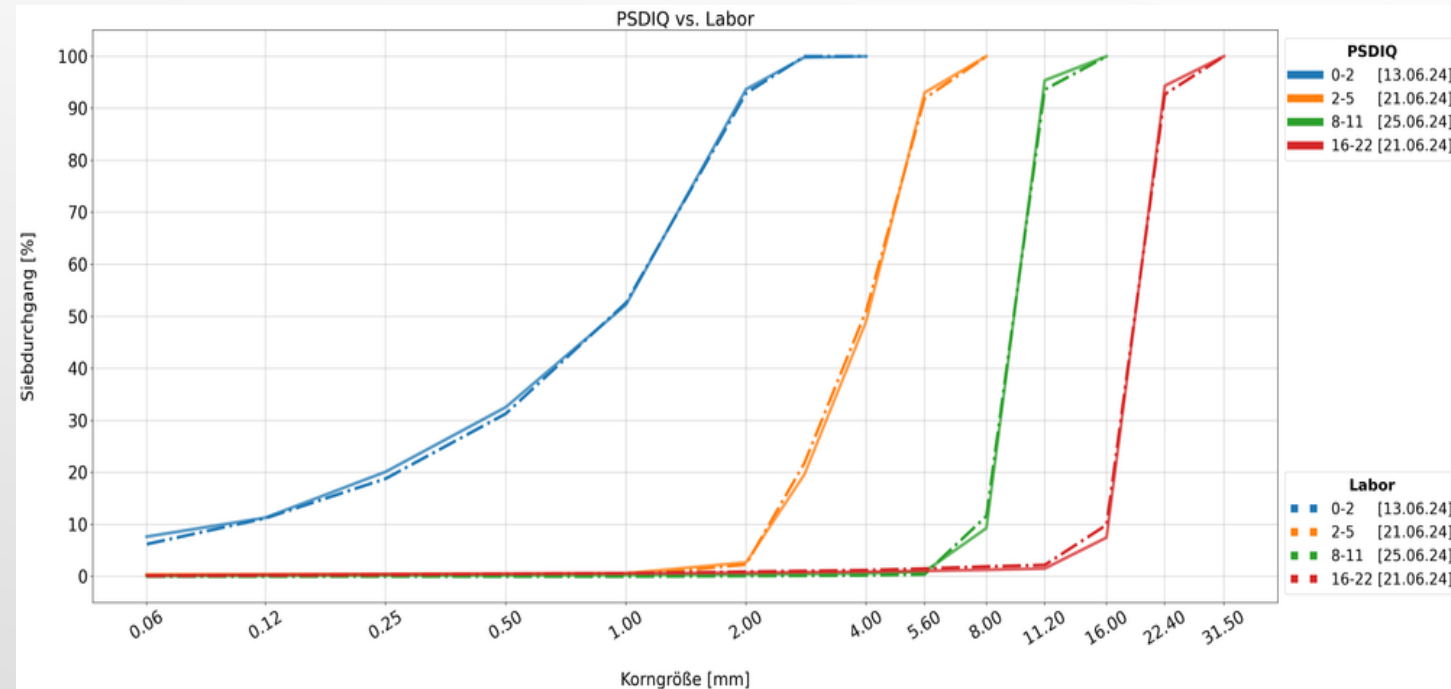
Magnetic Tagging in HMA Manufacture



REAL-TIME QUALITY CONTROL IN THE QUARRY

TPA GmbH & TIPCO GmbH RESEARCH PROGRAM

THE GRAIN SIZE DISTRIBUTION IN A DYNAMIC
MATERIAL STREAM LIVE AND DIGITALLY



AUTOMATED OPTIMIZATION OF ASPHALT PAVING AND COMPACTION PROCESS

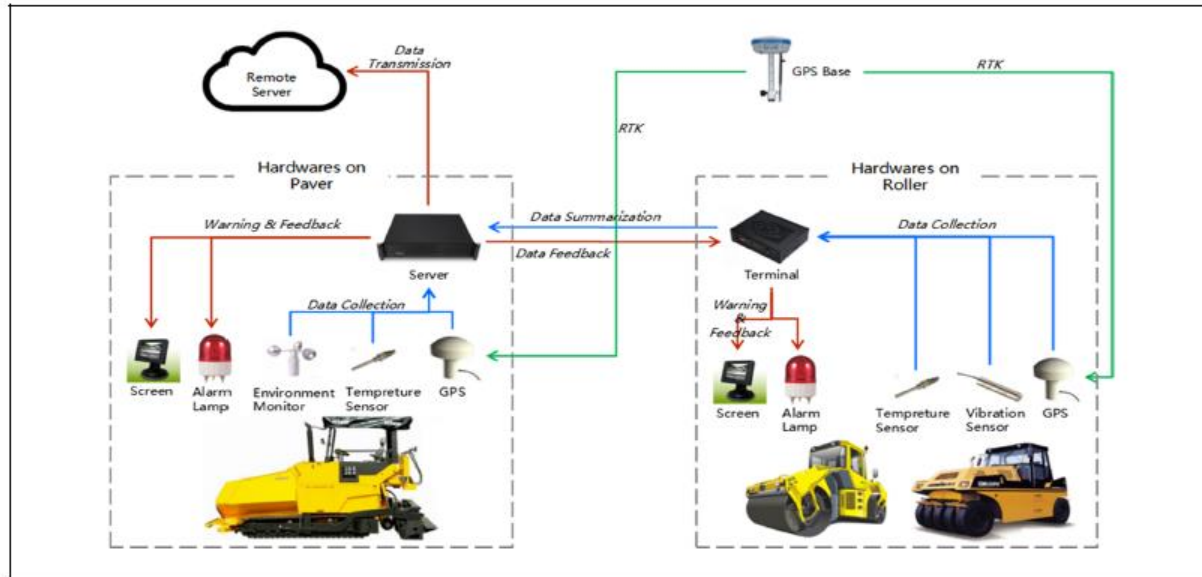


Figure 4. Composition of HMA paving and compaction quality check system.
Note: RTK = real-time kinematic.

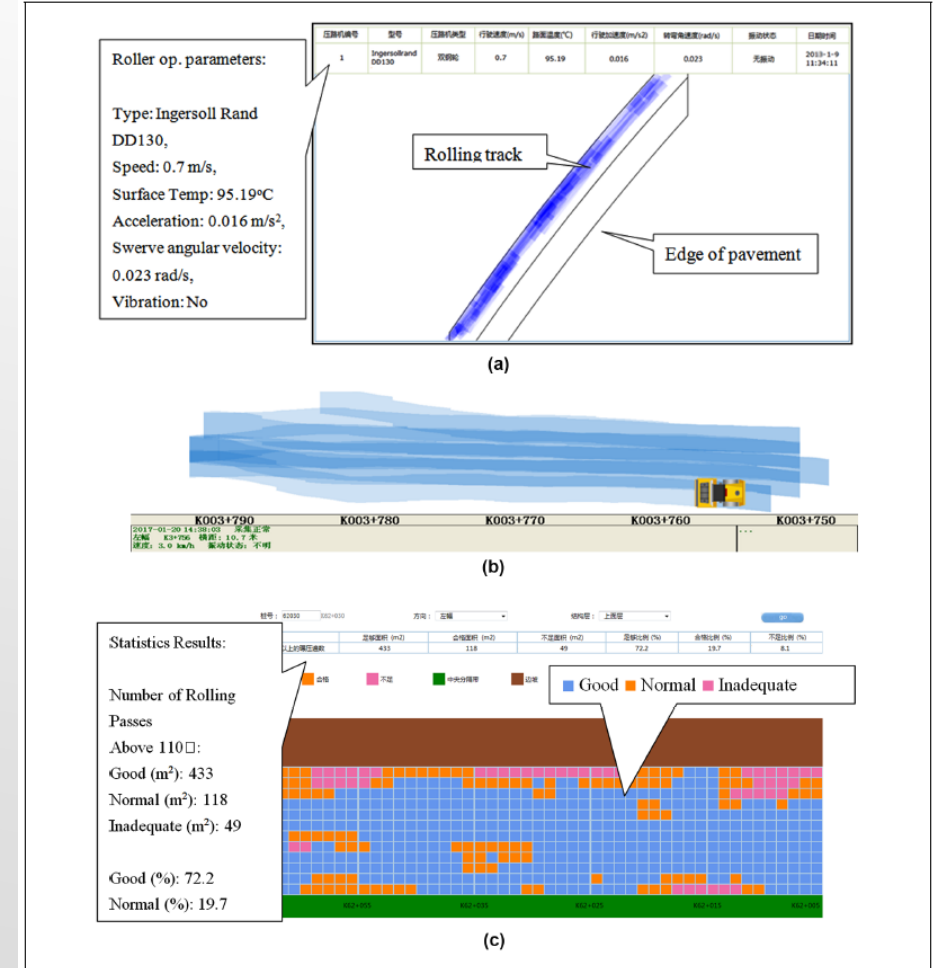


Figure 6. (a) Web-based roller real-time working status; (b) roller driver working status user graphic interface; and (c) graphic display of rolling quality statistics.

AUTOMATED PAVEMENT CONSTRUCTION INSPECTION USING DRONES

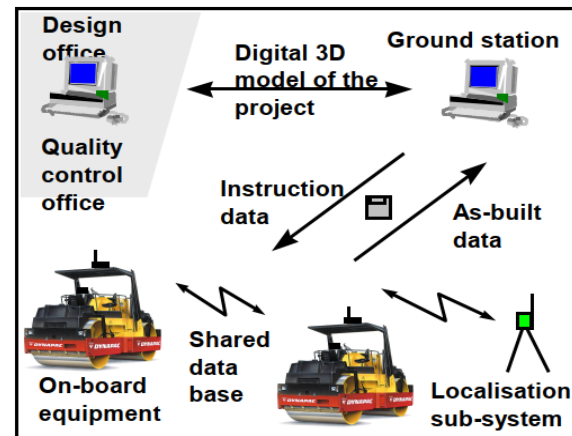


Figure 1: general architecture of a CIRC system

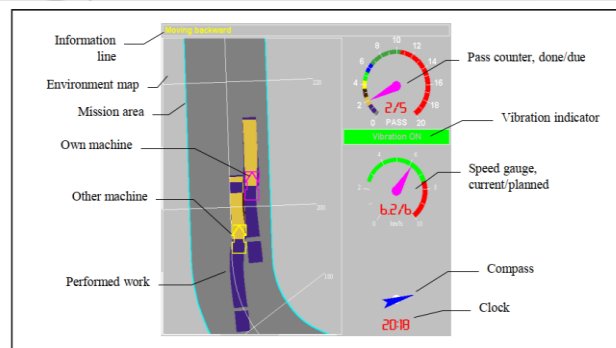


Figure 3: CIRCOM on-board sub-system MMI



Figure 3. UAS thermal imaging set up on I-69 (A: Placing GCPs, B,C: Pilot flying the UAS, D: UAS flying at about 24m (80 ft)).



Figure 9. Thermal profile of HMA in the hopper (A) and behind the paver (B).

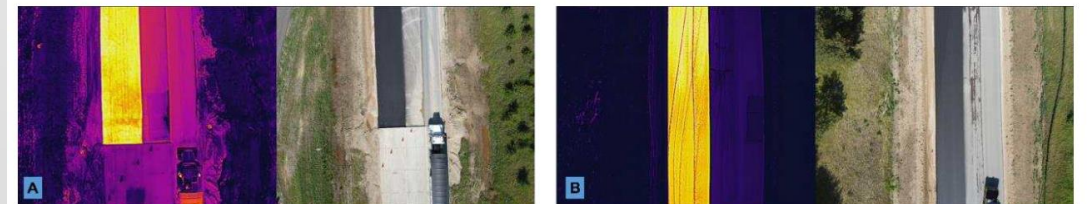


Figure 10. Differential cooling on the freshly placed HMA at the very beginning of the paving (A) and along the roller tracks (B).

SMARTER, DIGITAL AND SUSTAINABLE CONSTRUCTION

WalzGen - RESEARCH PROGRAM IN COOPERATION OF TPA GmbH, BOMAG, RPTU Kaiserslautern AND InfraTest





PREDICTIVE ANALYTICS

MACHINE LEARNING - PREDICTIVE ANALYTICS

ARTIFICIAL NEURAL NETWORK FOR PREDICTING MATERIALS PARAMETERS FROM HISTORIC DATA

EXAMPLE: ANN for E^* - Dynamic Complex Stiffness Modulus of HMA

PREDICTING DYNAMIC COMPLEX STIFFNESS MODULUS OF HMA

PREDICTIVE EQUATION USED IN AASHTO MEPDG (NCHRP 1-37A)

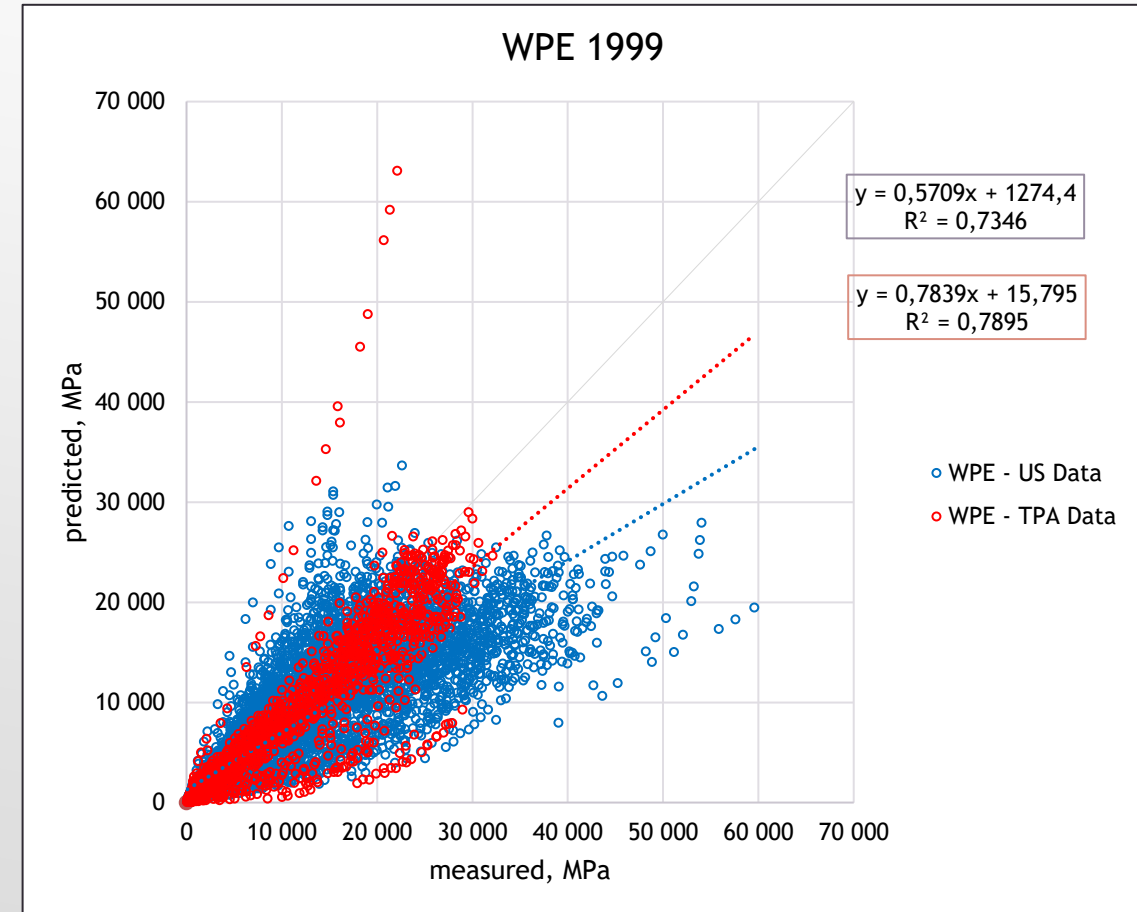
current most sophisticated approach - Witczak Predictive Equation

$$\log E = -1.249937 + 0.029232 \cdot p_{200} - 0.001767 \cdot (p_{200})^2 - 0.002841 \cdot p_4 - 0.058097 \cdot Va - 0.802208 \cdot \frac{Vb_{eff}}{(Vb_{eff} + Va)} + \frac{3.871977 - 0.0021 \cdot p_4 + 0.003958 \cdot p_{38} - 0.000017 \cdot (p_{38})^2 + 0.005470 \cdot p_{34}}{1 + e^{(-0.603313 - 0.313351 \cdot \log(f) - 0.393532 \cdot \log(\eta))}}$$

Where the variables represent:

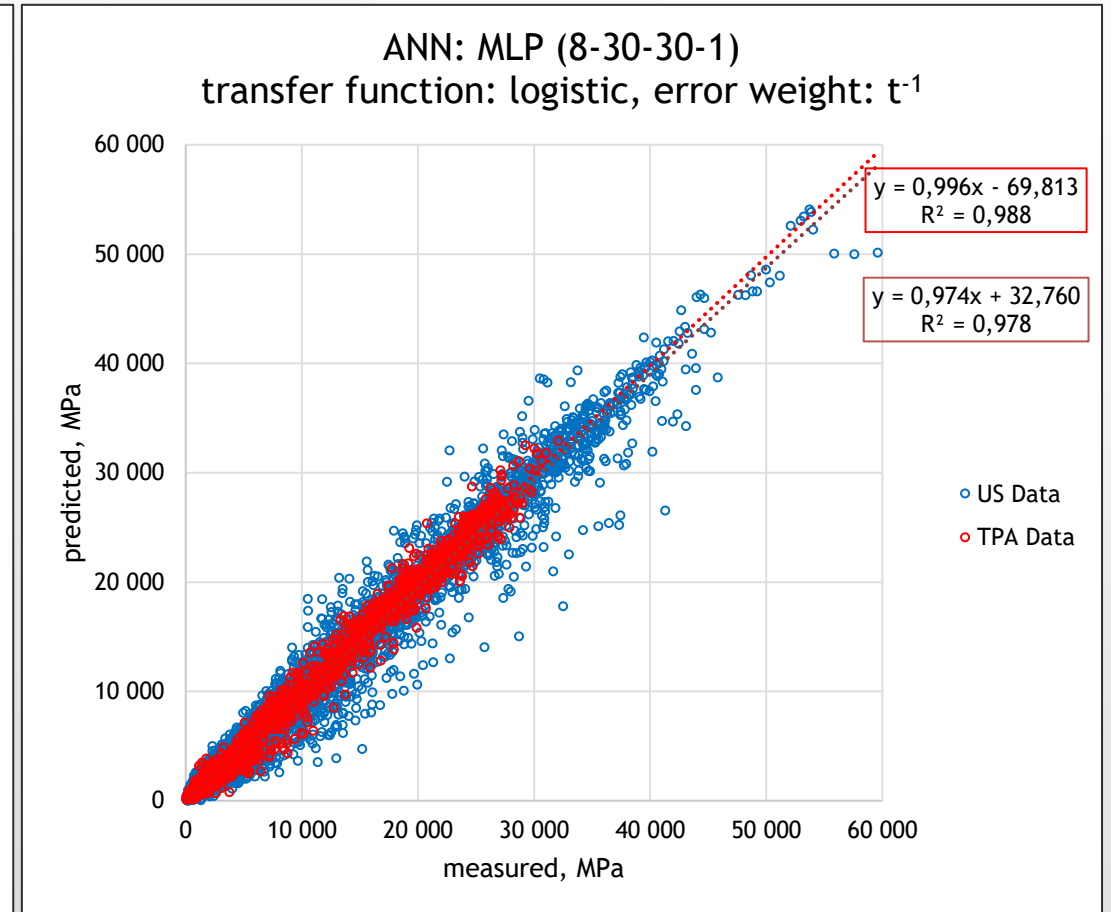
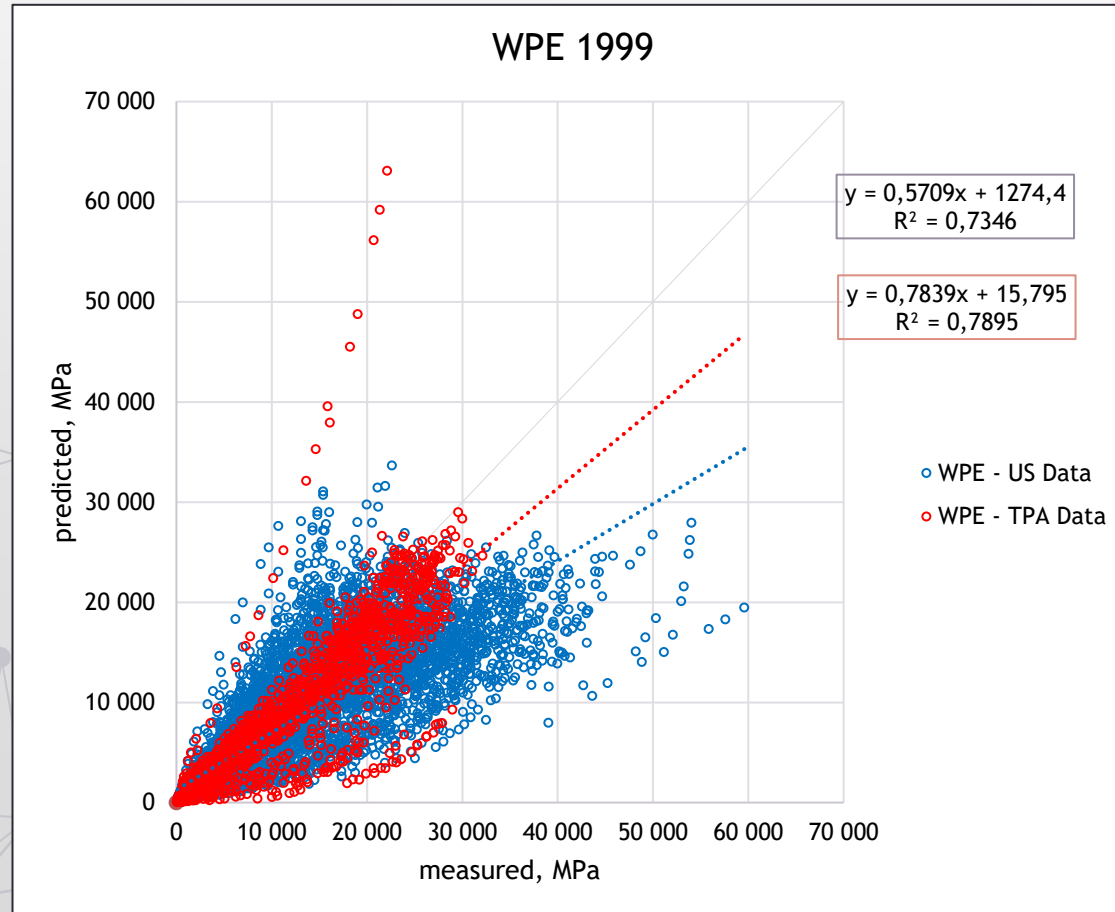
- E Asphalt Mix Dynamic Modulus, in 10^5 psi
- η Bitumen viscosity in 10^6 poise (at any temperature, degree of aging)
- f Load frequency in Hz
- Va % air voids in the mix, by volume
- Vb_{eff} % effective bitumen content, by volume
- p_{34} % retained on the $\frac{3}{4}$ inch sieve, by total aggregate weight (cumulative)
- p_{38} % retained on the $\frac{3}{8}$ inch sieve, by total aggregate weight (cumulative)
- p_4 % retained on the No. 4 sieve, by total aggregate weight (cumulative)
- p_{200} % passing the No. 200 sieve, by total aggregate weight

FIGURE 26. Revised Dynamic Modulus Predictive Equation



PREDICTING DYNAMIC COMPLEX STIFFNESS MODULUS OF HMA

STANDARD APPROACH vs. ARTIFICIAL NEURAL NETWORK (MATLAB)





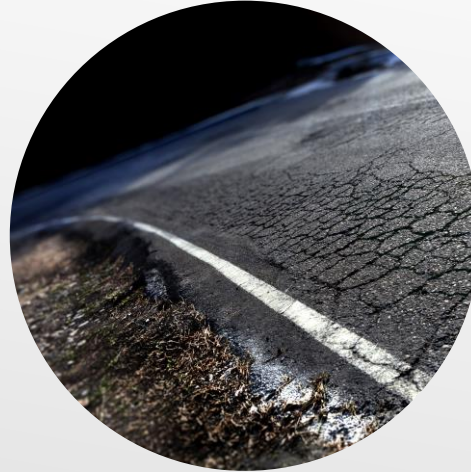
EXPERT SYSTEMS

VIRTUAL TECHNOLOGIST or EXPERT



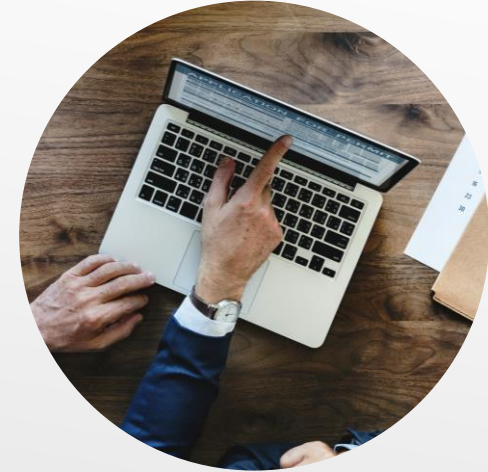
HMA / PCC TYPE TESTING

acceleration of the recipe design process and achieving optimal composition solutions



DAMAGE CAUSES EVALUATION

identification & assessment of the causes of premature damage to pavements or building structures based on combined information on material parameters, quality of workmanship and operating conditions



PREDICTION & PRESCRIPTION

ability to predict (Predictive Analysis) and prevent errors (Prescriptive Analysis) at the stage of design, production and execution in real time (online) based on constantly flowing data and information



THANK YOU FOR YOUR ATTENTION!

aleksander.zborowski@tpaqi.com

