

## Research Article

# Comparing of Data Collection for Network Level Pavement Management of Urban Roads and Highways

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Pavement condition data are collected by agencies to support pavement management system (PMS) for decision-making purpose as well as to construct performance model. The cost of pavement data collection increases with the increase of survey frequencies. However, a lower monitoring frequency could lead to unreliable maintenance decisions. It is necessary to understand the influence of monitoring frequencies on maintenance decision by considering the reliability of performance prediction models. Because of different maintenance conditions of urban roads and highways, their performance show different trends. In this paper, the influence of pavement monitoring frequency on the pavement performance models was investigated. The results indicate that low collection frequencies may result in delay in maintenance action by overestimating pavement performance. The collection frequency for Pavement Condition Index (PCI) can be reduced without compromising the accuracy of performance model, more work should be done to ensure the PCI data quality, thus to guarantee the rationality of maintenance decisions. Effect of frequency reduction on pavement performance (IRI) models of urban roads seems greater than on pavement performance (IRI) models of highways, which may lead to heavier monitoring work for urban roads management. This paper provided an example which demonstrated how a comparative analysis can be performed to determine whether the current data collection plan can provide sufficient data for time series analysis.

## 1. Introduction

Pavement condition data are collected periodically by agencies and are used to construct pavement performance models, perform cost-effectiveness analysis, conduct maintenance, rehabilitation analysis, etc. Due to limited budgets and different response requirements, agencies monitor pavement condition at 1-, 2- or 3-year frequencies [1]. IRI (international roughness index) and rut depth data are not recommended to be collected annually on county roads for lower traffic volumes [2]. IRI is widely accepted and used for evaluating pavement condition, establishing performance models and performing cost-effectiveness analysis of maintenance strategies [3–6]. However, it is proved that IRI cannot be a unique predictor of pavement condition ratings with 41% of the variation in PCI (pavement condition index) remains unaccounted by IRI [7]. Haider et al. found that more frequent data collection for image-based methods (for PCI collection) can reduce the associated risk in performance prediction and

thus be more effective for better decision making for pavement management [8]. As PCI is an image based index, the accuracy of PCI mainly depends on the image quality. Moreover, systematic and random errors can highly distort some output parameters of PMS (pavement management system), even in error ranges that may be considered acceptable in practice [9]. IRI and PCI are two common used performance indices to characterize pavement performance at both network-level and project-level for both urban roads and highways [5, 6, 9–12].

IRI is calculated from surface profile in longitudinal direction by the quarter-car model [28]. PCI is calculated by pavement distress ratio, which is a function of types of distresses, severity levels and weight. The range of PCI is from 0 to 100, with 100 indicating a pavement surface is free of distress. IRI is also the most frequently collected pavement condition data by highway agencies in the United States [14, 15]. Therefore, many studies utilized IRI to construct performance models and perform further analyses [13, 16]. It is necessary for highway agencies to understand the source of errors for IRI and

its influence on performance evaluation. Some of the previous studies were conducted to investigate the source of uncertainty on IRI from the perspectives of collection and calculation methods [17–21]. And some of other studies even questioned the use of this index for road quality evaluation [22, 23].

Besides data accuracy, the number of data samples is also responsible for the reliability of performance prediction. The number of data samples is associated with the pavement monitoring frequencies. Haider et al. found that the frequency of condition data collection has a significant effect on the performance prediction, higher variability in the data will introduce higher Squared Error (SE) in the fitted model, and data collection frequency can be decreased with higher data accuracy [24]. Xu and Tsai studied the influence of equal time interval and unequal time interval under the same monitoring frequency on prediction of pavement service life, they found the estimated accuracy of pavement service life would be significantly improved for unequal interval monitoring ways compared to that of equal interval monitoring ways under the same monitoring frequency [25, 26].

Subject to different traffic conditions, data survey methods of urban roads and highways are different. Highway performance indices including IRI, PCI, and RDI are investigated during the daytime with high speed. However, IRI surveys for urban roads have to be done during the night to avoid traffic congestions, and PCI surveys have to be done at a low speed during the daytime. The agencies need to understand how the difference in data collection frequencies may influence the pavement performance model. With this knowledge, agencies can optimize the data collection plans. Thus they can reduce the frequency without compromising the preciseness and accuracy of analysis. The objective of this study is to compare the influence of data collection frequency on performance models of urban roads and highways. Pavement condition index (PCI), international roughness index (IRI) are utilized for constructing the performance models. As performance models have the potential to change to different deterioration rate with the changes in data collection method, history data collected by the same instrument are used in this paper.

## 2. Data Preparation

**2.1. Pavement Condition Data.** Road Administration Bureau of Shanghai has been collecting pavement condition data at the network level since 2004. By the end of 2017, the total number of urban road sections managed had been 5225, covering 4,873.361 km, and the total number of highways managed had been 9446, covering 13,292.397 km. Urban roads are classified into four different types, consisting of high-speed, arterial road, subsidiary road, and branch roads, depending on the speed limits, geometrics, etc. High-speed and arterial roads are surveyed and evaluated annually; the survey round of subsidiary and branch roads take 3 years. Highways are classified into four different types, consisting of high-speed, grade-one, grade-two, and grade-three.

The maintenance action may significantly change the shape of performance models. Therefore, only sections with no rehabilitation records are selected in this study. However, due to the

lack of routine maintenance records, it is hard to determine whether there are routine maintenance activities during the entire monitoring period. So, the change of performance condition index within these sections may be caused by either routine maintenance or test errors. In order to perform the time-series analyses, sections with monitoring period of at least 8 years and the number of surveys for at least 4 were selected to include sufficient sample data for analysis. Finally, 14 urban road sections and 11 highway sections were selected from the two databases of Pavement Management Systems (PMSs). Table 1 lists the inventory of the selected pavement sections. The detailed data are listed in the tables of the appendix (Tables 2–5).

Besides, we selected 2922 road sections in LTPP database to study this influence on IRI. 2518 sections unable to reflect performance decay are removed as the IRI value has been below two throughout the data collection cycle or the amount of data is less than three.

**2.2. Performance Model.** Commonly used linear relationship and exponential function [27] are considered due to its simplified form and the short time span data in this study. In linear model, slope indicates the general change of performance index over ages. In terms of PCI, slope less than zero indicates PCI decreases as the pavement age increases. In terms of IRI, slope greater than zero indicates IRI increases as the pavement age increases. In this study, linear model is expressed in Equation (1), exponential function is expressed in Equation (2).

$$Index = k \cdot Age + c, \quad (1)$$

where  $k$  is the slope and  $c$  is the intercept of the performance model.

$$Index = a \cdot \exp(b \text{ Age}), \quad (2)$$

where,  $a$  and  $b$  are the coefficients of performance model;  $\text{Age}$  represents pavement age.

## 3. Influence of Data Collection Frequency on Performance Model

**3.1. R Square Performance Model of IRI.** Changes of  $R$  square of IRI models for urban roads and highways are shown in Figure 1.

Figures 1(a) and 1(b) show  $R$  square values of IRI models for urban roads are all lower than 0.5, and positive and negative correlations are half-and-half. There seems no regular pattern for urban roads, and the nonlinearity of the pavement condition data is visible. Figures 1(c) and 1(d) show that  $R$  square values of IRI models for highway increase with the decrease of collection frequency with higher original  $R$  square value, but get an inverse trend with lower original  $R$  square value. Figures 1(e) and 1(f) show that mostly  $R$  square values of IRI models increase with the decrease of collection frequency, which may be due to the amount of the data.

Figure 1 also illustrates  $R$  square values have little difference between linear or exponential models. So only linear model is selected for further trend study.

TABLE 1: Inventory of selected pavement sections of urban roads.

Data source	Section id	Monitoring period (Years)	Collection records	Section length (meters)	Collection frequency	
					Original frequency (year/time)	Reduced frequency (year/time)
Urban road sections	JAS000004325	8	8	422	1	2
	JAS000004441	8	8	238	1	2
	HPS000010501	8	8	83	1	2
	HPS000010493	8	8	85	1	2
	HKS000003011	8	8	670	1	2
	HKS000003029	8	8	245	1	2
	XHS000007879	8	8	186	1	2
	XHS000007880	8	8	323	1	2
	CNS000000899	8	8	575	1	2
	CNS000000821	8	8	364	1	2
	YPS000014463	8	8	319	1	2
	YPS000014411	8	8	492	1	2
	YPS000014328	8	8	439	1	2
YPS000013433	8	8	440	1	2	
Highway sections	S121310115	10	10	8300	1	2
	X005310115	10	8	1230	1.25	2.5
	X009310115	10	10	8760	1	2
	X012310115	10	8	1960	1.25	2
	X030310115	10	9	6710	1.11	2
	X572310115	10	10	5440	1	2
	X574310115	10	10	1095	1	2
	X579310115	10	7	2400	1.43	2.5
	X581310115	10	10	7100	1	2
	X583310115	10	10	2603	1	2
X585310115	10	10	780	1	2	

3.2. *Performance Deterioration Trend of IRI.* Figures 2 and 3 illustrated the results of matched pair tests for the slopes and the intercepts of the linear models of IRI for original collection frequency and reduced collection frequency. The slope indicated the general trend of change of performance index. The average value of means, the average value of differences, the 95% upper bond, and the 95% lower bond are marked with red dotted line in Figures 2 and 3.

Figures 2(a), 2(b), 3(a), and 3(b) imply that the slopes of the linear models determined by original collection frequency may be higher than reduced collection frequency, which means reduction of data collection frequency may lead to an underestimation of pavement roughness condition. Figures 2(c) and 3(c) show an inverse trend that the slopes of the linear models determined by original collection frequency is lower than reduced collection frequency. Although data with the max IRI value below two are removed, most road sections from LTTP data have a good level of roughness, which is different from the data from PMS of Shanghai.

The performance rate of IRI change of urban roads is more discrete than the performance rate change of highways, which indirectly reflects the limitations of IRI data in urban road applications.

3.3. *R Square for Performance Model of PCI.* Changes of  $R$  square of PCI models for urban roads and highways are shown in Figure 4. The spots above the equity line indicate  $R$  square

value increased by reducing the collection frequency, whereas those spots below the equity line indicate the contrary trend.

Seen from Figure 4, the changes of  $R$  square values of linear and exponential models are similar for both urban roads and highways. The  $R$  square values increased with the decrease of collection frequency with higher original  $R$  square value (i.e.,  $R$  square greater than 0.5). And there is no consistent trend of  $R$  values with lower original  $R$  square value (i.e.,  $R$  square less than 0.5), which implies there is no obvious influence of collection frequency on construction of performance model with lower original  $R$  square value. This means the increase of data samples may decrease  $R$  square depending on data variability, the decrease of collection frequency may not necessarily compromise the precision and accuracy of performance model. Comparing the data with higher original  $R$  square value to the data with lower original  $R$  square value, it is indicated that ensuring the data quality is much more necessary than increasing the collection frequency for pavement performance models construction. It was also found that there was no significant change of  $R$  square between two models (linear model and exponential model).

For urban roads, performance model of PCI based on higher frequency is more proper for a certain project with clear maintenance history but may be inappropriate for net level management. For performance model construction and evaluation on average condition in a certain area, data collection frequency can be reduced to 2-3 years.

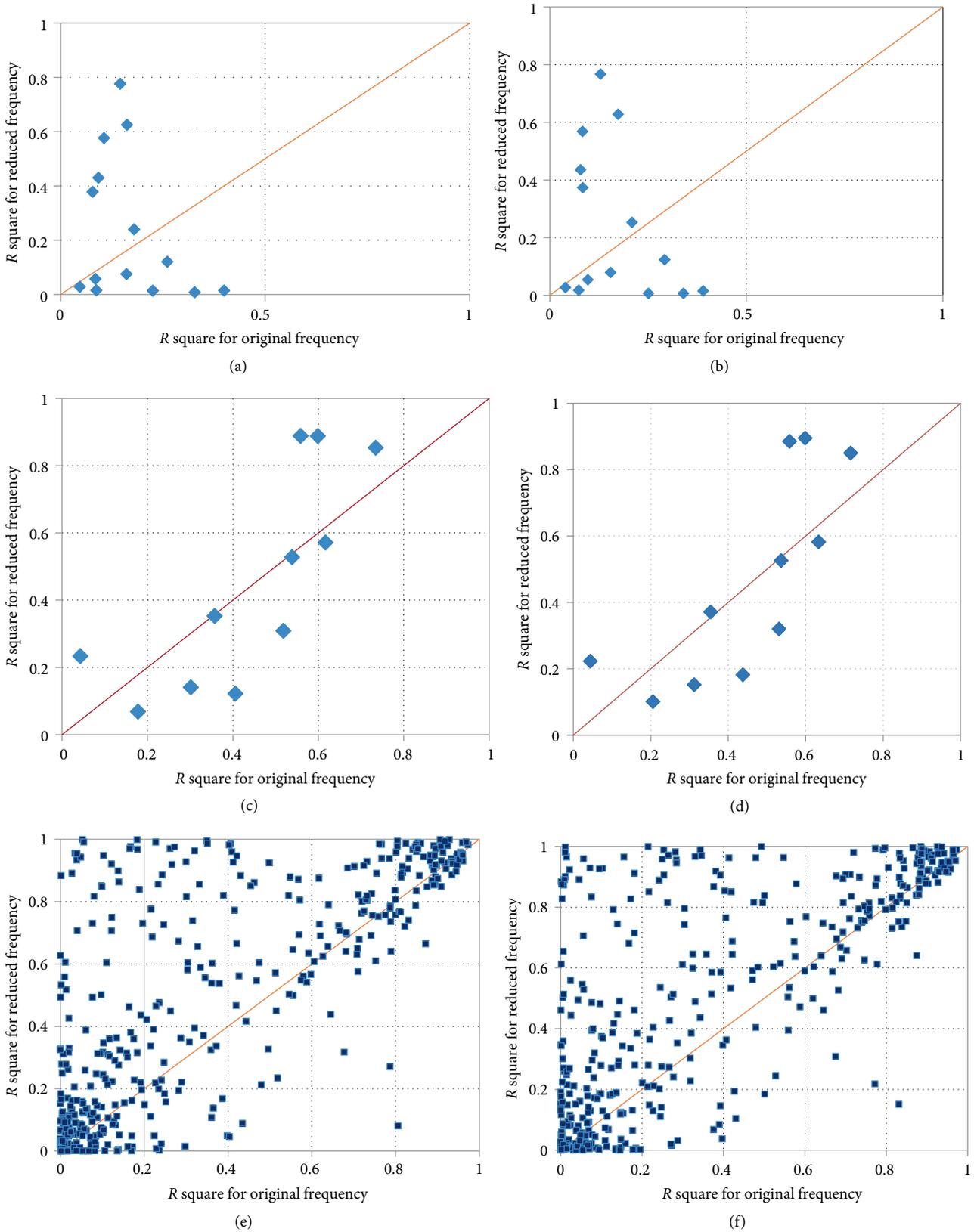


FIGURE 1:  $R^2$  of performance models for IRI ((a, b) are for urban roads, (c, d) are for highways, (e, f) are for LTPP data). (a) Change of  $R^2$  for linear model. (b) Change of  $R^2$  for exponential model. (c) Change of  $R^2$  for linear model. (d) Change of  $R^2$  for exponential model. (e) Change of  $R^2$  for linear model. (f) Change of  $R^2$  for exponential model.

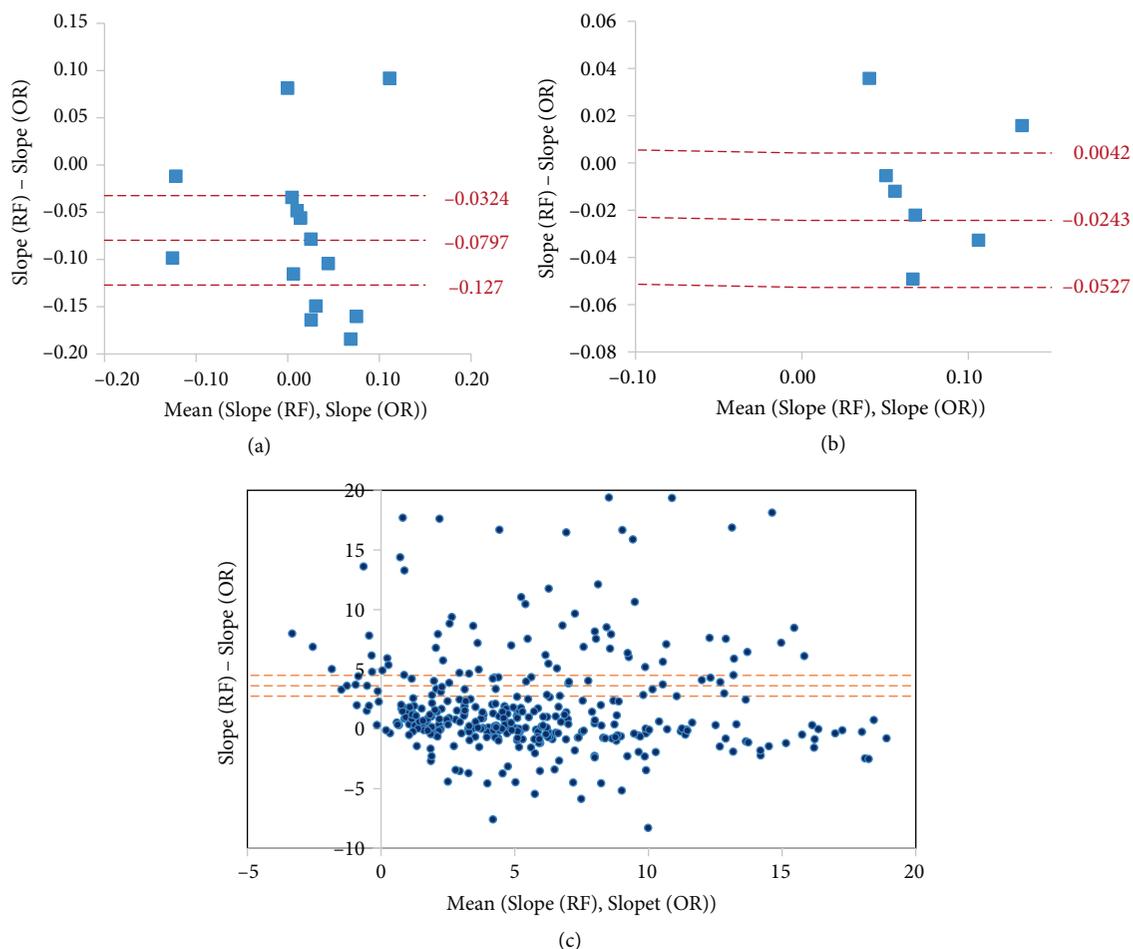


FIGURE 2: Matched pairs of slopes for IRI ((a) urban roads, (b) highways, and (c) LTPP data).

The reliability of performance model (RPM) of urban roads (Figure 4(a)) is more discrete than the RPM of highways (Figure 4(b)), which may be due to the higher frequency of routine maintenance on some specific roads or data errors due to survey condition.

**3.4. Performance Deterioration Trend of PCI.** Figures 5 and 6 illustrated the results of matched pair tests for the slopes and the intercepts of the linear models of PCI for original collection frequency and reduced collection frequency. The slope indicated the general trend of change of performance index. The average value of means, the average value of differences, the 95% upper bond and the 95% lower bond are marked with red dotted line in Figures 5 and 6.

Seen from Figures 5 and 6, results indicate that the slopes of the linear models determined by original collection frequency are not significantly lower than the slopes of the linear models determined by reduced collection frequency for both urban roads and highways. Since zero values are within 95% confident interval, the general deterioration rate of the performance model may be slightly changed by reducing the collection frequency.

However, there is possibility that the performance deterioration rates of urban roads are underestimated by decreasing the collection frequency (Figures 5(a) and 6(a)). With the

deterioration trend underestimated, there might be delay of maintenance activities, so frequency of PCI data collection for main urban roads should not be reduced. The performance rate change of urban roads is more discrete than the performance rate change of highways, which also reflects the worse data quality of urban roads compared to highways.

## 4. Discussions and Conclusions

To evaluate the influence of different pavement monitoring frequencies on the accuracy of pavement performance models, 14 urban roads and 11 highways selected from PMSs of Shanghai and 404 road sections from LTPP database were investigated. The performance models with reduced monitoring frequencies and original frequencies were compared for the analysis. Based on the analyses above, several conclusions can be summarized as below:

- (1) The influence of data collection frequency on the accuracy and preciseness of performance models depends on the variability of raw data. With low variability, the decrease of collection frequency may not necessarily affect the performance model.

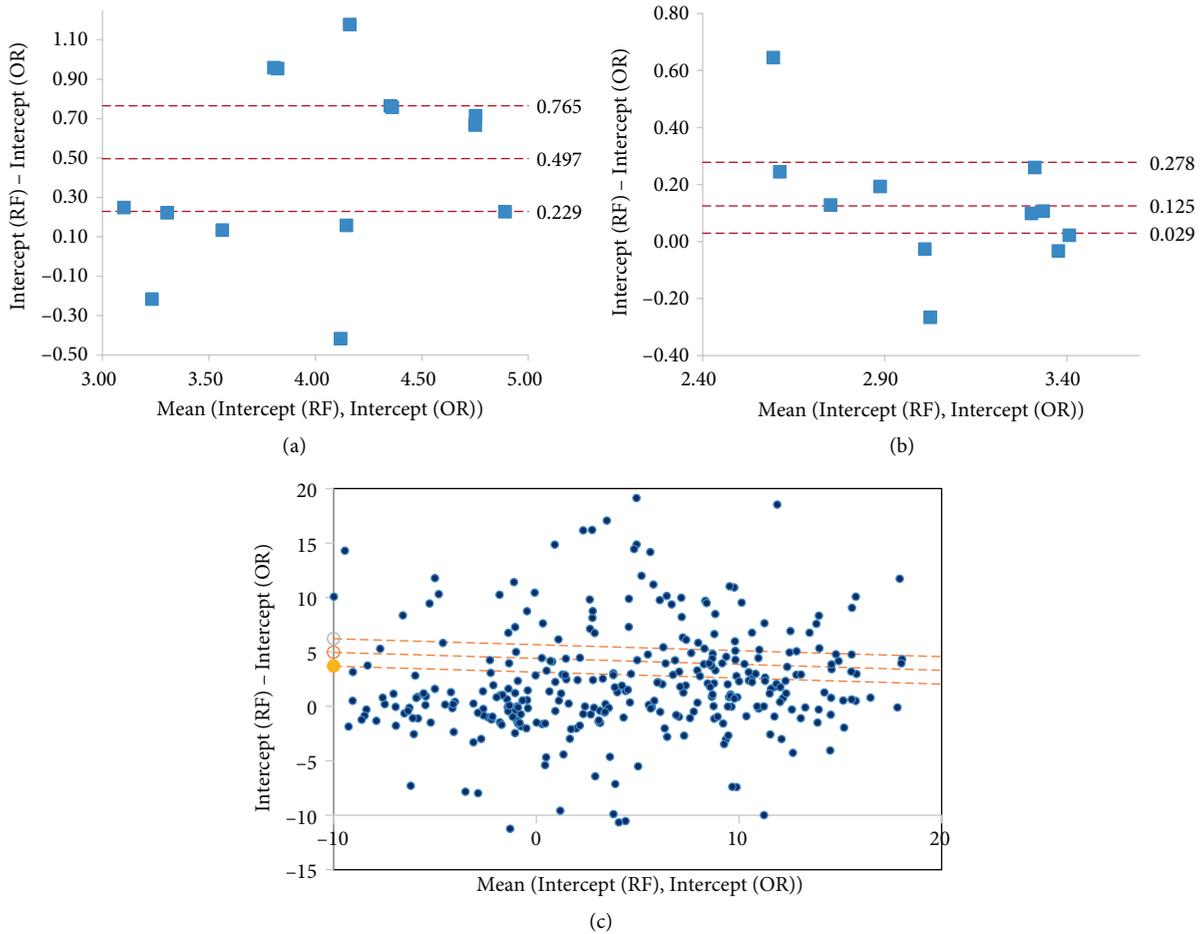


FIGURE 3: Matched pairs of intercept for IRI ((a) urban roads, (b) highways, and (c) LTPP data).

- (2) For urban roads, performance model of PCI based on higher frequency is more proper for a certain project with clear maintenance history but may be inappropriate for net level management. And for performance model construction and evaluation on average condition in a certain area, data collection frequency can be reduced to 2-3 years.
- (3) For both urban roads and highways, the decrease of collection frequency may underestimate the deterioration rates of IRI while may not necessarily influence the general trend of PCI of highways. Ensuring the data quality of PCI seems much more necessary than increasing the collection frequency for pavement performance models construction.
- (4) The performance rates of IRI change of urban roads is more discrete than the performance rate change of highways, which is consistent with PCI. Besides, IRI data of urban roads seem unreliable in the time dimension, which means urban roads are not suitable for IRI model construction.
- (5) Effect of frequency reduction on IRI models with higher values seems greater than on IRI models with lower values, which means collection frequency should be rescheduled according to pavement conditions.
- (6) Comparing with IRI, PCI seems less sensitive to collection frequency. Therefore, a decrease of collection frequency for PCI of highways may be considered, more work should be done to ensure the PCI data quality, thus to guarantee the rationality of maintenance decisions. However, for a certain project, routine maintenance and condition indices data collection may need higher frequency.

This paper presented a comparative analysis of urban roads and highways, by analyzing the influence of collection frequency on the performance model based on historical data at the network level PMS application, to find the difference between urban roads and highways management. An increase in sample rates is necessary when the current data collection plan results in high variability of the performance model, whereas a decrease in sample rate is recommended when the general trend of the performance model is stable with low variability. One should also be aware that some of the findings in this paper are established based on datasets in certain area (Shanghai of China), which may not be applicable to other areas.

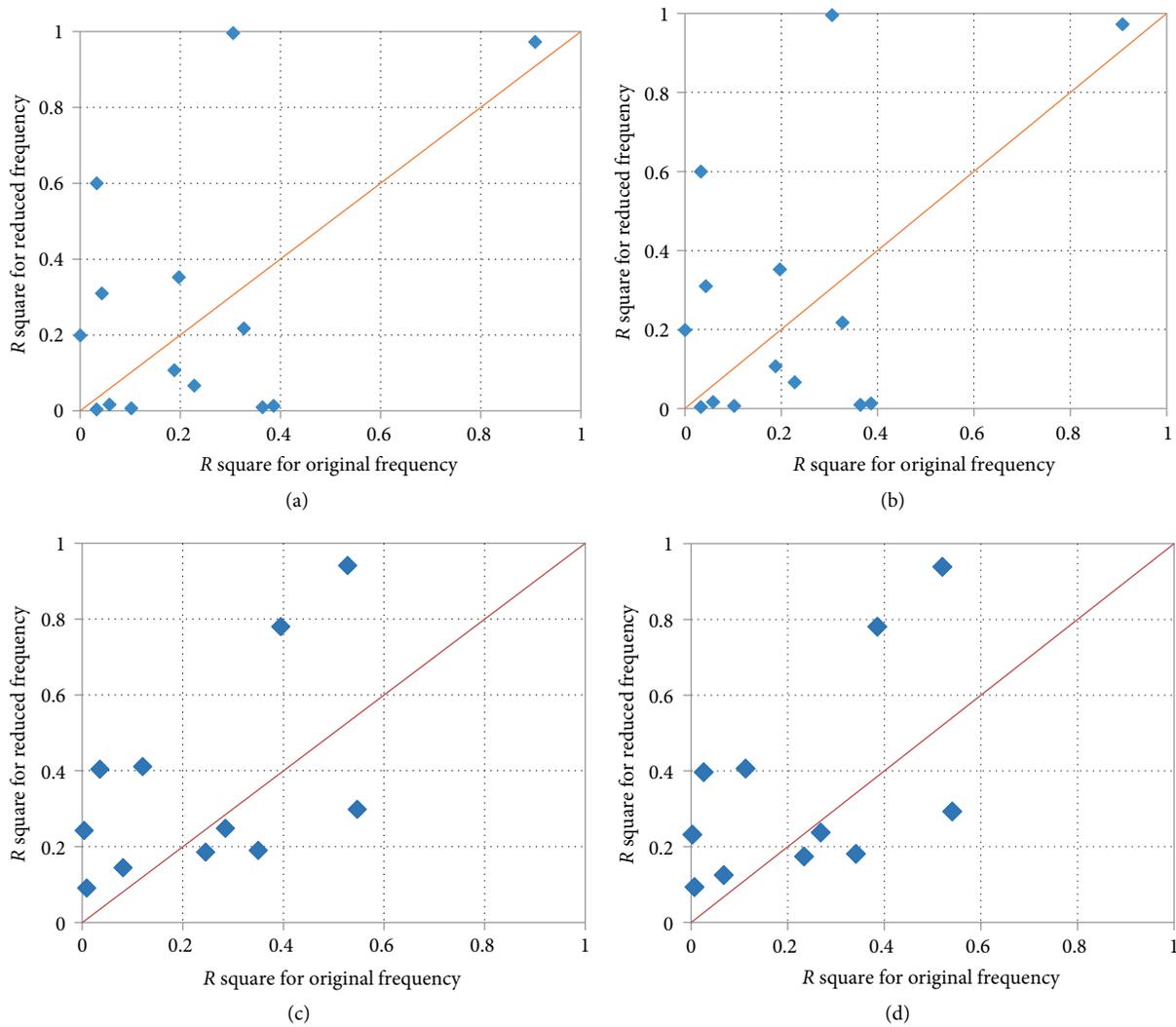


FIGURE 4: Changes of  $R^2$  for PCI performance models ((a,b) are for urban roads, (c,d) are for highways). (a) Change of  $R^2$  for linear model. (b) Change of  $R^2$  for exponential model. (c) Change of  $R^2$  for linear model. (d) Change of  $R^2$  for exponential model.

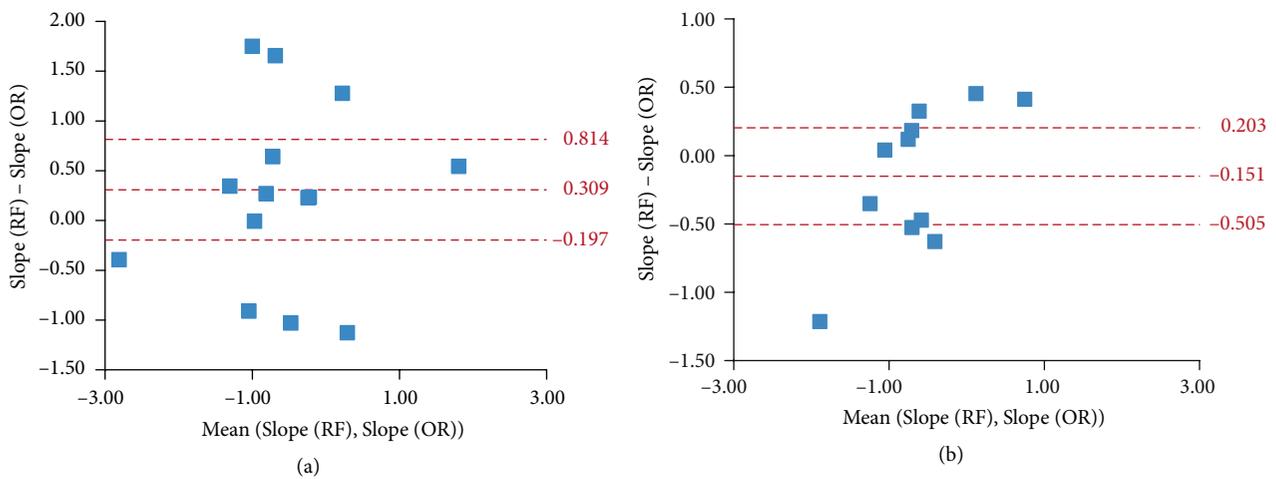


FIGURE 5: Matched pairs of slopes for PCI ((a) urban roads, (b) highways).

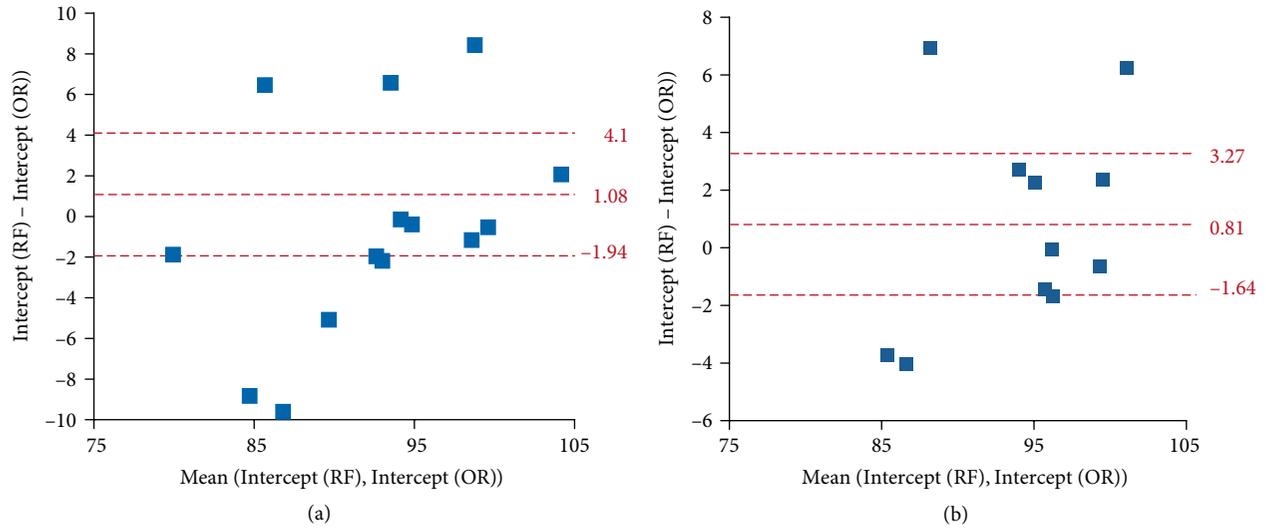


FIGURE 6: Matched pairs of intercept for PCI ((a) urban roads, (b) highways).

TABLE 2: PCI data of selected highways from 2003 to 2012.

ID	Length (km)	2003	2004	2005	2006	2007	2008	2009	2010	2011	2012
S121310115	8.3	99.31	99.71	91.53	96.85	83.57	84.05	84.07	90.05	92.69	90.09
X005310115	1.23	96.12	98.41	94.03	86.96	94.06	94.75	84.7	88.81	82.11	88.82
X009310115	8.76	97.29	94.82	90.77	94.5	91.45	91.25	92.2	92.21	92.09	85.22
X012310115	1.96	93.91	88.91	91.83	93.35	88.95	77.49	93.26	93.3	96.44	98.46
X030310115	6.71		99.74	97.06	95.15	86.97	88.76	88.23	88.24	94.21	89
X572310115	5.44	99.71	98.11	91.82	84.94	87.23	91.59	94.34	92.41	92.28	85.62
X574310115	10.95	97.38	97.83	90.81	78.07	90.7	90.59	85.91	92.67	91.62	92.2
X579310115	2.4	84.11	85.89	92.61	74.89	83.82	80.01	85.59	85.62	87.19	82.09
X581310115	7.1	99.46	95.63	89.54	87.51	89.91	89.5	86.88	91.72	91.11	93.92
X583310115	2.63	86.32	88.97	79.2	90.93	88.75	90.91	85.19	85.2	86.78	84.38
X585310115	0.78	100	97.4	100	100	88.72	92.8	92.01	92.02	97.06	92.02

TABLE 3: IRI data of selected highways from 2003 to 2012.

ID	Length (km)	2003	2004	2005	2006	2007	2008	2009	2010	2011	2012
S121310115	8.3	2.506667	2.52	3.546667	3.693333	3.693333	2.754958	3.019304	2.914613	2.87325	4.336364
X005310115	1.23		3.08	3.426667		3.12	3.089049	3.609378	3.530563	3.279835	3.72066
X009310115	8.76	3.52	3.573333	3.52	3.853333	3.666667	3.47326	3.704663	3.889944	3.9275	4.247312
X012310115	1.96		3.28	3.613333	2.906667		2.830469	3.253322	3.752336	3.292099	3.440792
X030310115	6.71		3.16	3.706667	4.533333	4.08	3.670862	3.81167	4.488043	3.517952	4.714134
X572310115	5.44	2.746667	3.16	4.04	4.093333	4.573333	2.540401	2.461172	2.588422	2.55262	4.419308
X574310115	10.95	2.653333	2.44	3.173333	2.946667	2.76	2.64748	2.620073	2.389876	2.341975	3.868056
X579310115	2.4			3.093333	3.56	4.826667	3.884532	4.305469	4.554118	4.89474	
X581310115	7.1	3.6	3.026667	3.746667	3.64	4.693333	3.130825	3.263966	3.213851	3.125176	4.955572
X583310115	2.63	3.426667	4.4	4.186667	3.12	4.413333	4.762715	4.43143	6.559752	5.305261	5.424988
X585310115	0.78	2.133333	2.053333	3.826667	3.586667	4.226667	0	0	0	0	5.62149
X586310115	2.68	2.84	3.613333	4.746667	5.386667	4	2.573061	2.65869	2.920644	2.682524	2.856079
X587310115	0.84	2.973333	2.813333	4.24	7.053333	4.173333	2.954495	3.235367	3.129688	3.029497	3.005039
X588310115	1.34	2.773333	2.853333	3.68	3.96	4.693333	2.754958	3.019304	2.914613	2.87325	2.811456
X590310115	1.53	2.88	3.28	3.8	4.026667	4.426667	2.815245	2.913749	3.166403	2.845093	3.108714
X592310115	0.92	2.813333	2.88	3.573333	3.613333	3.986667	3.024804	2.789406	3.185038	2.849684	3.165012
X593310115	2.05	3.333333	3.173333	4.533333	4.333333	4.84	3.21815	2.9776	2.966932	3.263976	2.876831
X594310115	5.98	4.533333	4.773333	4.026667	4.106667	3.853333	0	0	0	0	4.181847
X595310115	2.23	3.013333	3.146667	3.546667	3.266667	2	2.540401	2.461172	2.588422	2.55262	2.895444
X601310115	7.36	3.506667	3.826667	5.053333	4.933333	4.92	2.64748	2.620073	2.389876	2.341975	2.645441
X603310115	4.5		2.68	2.786667	2.693333	2.826667	2.661673	3.075913	2.188938	2.592863	2.530299
X611310115	7.07	2.053333	2.026667	2.346667	2.24	2.24	1.896011	1.842303	1.701961	1.985723	2.434594
X617310115	4.88	4.306667	4.44	5.066667	6	5.426667	3.494586	3.660918	3.668662	3.265904	3.451707
X619310115	1.85	3.32	3.533333	3.12	3.346667	3.373333	3.130825	3.263966	3.213851	3.125176	3.372739
X620310115	3.15	2.84	3.08	2.706667	3.04	2.826667	2.389876	2.350355	2.33185	2.426714	2.813535
X575310115	15.04	3.746667	4.346667	4.573333	4.92		2.661673	3.075913	2.188938	2.592863	3.893995
X578310115	2.08	4.96	4.586667	5.866667	6.413333	6.573333	4.535089	4.690059	4.560434	4.804738	4.796962

TABLE 4: PCI data of selected urban roads from 2003 to 2012.

Section number	Length (m)	2010	2011	2012	2013	2014	2015	2016	2017
JAS000004325	422	94	98	89.44	87.65	98	93.03	85.95	95.5
JAS000004441	238	96	98	98	98	94.67	89.99	83.17	98
HPS000010501	83	98	98	98	98	98	86.66	92.39	95.31
HPS000010493	85	92	94.67	91	91.47	98	87.49	80.29	91.49
HKS000003011	670	80.34	80.31	82.66	98	85.83	91.1	91.42	80.8
HKS000003029	245	89.67	90.18	81.85	98	93.33	94.54	91.09	84.74
XHS000007879	186	98	87.69	88	94.33	85	88.32	85.98	95.46
XHS000007880	323	89.09	82.84	73.99	87.78	93.67	91.5	88.03	95.45
CNS000000899	575	98	92.53	87	91.2	94.33	87.39	92.77	92.96
CNS000000821	364	98	98	75.55	98	89.44	98	90.33	88
YPS000014463	319	98	79.36	79	78.52	74.47	84.29	75.47	76.61
YPS000014411	492	91.77	81.65	88	98	98	87.91	76.93	77.47
YPS000014328	439	94	79.54	91	85.27	86.42	85.74	76.18	80.34
YPS000013433	440	98	98	98	95	87.96	87.13	86.43	80.59

TABLE 5: IRI data of selected urban roads from 2003 to 2012.

Section number	Length (m)	2010	2011	2012	2013	2014	2015	2016	2017
JAS000004325	422	2.58	4.29	3.93	4.17	4.3	4.4	4.35	4.18
JAS000004441	238	3.17	3.09	2.87	3.27	3.31	3.26	4.17	3
HPS000010501	83	4.29	4.91	3.6	4.34	3.36	3.75	4.22	3.94
HPS000010493	85	4.24	4.85	4.49	5.36	4.53	5.08	5.37	4.89
HKS000003011	670	4.93	3.62	3.74	6.44	3.98	3.73	3.93	3.67
HKS000003029	245	3.1	5.18	5.25	3.94	5.16	4.55	5.65	4.82
XHS000007879	186	3.77	3.73	3.18	3.48	3.24	3.74	3.25	4.69
XHS000007880	323	3.11	3.4	2.99	3.38	3.61	3.28	3.21	3.35
CNS000000899	575	4.24	4.29	3.91	4.24	4.38	3.72	4.9	4.37
CNS000000821	364	3.79	3.46	3.34	3.87	3.36	3.38	4.48	3.53
YPS000014463	319	3.78	4.58	3.55	4.66	4.38	4.32	4.45	4.35
YPS000014411	492	4.71	3.91	4.28	4.24	3.56	4.06	4.15	4.24
YPS000014328	439	2.97	4.01	3.31	4.55	3.7	3.79	4.26	3.97
YPS000013433	440	3.16	4.42	3.09	4.9	4.21	4.31	4.12	4.24

## Appendix

Data table from PMS. See Tables 2–5.

## Data Availability

Some of the data used to support the findings of this study are included within the paper, and some of the data used to support the findings of this study are from LTPP data as the attachment “Bucket\_30271.”

## Conflicts of Interest

The authors declare that they have no conflicts of interest.

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## Supplementary Materials

The attachment file is the IRI data selected from LTPP database, and the data screening principle is within the paper, as follows: We selected 2922 road sections in LTPP database to study this influence on IRI, 2518 sections unable to reflect performance decay are removed as IRI value has been below two throughout the data collection cycle or the amount of data is less than three. (*Supplementary Materials*)

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