

Real-world driving cycles and energy consumption informed by large-sized vehicle trajectory data

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1 **Abstract**

2 Inadequate representativeness of driving cycles used by regulatory in-lab tests is one
3 significant factor leading to large discrepancy between real-world fuel consumption and
4 type-approval levels. On-board measurement devices have been used in past researches
5 to collect vehicle activity data but the amount of data is usually limited. With second-
6 by-second GPS-informed trajectory data of 459 private passenger cars in place, covering
7 over 17,000 sampling days, we enabled to use big-data mining techniques to study the
8 variations in real-world driving cycles. A Markov chain method was developed to
9 generate typical driving cycles that have similar properties as real-world driving. As
10 case study, two typical driving cycles (i.e., Off-peak Cycle, Peak Cycle) are constructed
11 from six sub-cycles representing different road types and traffic conditions, which depict
12 fine-scale discrepancies of driving characteristics among different situations. Vehicle
13 fuel consumption simulation results show that NEDC type-approval fuel consumption
14 median value is lower by 28% than on road fuel consumption of Off-peak cycle, and
15 lower by 36% than that of Peak Cycle. This lab-to road gap also varies among different
16 driving cycles and different vehicle models. This study constructed typical driving cycle
17 from massive GPS trajectory data; the result highlights the discrepancy of vehicle energy
18 consumption between real-world driving cycles and regulation test cycles and the
19 importance to address real-world driving conditions in future regulation.

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22 **Keywords**

23 Driving cycle; second-by-second GPS trajectories; Markov Chain process; Light-duty
24 vehicles; Real-world energy consumption