

# **Variations of vehicle energy consumption informed by real-world GPS trajectory data and driving cycle**

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## 1    **Abstract**

2    Researches have shown that inadequate representativeness of testing cycles could lead  
3    to significant discrepancy in vehicle energy and emission assessment between on-road  
4    performance. On-board measurement has been used in past researches to collect vehicle  
5    activity data but the amount of data is usually insufficient, and the statistical coverage  
6    of various road/traffic types could not be guaranteed. Using “big data” mining  
7    techniques, this study examines second-by-second GPS data of 459 private passenger  
8    cars in Beijing, covering over 17,000 sampling days to characterize vehicle speed profiles  
9    under various traffic condition and road types. We then applied the Markov Chain  
10    method to generate sub-cycles and corresponding weighting factors that have similar  
11    properties as real-world driving. As case study, two typical driving cycles (i.e., Off-peak  
12    Cycle, Peak Cycle) are constructed from six sub-cycles representing different road types  
13    and traffic conditions, which depict fine-scale discrepancies of driving characteristics  
14    among different situations. Vehicle fuel consumption simulation results show that the  
15    developed typical driving cycle leads to up to 20% higher fuel consumption than  
16    regulation test cycles (i.e., NEDC, WLTC). This study proposes a practical method to  
17    construct driving cycle from massive GPS trajectory data and highlights the variations  
18    of vehicle energy consumption caused by different driving cycles.

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## 21    **Keywords**

22    Driving cycle; large-scale GPS data; Markov Chain process; Spatial and temporal  
23    classification; Vehicle energy consumption