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Validation of a Novel Sensing Approach for Continuous Pavement Monitoring Using Full-Scale APT Testing

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Abstract: The objective of this paper is to present a novel approach for the continuous monitoring of pavement condition through the use of 6 7 combined piezoelectric sensing and novel condition-based interpretation methods. The performance of the developed approach is validated for the detection of bottom-up fatigue cracking through full-scale accelerated pavement testing (APT). The innovative piezoelectric sensors 8 9 4 are installed at the bottom of a thin 102 mm (4 in.) asphalt layer. The structure is then loaded until failure (up to 1 million loading cycles in this study). The condition-based approach, used in this work, does not rely on stain measurements and allows users to bypass the need for any 10 5 11 structural or finite-element models. Instead, the data compression approach relies on variations in strain energy harvested by smart sensors to track changes in material and structural conditions. Falling weight deflectometer (FWD) measurements and visual inspections were used to 12 13 validate the observations from the sensing system. The results in this paper present a first large-scale validation in pavement structures for a 14 piezopowered sensing system combined with a new response-only based approach for data reduction and interpretation. The proposed data 15 analysis method has demonstrated a very early detection capability compared to classical inspection methods, which unveils a huge potential for improved pavement monitoring. DOI: 10.1061/JPEODX.0000397. © 2022 American Society of Civil Engineers. 16

17 Introduction

7 6 Flexible pavements are the most expensive assets in modern society 19 (NAPA and EAPA 2011) and yet pavement engineers have not 20 found a way to delay its weakening nor to provide an easy tool to 21 monitor its condition (Ullidtz and Ertman Larsen 1989; Brown 22 1998; Xue et al. 2012; Robbins et al. 2017). Pavements, as any 23 other structure, age and deteriorate as a function of time; these ef-24 fects are accelerated by asphalt mixture aging (Xue et al. 2014), 25 cumulative loading (Brown and Peattie 1974; Dessouky et al. 26 2014), environmental conditions (Leiva-Villacorta et al. 2016), 27 and/or inadequate maintenance. Thus, knowing its current condi-28 tion and estimating its future performance is a matter of high im-29 portance for road owners and decision makers (Lajnef et al. 2013).

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New developments for evaluating pavement condition using in situ pavement sensors (Sohn et al. 2003; Lajnef et al. 2011; Manosalvas-Paredes et al. 2019; Bahrani et al. 2020; Iodice et al. 2021) are an alternative to the more traditional destructive methods and external evaluation methods (Verma et al. 2013; Marecos et al. 2017). Detecting damage at its earliest stages is important for almost every industry. Farrar and Worden (2007) defined damage as the change of material and/or geometrical properties of the system including changes of the boundary conditions and system connectivity. It is worth mentioning that most damage detection methods rely on comparing the mechanical response of the damaged structure, which most of the time come from computer simulations, to the intact state or undamaged state (Del Groso 2013). In addition, damage does not necessarily imply a total loss of system functionality but rather that the system is no longer operating in its optimal manner. Thus, damage will grow until it reaches a point in which it affects the system operation and is no longer acceptable to the user (Sohn et al. 2003; Brownjohn 2007).

The previous definitions tie perfectly with what pavements engineers have been using to define damage over the last decades in terms of structural capacity (layer moduli) (Manosalvas-Paredes et al. 2017) or functional performance [international roughness index (IRI), present condition index (PCI)] (Susanna et al. 2017). Outlining thresholds for assessing pavement condition is not a simple task; therefore, continuous monitoring is foreseen as a solution for the coming years (Alavi et al. 2016). So far, neither functional nor structural evaluation has fulfilled, by itself, those requirements and has opened the door for new technologies to arise such as structural health monitoring (SHM) (Sohn et al. 2003; Brownjohn 2007; Farrar and Worden 2007). The most widely accepted definition for SHM refers to the process of implementing a damage identification strategy for aerospace, civil, and mechanical engineering infrastructure (Farrar and Worden 2007; Di Graziano et al. 2020). SHM ought to provide the tools to progress from common, but erroneous, time-based maintenance philosophies to a more costeffective condition-based maintenance philosophy. Nonetheless, technical challenges have been identified (Doebling et al. 1996; 67 Sohn et al. 2003) and will have to be addressed before a true implementation occurs. Therefore, this paper investigates the opera-68 69 8 tional evaluation and data acquisition, normalization, and data reduction of a novel self-powered sensor developed at Michigan 70 71 State University (MSU) (Alavi et al. 2016; Hasni et al. 2017) and 72 compares it with two commercial strain gauges from well-known 73 9 manufacturers, Dynatest and Tokyo Measuring Instruments Labo-74 ratory. Advantages of the piezopowered sensing system compared 75 to conventional strain gauges include: low power requirements (80 nW), self-powered continuous sensing, low-cost, small-size, 76 77 10 autonomous computation and nonvolatile storage of sensing variables, and wireless communication (Lajnef et al. 2013). 78

79 11 The objective is to validate the compressed cumulative load-80 ing event approach, implemented in the previously developed 81 piezofloating-gate (PFG) sensor (Chatti et al. 2016), in detecting 82 bottom-up fatigue cracking through full-scale testing at The 83 French Institute of Science and Technology for Transport, Spatial Planning, Development and Networks (IFSTTAR) circular test 84 track by measuring longitudinal strains at the bottom of the 85 asphalt concrete (AC). Falling weight deflectometer (FWD) mea-86 surements have been performed at 0.0, 0.5, and 1.0 million loads 87 and are used as reference points. Layered elastic theory (LET) is 88 89 used for back-calculating the layer moduli for the different layers 90 and for obtaining the pavement responses at different depths using 91 the French standard axle of 13 t composed of dual wheels (Corté 92 and Goux 1996).

This paper is structured as follows. Section 2 describes the pie-93 12 94 zoelectric sensor used in the IFSTTAR tests and data compression 95 protocol. Sections 3 and 4 describe the test sections, distribution of 96 sensors, their basic technologies, and the experimental measurements. Sections 5 and 6 presents results from FWD measurements 97 and sensors data, and discussion. Finally, Section 7 presents some 98 conclusions and recommendations for further research. 99

Piezoelectric Sensors and Data Compression 100 Protocol 101

PVDF Sensed Response (V)

Piezoelectric sensors have become more popular in strain and vi-102 103 bration sensing due to their ability to harvest mechanical energy from ambient variations. In that sense, researchers at Michigan 104 105 State University have shown that piezoelectric transducers, under traffic loading, can harvest the induced microstrain deformation 106 in the asphalt layer to power up the electronics of the novel PFG 107 sensor (Lajnef et al. 2011; Chatti et al. 2016; Hasni et al. 2017). 108 109 A complete description of the sensor can be found in Lajnef et al. (2013), Aono (2017), Aono and Pochettino (2018), and Aono et al. 110 111 (2019).

 $\Delta_6(1)$

 $\Delta_{5}(1)$

 $\Delta_4(1)$

 $\Delta_3(1)$

 $\Delta_2(1)$

 $\Delta_1(1)$

 $\Delta_4(2$

 $\Delta_3(2$

 $\Delta_1(2)$

Within this research, a rectangular polyvinylidene fluoride (PVDF) membrane, similar to the one installed in the PFG sensor, was used to sense the deformations. Fig. 1(a) shows a general rep-13 114 14 resentation on how the PVDF measures whereas Fig. 1(b) shows how the measurements are clustered in a histogram, which can be represented as a cumulative distribution function (CDF), Eq. (1). Statistical parameters of the CDF such as the mean (μ) and the standard distribution (σ) can be considered as indicators of damage 15 119 progression whereas α and g are fitting constants (Hasni et al. 16 12017) 2018)

$$F(\varepsilon) = \frac{\alpha}{2} \left[1 - erf\left(\frac{(g-\mu)}{\sigma\sqrt{2}}\right) \right] \tag{1}$$

The novelty behind the proposed data compression protocol is 122 that all external parameters affecting the change in pavement re-123 sponses (i.e., traffic loads, environment, construction, and so on) 124 can be grouped within the distribution of measurements over time. 125 Thus, the only parameter able to cause a shift in the CDF is the 19 126 formation of damage in the structure represented by the number 127 of threshold levels $(D_1 \text{ to } D_7)$ that are open. 128

Accelerated Pavement Test Setup

This section presents an overview of the elements that are needed to perform an accelerated pavement test (APT). 131

Circular Test Track

The circular test track (CTT), Fig. 2, developed by IFSTTAR, is 133 an outdoor APT dedicated to full-scale pavement experiments. 134 The CTT has a central electrohydraulic motor unit which can be 135 equipped with various load configurations simulating half-axles 136 of heavy vehicles (Taylor et al. 2013). The CTT has a track average 20 137 perimeter of 120 m and can be loaded at a maximum speed 138 of 100 km/h. 139

Sensors Outline

 $\Sigma \Delta_1(i)$

 $\Sigma \Delta_2(i)$

 $\Sigma \Delta_3(i)$

 $\Sigma \Delta_4(i)$

 $\Sigma \Delta_5(i)$

D D

 $\Sigma \Delta_6(i)$

 $\Sigma \Delta_7(i)$

D-

Fig. 3 shows the distribution of both traditional and piezoelectric 141 sensors placed at the bottom of the asphalt layer. As it is seen, a 142 majority of the sensors were placed parallel to the direction of the 143 load; Sensor H4 is the only one placed perpendicular to the direc-144 tion of the load. Finally, Sensors H5, H6, and H8 were placed at 145 radii of 18.40, 18.70, and 19.30 m, respectively, to study the effect of varying the position of the load wandering during testing. 21 147





Cumulative Loading Time D D D Time **Deformation Levels** (a) (b) Fig. 1. PVDF work representation. (Data from Lajnef et al. 2013.)

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D-D₆

D

 D_4

D₂

 D_2

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Fig. 2. IFSTTAR circular test track.



148 Traditional Instrumentation

F2:1

F3:1 22

149 A brief description of the two commercial strain gauges follows.

150 23 Tokyo Measuring Instruments Lab

151 24 Strain gauge type KM-100HAS has an apparent elastic modulus of 152 approximately 40 N/mm², resistance of 350- Ω full bridge, rated 153 output approximately of 2.5 mV/V, capacity of $\pm 5,000 \times 10^{-6}$

154 strain, and temperature range between -20° C and 180° C.

155 Dynatest PAST-II-AC

156 The Dynatest PAST-II-AC is an H-shaped precision transducer spe-157 cially manufactured for strain measurements in hot-mix asphalts. 158 The transducer has an apparent elastic modulus of approximately 159 2.2 N/mm², a resistance of 120- Ω quarter bridge, physical range of 160 25 up to 1,500 $\mu \varepsilon$, sensitivity of 0.11 N/ $\mu \varepsilon$, and temperature range

161 between -30° C and 150° C.

162 Materials

Table 1 shows the mechanical properties of the coarse aggregate
used to manufacture the high modulus asphalt mix [enrobé à module elevé (EME)] EME2, which is a high-performance asphalt mix
used for base layers. EME2 is made out of 20% reclaimed asphalt
and a hard binder of 20/30 penetration grade, with a total binder

 Table 1. Characteristics of the aggregates according to the European
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 Union specification system
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Test and standard	Requirement	Fraction 10/14 mm
Percentage of crushed surfaces, % of mass (EN 933-5)	100	100
Flakiness index (EN 933-3)	≤20	07
Los Angeles abrasion (EN 1097-2)	≤15	09
Polished stone value (EN 1097-8)	≥56	>50

content of 5.5%. EME2 asphalt mixtures are commonly used in168France for base layers, and it is considered a reference material with169a well-known behavior. Pavement structure is composed of three170layers: 102 mm of asphalt, 760 mm of unbound granular base, and1711,600 mm of stone bed as subgrade, see Fig. 4.172

Methodology

The APT started on November 14, 2017, and finished on February17415, 2018, and a total of 999,200 load repetitions were applied. Each175arm (four in total) was equipped with a single-axle dual-wheels and176carried 65 kN corresponding to half of the standard French axle177load (Corté and Goux 1996). An approximate velocity of 76 km/h178corresponding to 10.0 rounds per minute was used to move the179



180 arms around the CTT. During the APT, FWD measurements, visual 181 observation, and sensor measurements were made at different time 182 steps to monitor its evolution. These are described hereafter.

FWD Measurements 183

184 Measurements were made at 0.0, 0.5, and 1.0 million load repetitions with a Dynatest FWD model 8002-077. Deflections were 185 186 used to back-calculate the individual layer moduli of the pavement 187 based on the layered elastic theory. Results were used as control 188 points.

Visual Observation 189

190 The extent of cracking is defined as percentage of cracked length, 191 Eq. (2), where L_i represents the length of cracked zone. For lon-192 gitudinal cracks, the crack length corresponds to the measured length of the cracks whereas for transverse cracks, a length of 193 500 mm is conventionally attributed to each crack. Surface cracks 194 were marked with different colored paints in order to identify their 195 evolution in time 196

Extent of cracking(%) =
$$\frac{\sum_{i} L_{i}}{L}$$
 (2)

Sensor Measurement

Sensor measurements from strain gauges and piezoelectric sensors were made at approximately every 20,000 loads. Nonetheless, in order to determine which sensors survived construction, a first batch of measurements was collected after only 5,000 loads.

Fig. 5(a) shows the strain pulse time histories after 5,000 loads for commercial Strain gauges L1, L2, and DY2. Fig. 5(b) shows the 28 203 first four strain pulses, grouped, for strain gauge DY2 as well as the mean pulse considered as representative and illustrated by a red 29 205 line. Similarly, piezoelectric measurements in terms of voltage were also recorded at 5,000 loads. Fig. 6(a) shows the measured voltage for Sensor H3 and Fig. 6(b) shows the mean voltage where some noise is seen. The shape of the voltage signal is different from the strain signal shape for two reasons: (1) the selected piezotransducers for this work were designed to respond only to tension and not in compression; and (2) the negative voltage component is generated during the unloading phase. The overall signal is thus descriptive of the tensile loading and unloading phases, the critical components for fatigue damage.

The maximum peak values from the strain gauges and piezoelectric sensors are then used to track pavement response and damage evolution with increasing number of load repetitions.



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Experimental Results 219

This section presents the results and interpretation of the mea-220 221 sured data.

222 FWD Measurements

223 Deflections are the most used parameter by pavement engineers to 224 relate the structural condition of a pavement. Center deflection is associated with the overall state of the pavement while the deflec-225 226 tion basin, generated by the outer geophones, is associated with the 227 condition of the underlying layers.

Deflection Data 228

229 Figs. 7-9 show the change in deflection profiles in which it is seen 230 how the variability in measurement increase with the number of load repetitions. Higher variations occur between the center deflec-231 232 tion and deflections measured at 600 mm from the center, allowing 233 the researchers to believe that the majority of damage occur in the 234 upper layers.

235 Fig. 10 corroborates the previous statement as it shows the change in deflection, absolute value, between 0.5 and 1.0 million 236 237 loads. Comparison has been made at Stations 7, 12, 18, 24, and 238 29 m. In here, it is seen that the major changes occur between 239 3 18 and 29 m, where deflections increase to around 120 microns and that the majority of change is limited to the upper layers. 240

Geophone Spacement (mm)

Geophone Spacement (mm) 300 600 900 1200 1500 1800 0 450 0 400 350 100 300 mm) 200 250 200 300 150 400 100 500 50 n

Fig. 8. Deflection profile at 0.5 million load repetitions.

Layer Moduli Back-Calculation

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Back-calculation is a mechanistic evaluation of pavement structural 242 response that uses the deflections measured and attempts to match 243 them with the calculated deflections by adjusting the pavement 244 layers moduli. Back-calculation is an iterative procedure in which 245 the layer thickness is a key input. This research has used Dynatest 246 Elmod6 software to back-calculate the different layer moduli of the 247 pavement. Moreover, this research has limited the thickness of 248 the unbound granular base to 350 mm for the analysis. Fig. 11 show 249 the back-calculation process in which the measured and calculated 250 deflections are compared. Absolute differences in deflections have 251 been chosen for the acceptance criteria. Table 2 shows the average 252 moduli and standard deviation (STDV) for the different layers at 253 0.0, 0.5, and 1.0 million loads. Back-calculated asphalt moduli 254 has been corrected to a reference temperature of 20°C following 255 Highways England CS 229 "Data for Pavement Assessment" 34 256 Equation 4.45. 257

Pavement Responses

Theoretical pavement responses have been calculated using a dual-259 wheel single-axle configuration to carry the 13-t load, tire pressure 260 of 0.66 MPa, and wheel distance (center to center) of 376 mm. 261 Table 3 shows the horizontal tensile strain at the bottom of the 262 asphalt layer (102 mm) and the vertical compressive strain on 263 the surface of the subgrade (452 mm) at 0.0, 0.5, and 1.0 million 264 loads, respectively. Finally, the relative standard deviation (RSD) is 265 included to show the variability of the results with time (damage). 266

Visual Observation

Fatigue performance was evaluated visually by recording the cracks 268 on the pavement surface as a function of the number of applied 269 loads. The first surface cracks appeared after 0.9 million load rep-270 etitions and were represented with a white line, see Fig. 12. At the 271 end, a total cracked area of 4.0% was reported. 272

Sensors Measurements

Fig. 13 shows the evolution of average sensor responses with num-274 ber of load repetitions. Fig. 13(a) show responses for commercial 275 Strain gauge DY2 in which it is seen how the maximum longitu-276 dinal strain increases from 121 to 194 $\mu\varepsilon$ and finally to 276 $\mu\varepsilon$. 277 Fig. 13(b) on the other hand show responses for piezoelectric 278 Sensor H3 in which it is seen how the measured voltage goes from 279 0.027 to 0.026 V and finally to 0.059 V. Voltage measurements 280



Fig. 9. Deflection profile at 1.0 million load repetitions.



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F8:1





Fig. 10. Change in deflections absolute value between 0.5 and 1.0 million load repetitions.







Fig. 11. Back-calculation following LET at 0.0 million load repetitions.

37 36 Table 2. Back-calculation average values at 0.0, 0.5, and 1.0 million load repetitions

			Layer						
T2:2	Load (millions)	T (°C)	AC (MPa)	AC 20°C (MPa)	STDV	UGM (MPa)	STDV	Subgrade (MPa)	STDV
T2:3	0	27.9	10,524	16,395	1.08	122	1.04	202	1.03
T2:4	0.5	10.3	27,529	17,973	1.16	115	1.09	167	1.03
T2:5	1	12.6	18,423	13,152	1.91	98	1.28	158	1.08

188 Table 3. Average pavement responses at 0.0, 0.5, and 1.0 million load repetitions

T3:1 T3:2	Load (millions)	Horizontal tensile strain			Vertical compressive strain		
		Average	STD	RSD (%)	Average	STD	RSD (%)
T3:3	0.0	-116.13	6.8	-5.9	212.93	9.2	4.3
T3:4	0.5	-125.90	13.8	-10.9	252.95	20.7	8.2
T3:5	1.0	-211.75	106.14	-50.1	306.30	85.94	28.1



F12:1 Fig. 12. Condition of the pavement after 1.0 million load repetitions.

remain nearly the same for the first half of the test followed by a rapid growth.

Fig. 14 shows the increment of the average maximum longitudinal strain (DY2) and sensor voltage (H3) throughout the entire test. As it is seen, both trends correspond to each other, especially after about 600,000 load repetitions when the responses increase. Figs. 15 and 16 show the novel sensing approach called cumulative voltage time (CVT) for piezoelectric Sensors H3 and H7, respectively. The CVT is calculated when the input signal (voltage) exceeds one or more of the preset threshold levels, after which, the integrated voltage-time value is recorded (Alavi et al. 2016). The resulting value is proportional to the strain above the selected threshold level, and it is referenced to in this paper as a threshold level, see Fig. 1. 287

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Fig. 15 shows that the rate of increase in CVT for piezoelectric Sensor H3 (longitudinal sensor voltage) increases after about 600,000 load repetitions, which is linked to the waking-up of higher thresholds (Levels 4 and 5). The same behavior is seen after about 800,000 load repetitions in which the highest thresholds (Levels 6 and 7) wake up. Fig. 16 does not show a clear increase in rate for the higher threshold values (Levels 4 and higher); however, it shows a mild increase after about 400,000 cycles, suggesting an appearance of damage initiation.

Discussion

Deflection profiles, see Fig. 10, have shown that the higher varia-305 tion in deflections occurred between 18 and 24 m of the test section. 306 Fig. 17, on the other hand, summarizes these variations in percent-307 age considering the entire deflection basin between 0.5 million 308 loads, see Fig. 8, and 1.0 million loads, see Fig. 9, repetitions. Once 309 309 again it is seen that the main differences occurred in the upper 310 layers (from G_1 to G_3), whereas the outer geophones (G_6 and be-311 yond) show relatively lower changes. Based on this, it can be 312 concluded that most of the damage is taking place in the asphalt 313 layer. 314

Fig. 18 shows the theoretical reduction in the asphalt layer315modulus with the increase in load repetitions, between 0.5 and3161.0 million load repetitions. This research has found a reduction317in the asphalt moduli of 3%, 52%, 49%, and 32% for Stations31812, 18, 24, and 29 m, respectively. Reductions of 50% or more319in the asphalt concrete modulus is considered as a failure criterion320







F14:1 **Fig. 14.** Longitudinal strain and sensor voltage evolution throughout the entire test (DY2 data in microstrain and H3 data in voltage).



321 (Manosalvas-Paredes et al. 2017). This research found the lowest

asphalt modulus, after 1.0 million load repetitions, at Station 22 mwith a value of 4,361 MPa.

324 This research focuses on pavement responses; hence, Fig. 19 325 shows the theoretical changes in calculated strains using the 326 back-calculated moduli. For Stations 12, 18, 24, and 29 m, the in-327 crement in the longitudinal strain, between 0.5 and 1.0 million load 328 repetitions, is 5%, 95%, 70%, and 99%, respectively. Furthermore, 329 Figs. 18 and 19 show a clear inverse relation between their re-330 sponses (decrease in modulus results versus an increase of the 331 strain). These results confirm what was presented in Fig. 10, show-332 ing that the critically damaged area is located between Stations 18 333 and 29 m.

Visual observations are clearly not a good approach for
detecting early pavement deterioration because it may be too late
when cracks appear at the surface of the pavement (for classical
bottom-up fatigue). In this experiment, the first surface cracks were

observed shortly after 900,000 load repetitions; on the other hand, 338 piezoelectric sensors with the novel data approach showed an in-339 crease in responses just after 600,000 load repetitions, thus warning 340 the user of possible surface cracks in the near future so it could be 341 avoided or delayed through proper maintenance activities. This 342 behavior is seen in Fig. 15 (H3 longitudinal sensor voltage) in 343 which the CVT starts activating (change in trend) more levels after 344 600,000 load repetitions indicating that damage is starting to occur. 345 Highest levels (Threshold 6 and 7) are only activated after 900,000 346 load repetitions, which relates perfectly with the visual observation. 347 Fig. 16 on the other hand shows a weaker increase in trend, indi-348 cating that the appearance of surface cracks will take a longer time 349 to materialize, suggesting that fatigue cracking was better assessed 350 using piezoelectric Sensor H3. 351

When the strain amplitude starts to increase under the repetitive352loading, the harvested voltage increases as well, which resulted in
activating higher threshold levels. Finally, it is seen that the353

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threshold level activation is a good indicator of damage severity.
Higher levels are sensitive to high strains (i.e., to severe cracking)
whereas lower levels are useful to detect the early onset of fatigue
cracking.

359 Conclusions

360 This paper presented, for the first time, an approach for monitoring 361 pavement condition based on piezoelectric sensors technology through a full-scale accelerated pavement testing experiment. 362 The novel idea in this research is to use the cumulative strain sta-363 tistics experienced by the pavement structure instead of the entire 364 365 time-history. This will benefit self-powered sensors by reducing the amount of data to transmit wirelessly and optimize the energy con-366 367 sumption of the whole system.

From the results and discussion presented, in which pavement deterioration increased with increasing number of load repetitions, it is concluded that the new type of piezoelectric sensor has been successfully validated with a worldwide known strain gauge in fullscale testing environment.

This research has found that the cumulative loading time of piezovoltage is a good indicator of damage progression and the timing of the activation of sensor thresholds with different voltage levels are good indicators of damage severity. This finding is significant given that the results are from sensors that have been installed in a full-scale pavement section that has been subjected to fatigue testing, thus confirming the validity of the sensors early detection of fatigue damage outside laboratory conditions.

The results of this phase validated the potential of using selfpowered piezofloating-gate sensors for fatigue assessment of pavements under real operating conditions. Thus, the next research

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Fig. 18. Difference in back-calculated asphalt moduli for different stations.



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- step will focus on implementing a larger number of piezoelectric 384 385 sensors in an actual in-service road.
- Further research should investigate the optimization of the 386 387 number and location/layout of sensors within the pavement section under real traffic loading conditions. 388

Data Availability Statement 389

390 Some or all data, models, or code generated or used for this paper 391 are available from the corresponding author by request (raw signals 392 from APT experiment, FWD data, MATLAB code, and temperature 393 profiles).

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