



# Using mobile measurements to update on-road transportation emissions inventories

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# Authors and Acknowledgements

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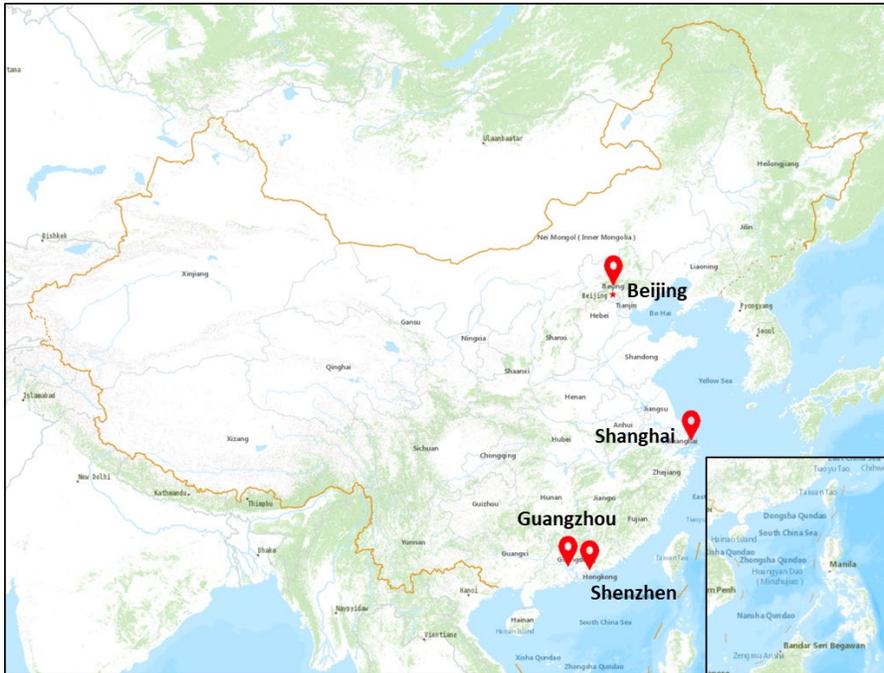
# Outline

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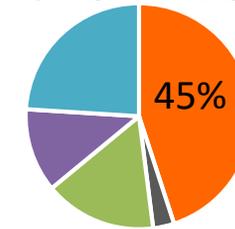
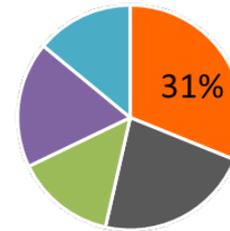
- Background
- Methods
- Results and discussion
- Summary

# Vehicle emissions and air pollution problems in China

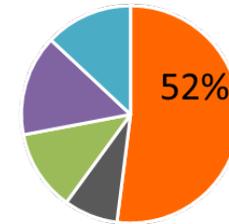
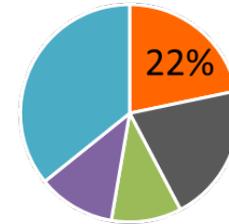
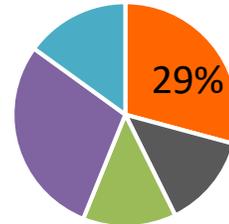
- Official source apportionment of ambient PM<sub>2.5</sub> pollution



Beijing (81  $\mu\text{g}/\text{m}^3$ , 2015) Beijing (58  $\mu\text{g}/\text{m}^3$ , 2017)



Shanghai (53  $\mu\text{g}/\text{m}^3$ ) Guangzhou (39  $\mu\text{g}/\text{m}^3$ ) Shenzhen (30  $\mu\text{g}/\text{m}^3$ )



- Vehicle/Mobile sources
- Coal combustion
- Dust
- Industrial
- Residential, agricultural and others

Data source: Ministry of Ecological Environment of China; Note: Cross-boundary transport not included

- Other relevant concerns : high fraction of nitrate aerosol (e.g., over 30% in Beijing), summertime O<sub>3</sub> pollution, and exceedance of NO<sub>2</sub> concentrations in urban areas

# HDDV emissions control in China

- Controlling air pollutant emissions from HDDVs are one of the prioritized tasks in the new “Clean Air Action Plan (2018-2010)”
- Generally, the European regulatory systems have been used in China
- China III and earlier stages: typically no modern aftertreatments
- China IV and China V (implemented nationwide since 2015):
  - SCR as mainstream aftertreatment for NO<sub>x</sub> control (2.0 g/kWh for China V)
  - Almost no DPF adoption
- China VI: recently implemented since Jul 2019 in a few cities/regions
  - PEMS regulations: conformity factors of 1.5 for NO<sub>x</sub> and 2.0 for PN (China VIb)
  - OBD requirements: capability of remote on-board sensor-based monitoring

# Technology innovation to enhance in-use surveillance

## Regulated methods

### PEMS

1~2 vehs per day



### Dynamometer

1~2 vehs per day



## Real-world efficient methods

### Non-intrusive

### Plume chasing

50~80 vehs per day  
2~5 mins per veh



### Remote sensing

1000+ vehs per day  
Short snap per veh



## Remote OBD monitoring

Applicable to key fleets  
NOx sensor required



OBD data logger  
Data collection and transmission (to cloud)

High accuracy  
Small sample size



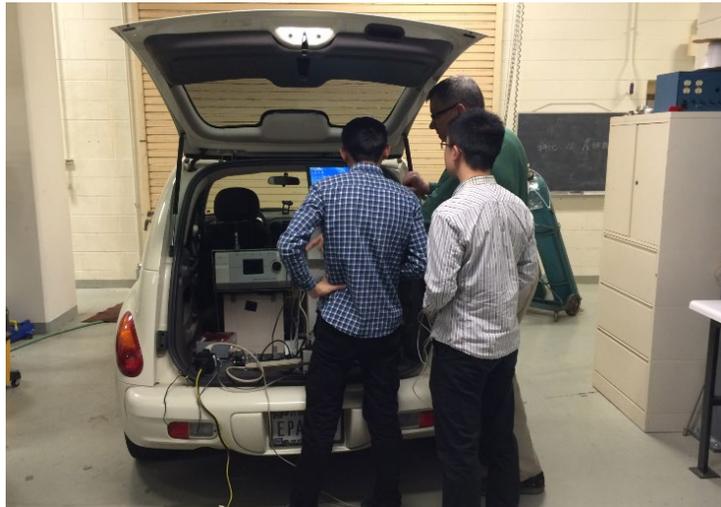
Fleet coverage

Low accuracy  
Large sample size

# Tsinghua-NRMRL collaborative project

- Sponsored by Ministry of Science and Technology of China (MOST)-USEPA collaborative agreement on technology innovation for environmental protection
- A focus on developing cost-effective road emission measurement methods
- Collaborative project on motor vehicle plume chasing and joint research workshops

**Technical communication at EPA  
ORD NRMRL in RTP, NC**



**Joint workshop at Tsinghua University,  
Beijing**

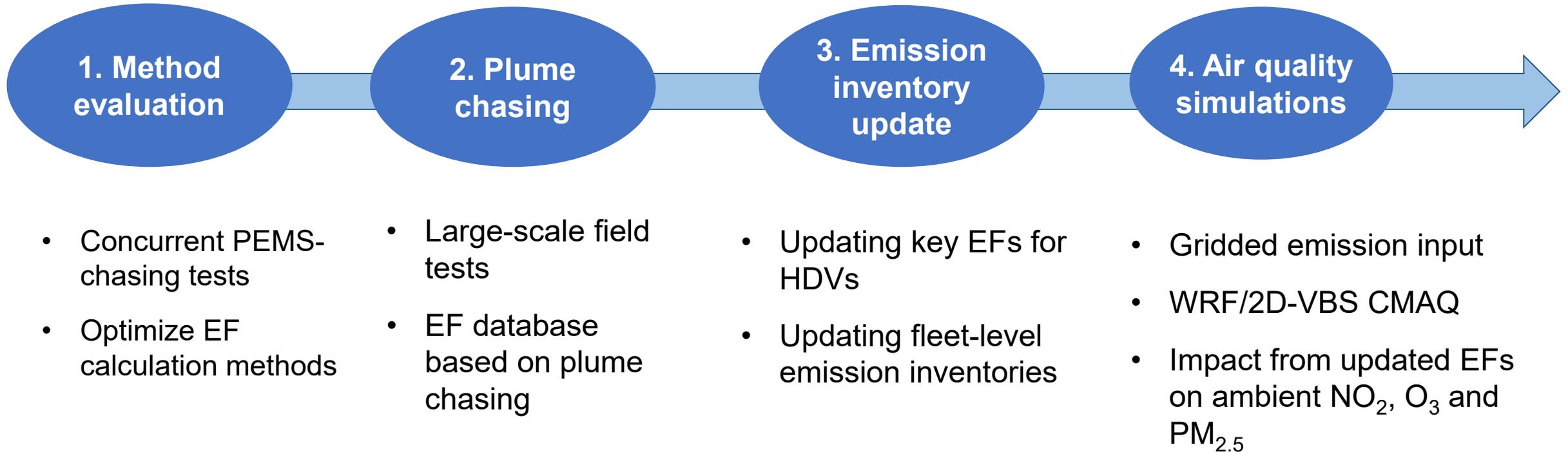


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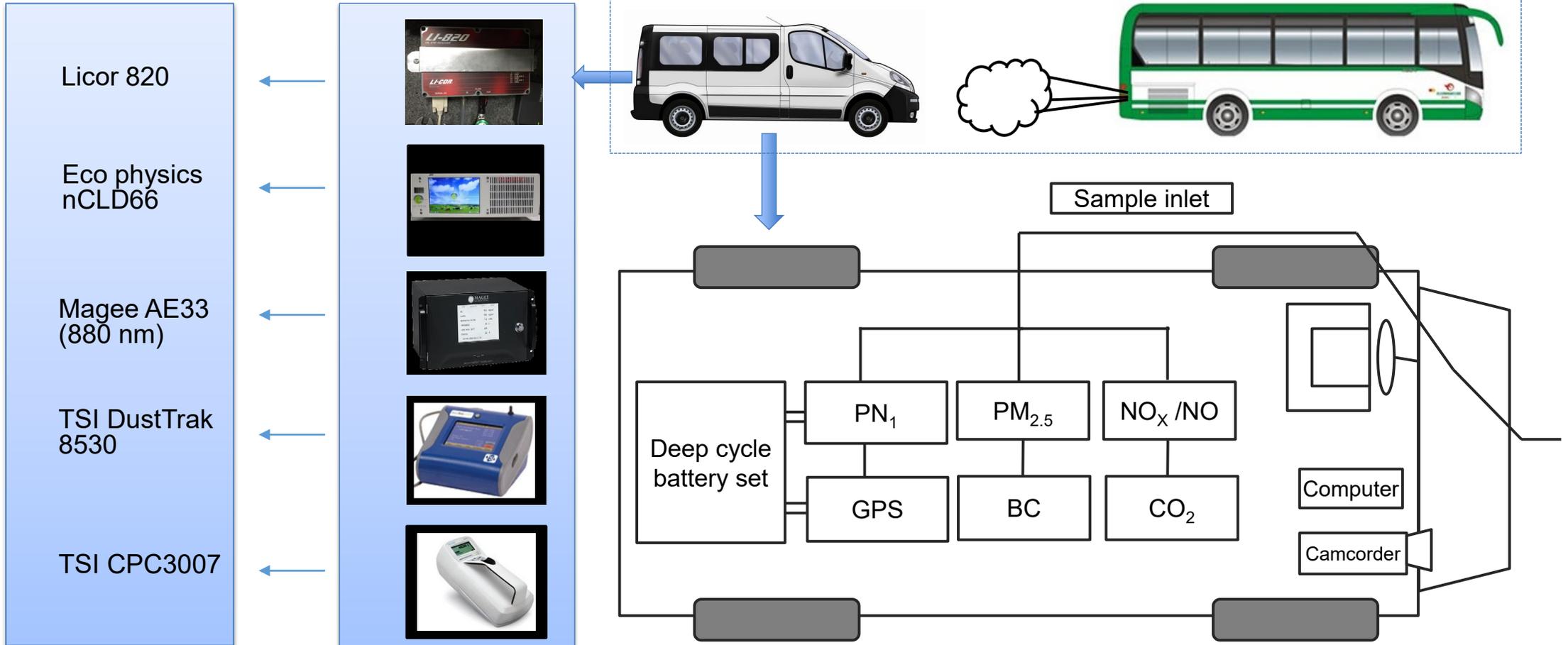
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# Research framework



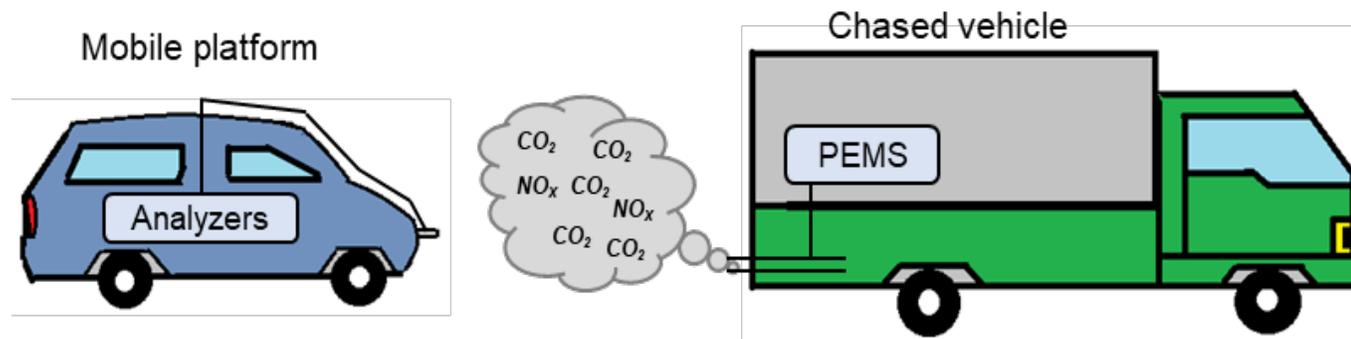
# Mobile chasing platform

## Pollutant analyzers (Resolution: 1Hz)



# Concurrent PEMS-chasing tests

- 12 heavy-duty diesel trucks recruited for concurrent PEMS-chasing tests to evaluate plume chasing for  $\text{NO}_x$  emission factors.



**PEMS:** SEMTECH-EcoStar

**Test fleet:** 4 China III (no SCR),  
4 China IV (SCR) and 4 China V  
(SCR)



## Experimental routes in Beijing.

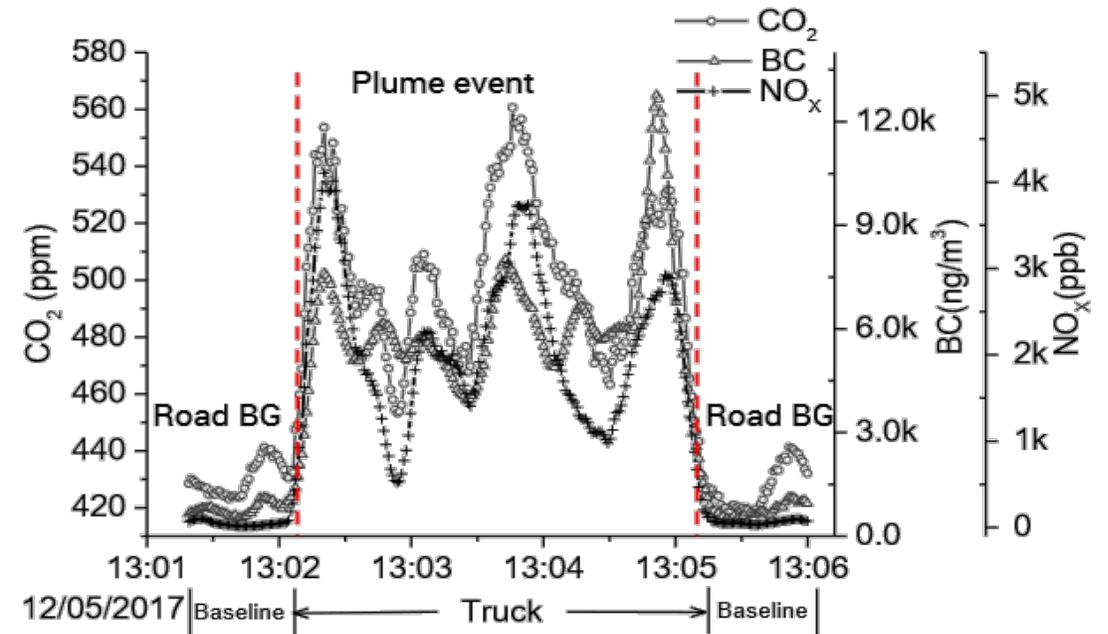
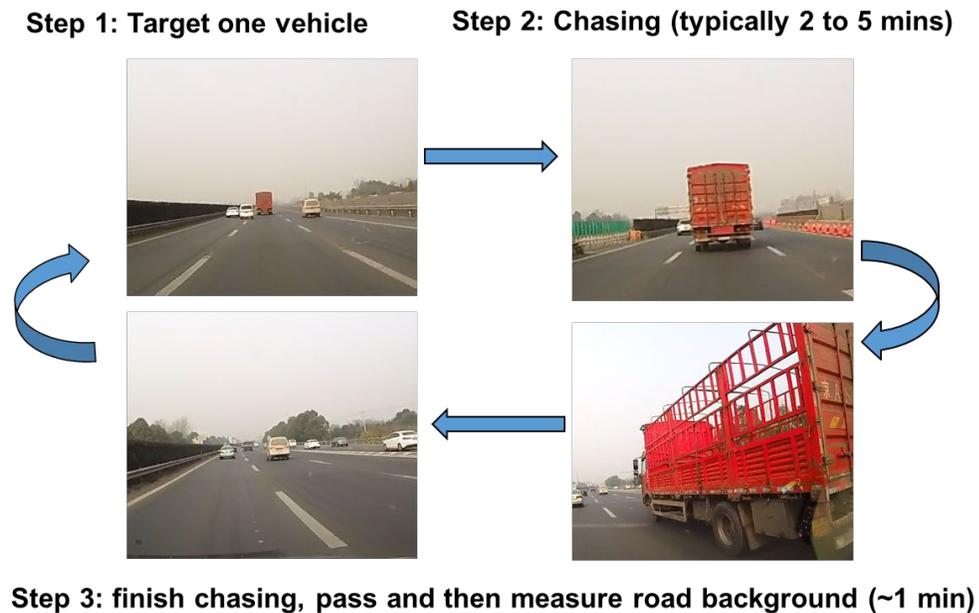


— Local roads (20~40 kph)

— Express roads (50~80 kph)

# Testing procedure and EF calculations

- Measure **road background** and exhaust plumes intended for targeted vehicles

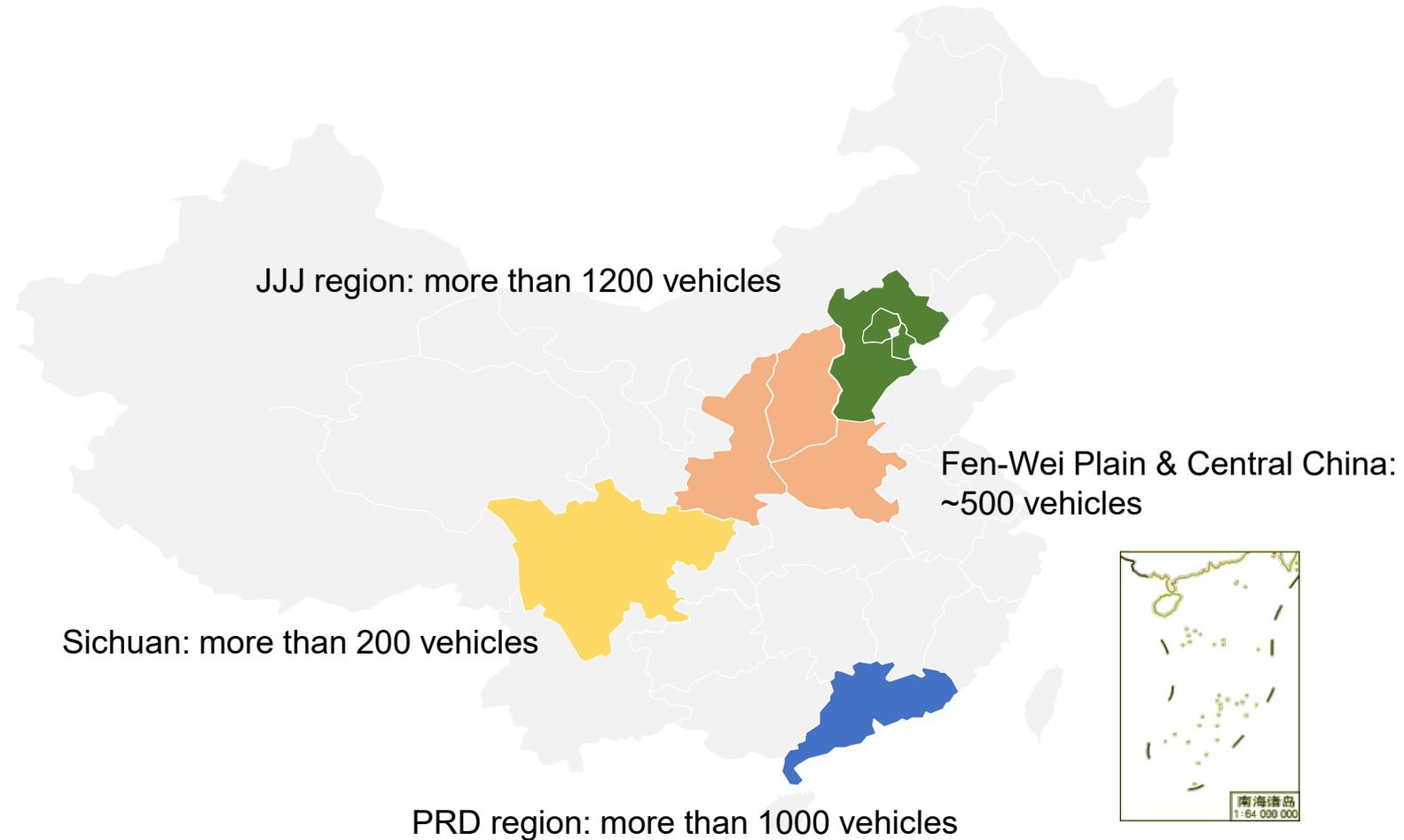


- **NO<sub>x</sub> EF (g NO<sub>x</sub> per kg fuel) calculations**

- Approach A: linear regression without BG subtraction (slope indicates fuel based NO<sub>x</sub> emissions)
- Approach B: moving average ratio with BG subtraction

# Mobile chasing for HDV emissions

- Nearly 3000 vehicles measured by using mobile chasing since 2017



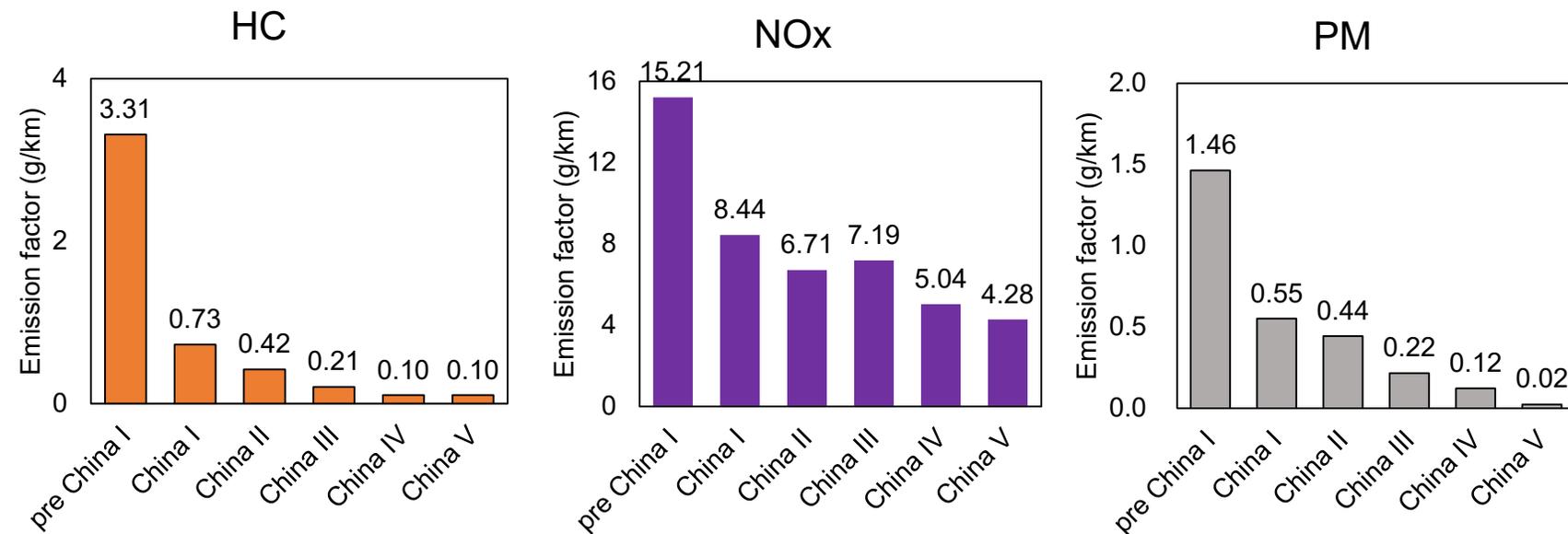
# Vehicle emission models in China

- International models (e.g., MOBILE/MOVES; COPERT) have been used to estimate vehicle emissions in China since 1990s.
- Local emission measurements are fundamental to develop emission models and reduce uncertainty in policy decisions.
  - **EMBEV** (Tsinghua): initially sponsored by the Beijing EPB, and based on thousands of LDV dynamometer tests and hundreds of **LDV/HDV PEMS tests**
  - China's National Emission Inventory Guidebook (Tsinghua and VECC): developed for the MEP in 2015, largely based on the EMBEV
  - EMBEV-Link: city-scale link-level emission inventory models based on real-world traffic datasets
- The *Guidebook* for road sector will be updated soon, as supported by China MOST

# EMBEV emission factors: heavy-duty diesel vehicles

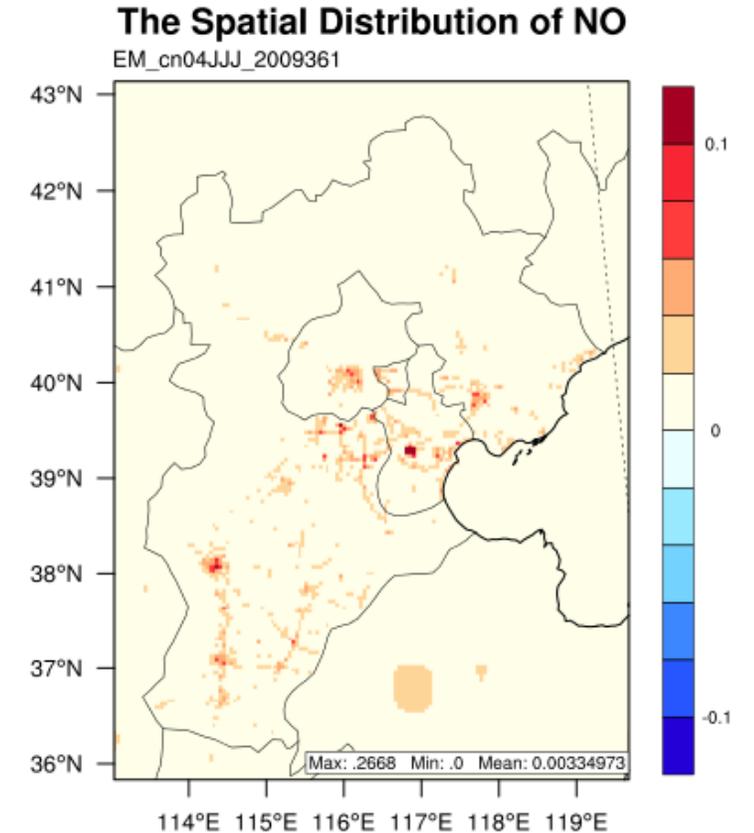
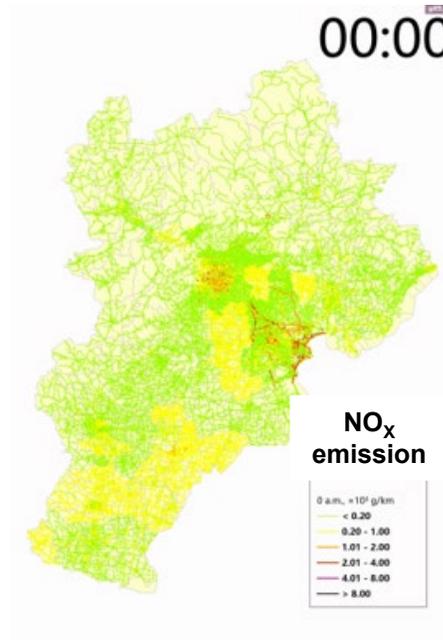
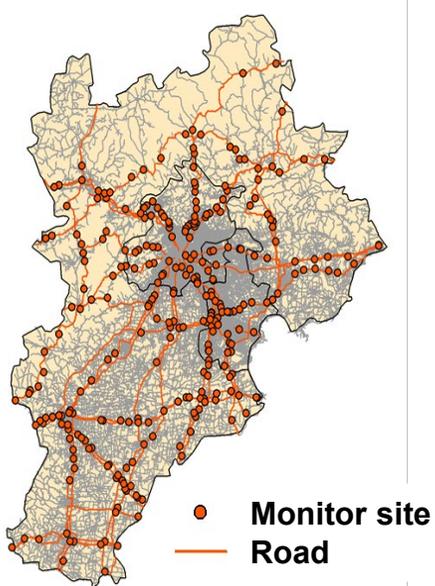
- Major data sources: PEMS tests for pre-China IV HDVs (and China IV urban buses)
- Mode-specific emission rates available (i.e., similar to MOVES)
- Few tests for China IV and China V trucks, and their emission factors are largely estimated based on the reduction trends in European fleets (i.e., 30% ↓ from China III to China IV)

## Estimated emission factors (GVW>12 t) under a typical driving cycle (40 km h<sup>-1</sup>)



# Gridded emission input

~900 traffic sites (mostly express roads)

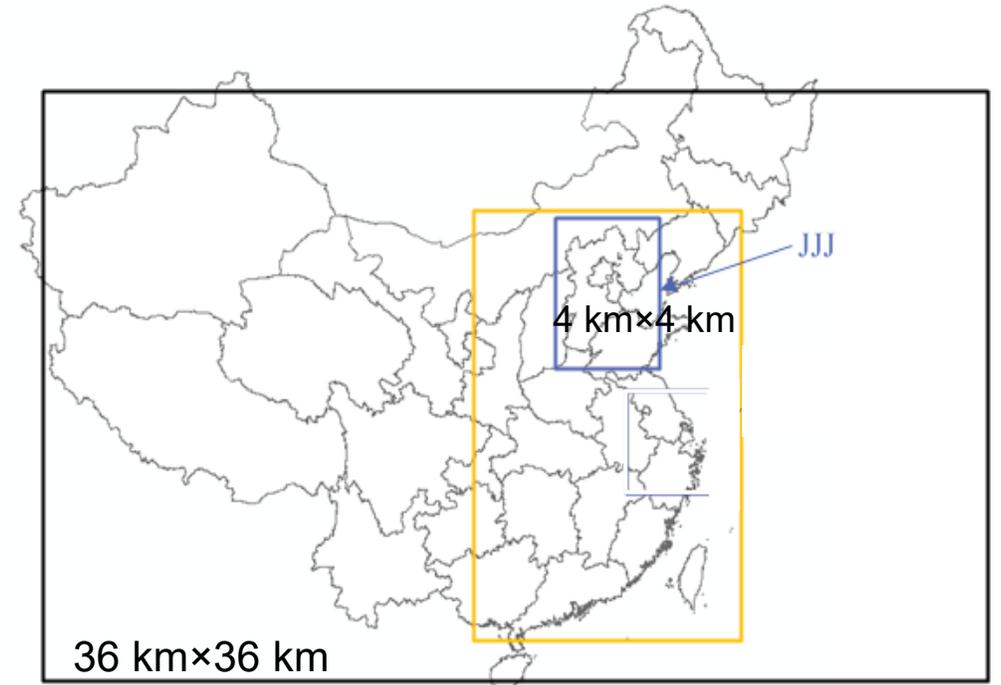


- **Real-world traffic datasets aided allocation**

- Total fleet emissions by vehicle category
- Temporal and spatial allocations, based on specific road lengths (considered the effects from vehicle volumes, urban/rural, city, speed)

# Air quality simulation systems

- WRFv3.3 configuration
  - Planetary boundary layer: Mellor-Yamada-Janjic TKE
  - Land surface layer: Noah
  - Microphysics: WSM3
  - Cumulus scheme: G-D
  - Long/short wave radiation: RRTM
- CMAQv5.0.1 enhanced by **2D-volatility basis set (VBS)** module
  - Improve the simulation performance of SOA
  - Gas-phase chemistry scheme: SAPRC99
  - Aerosol module: AERO6
- WRF-CMAQ model system
  - Three-layer nested simulation (36km-12km-4km)
  - Focus region: Beijing-Tianjin-Hebei (JJJ)
  - Duration: January, May, August and November in 2020



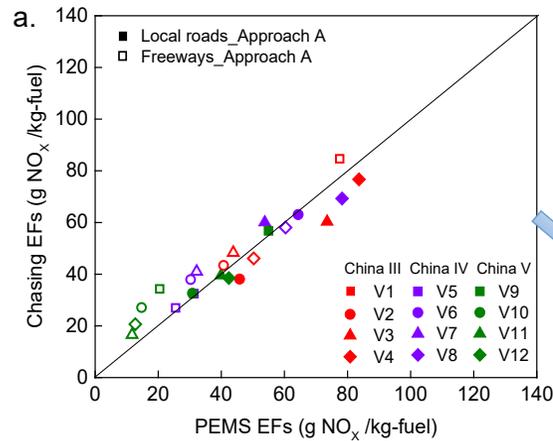
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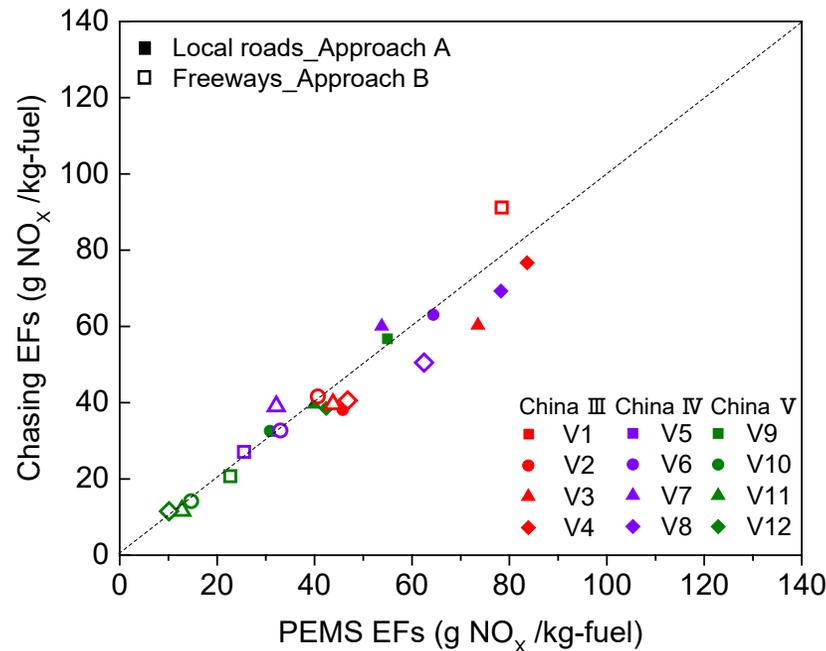
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# Comparison of NO<sub>x</sub> emission factors between mobile chasing and PEMS

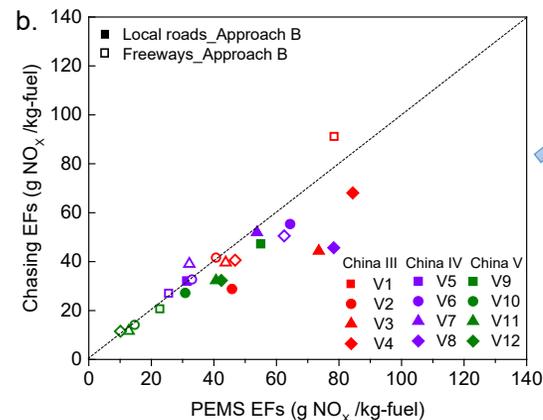
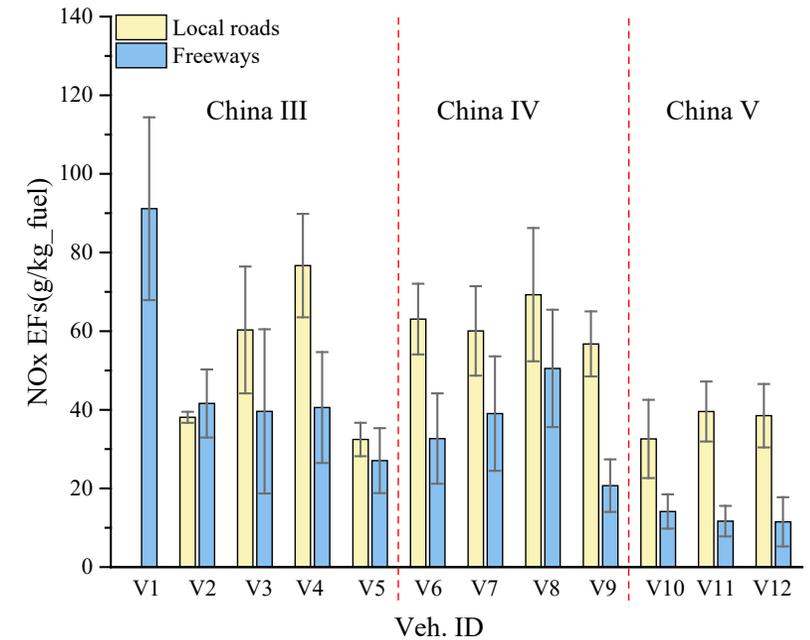
- Vehicle-specific relative errors within  $\pm 20\%$
- Fleet-average errors: -3.8% (local roads by approach A) and -0.3% (freeways by approach B)



**Concurrent PEMS-Chasing comparison**  
(12 HDVs, 245 chasing tests)



**NO<sub>x</sub> emission factors on local roads and freeways for PEMS results**

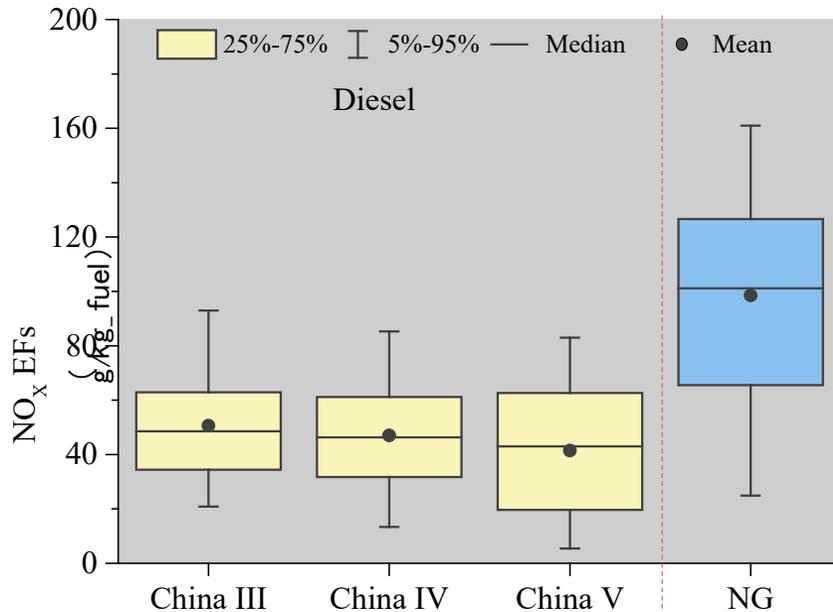


Note: The solid markers indicate measurements on local roads, while the hollow markers indicate measurements on freeways.

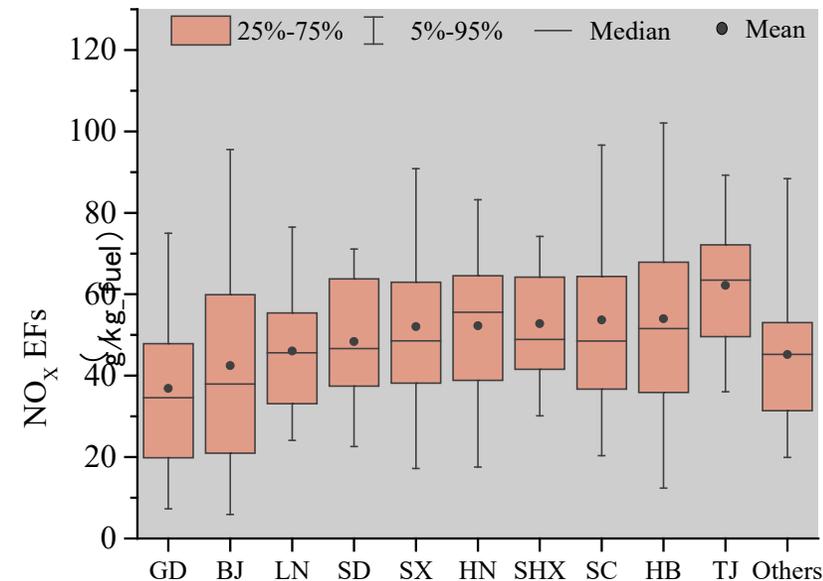
# Mobile chasing for HDV emissions—NO<sub>x</sub>

- **NO<sub>x</sub> emissions:** No significant improvement in China IV diesel trucks (claimed to have adopted SCR) compared with China III trucks; limited improvements for China V diesel trucks.
  - Failure to refill urea tanks and tampering with the SCR device are suspected
- **NG HDVs:** Significantly higher NO<sub>x</sub> emissions (lean-burn engines, no NO<sub>x</sub> aftertreatment)
- **HDDVs registered in various provinces:** Beijing not significantly improved compared to other provinces

Impact of emission standard and fuel



Impact of registration place—HDDV

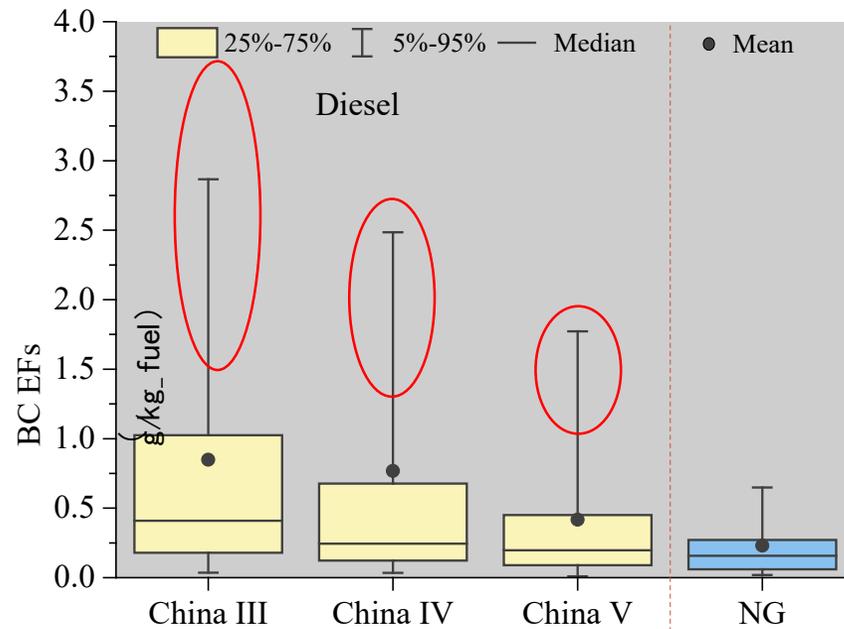


Note: GD:Guangdong; BJ:Beijing; LN:Liaoning; SD:Shandong; SX:Shanxi; HN:Henan; ; SHX:Shaanxi; SC:Sichuan; HB:Hebei; TJ: Tianjin

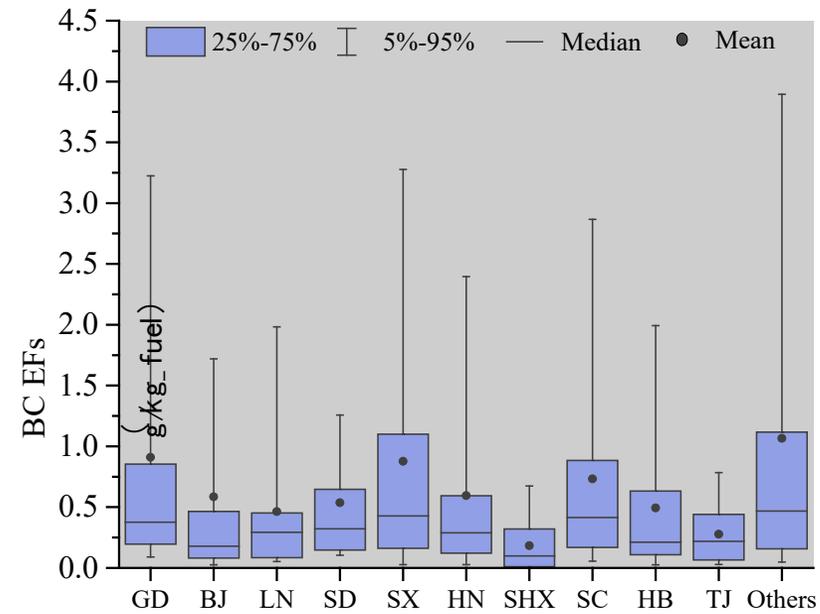
# Mobile chasing for HDV emissions—black carbon (BC)

- **BC emissions:** decrease with emission standards; high emitters exist for China III to China V
- **HDDV in various provinces:** related to different vehicle emission control policies

Impact of emission standard and fuel

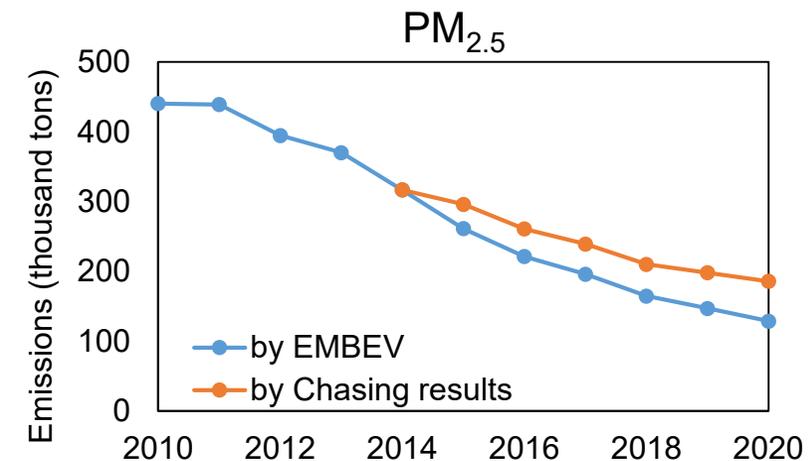
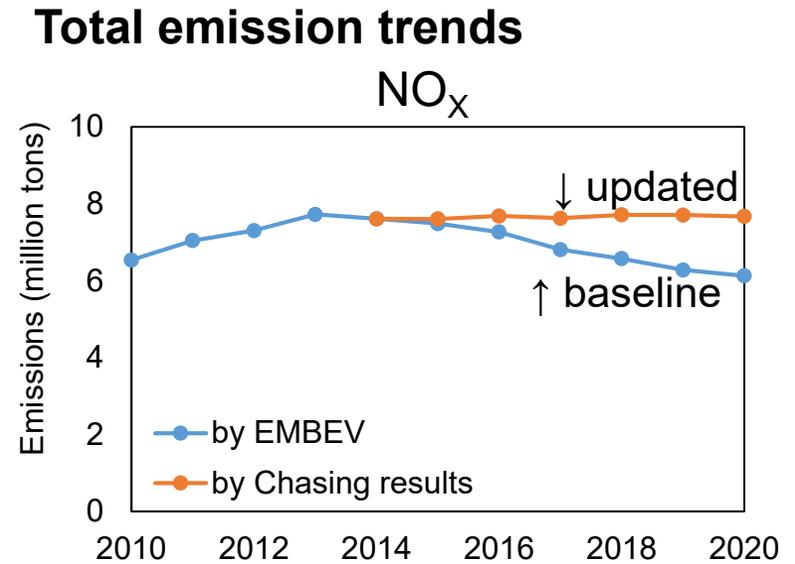
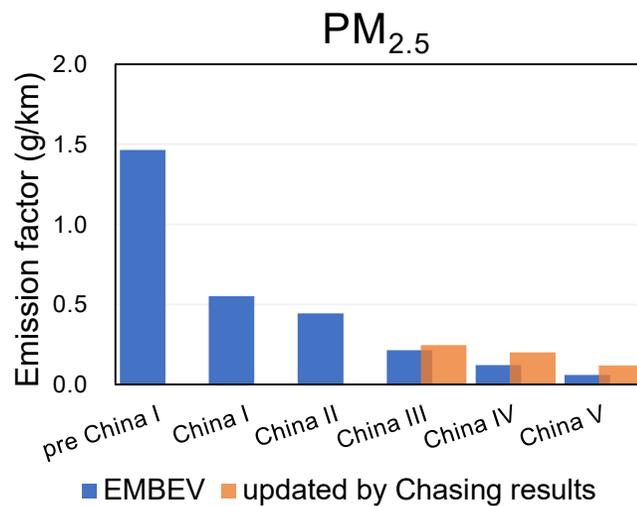
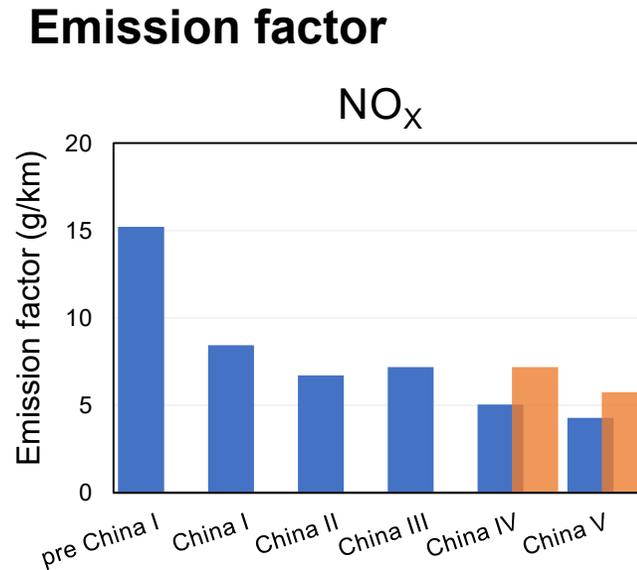
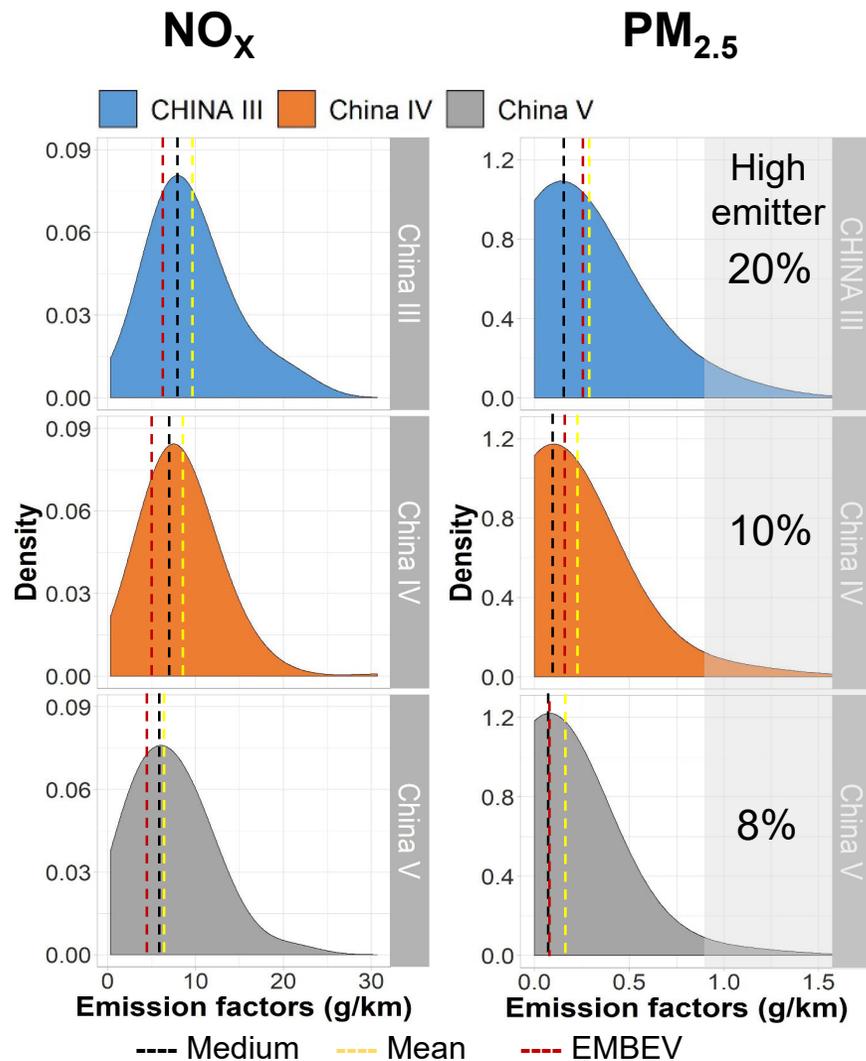


Impact of registration place—HDDV



Note: GD:Guangdong; BJ:Beijing; LN:Liaoning; SD:Shandong; SX:Shanxi; HN:Henan; ; SHX:Shaanxi; SC:Sichuan; HB:Hebei; TJ: Tianjin

# A revisit of NO<sub>x</sub> and PM<sub>2.5</sub> emissions for HDVs

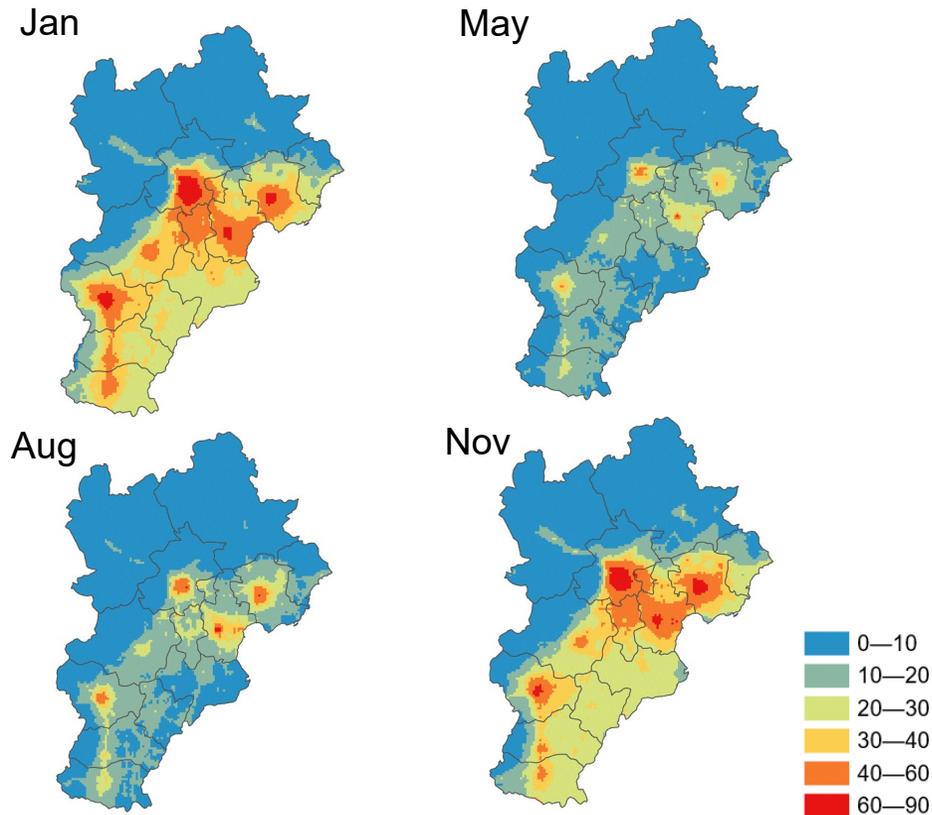


\* Average GVW: 20 t, Driving speed: 40 km/h, BC/PM<sub>2.5</sub>=0.7

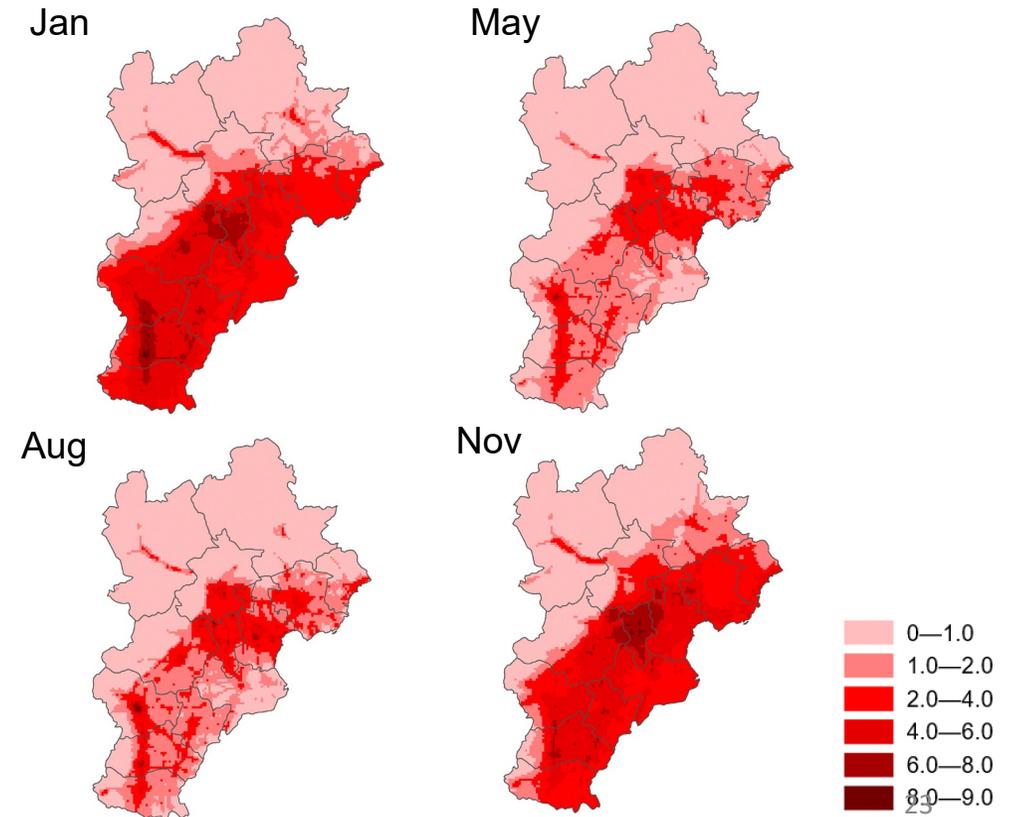
# Air quality impacts: nitrogen dioxide

- Monthly average  $\text{NO}_2$  concentrations are estimated to increase  $2\text{--}4 \mu\text{g m}^{-3}$  (12%–15%) in Beijing-Tianjin-Hebei region when the simulations apply the changing  $\text{NO}_x$  emission factors.

2020 baseline  $\text{NO}_2$  concentration



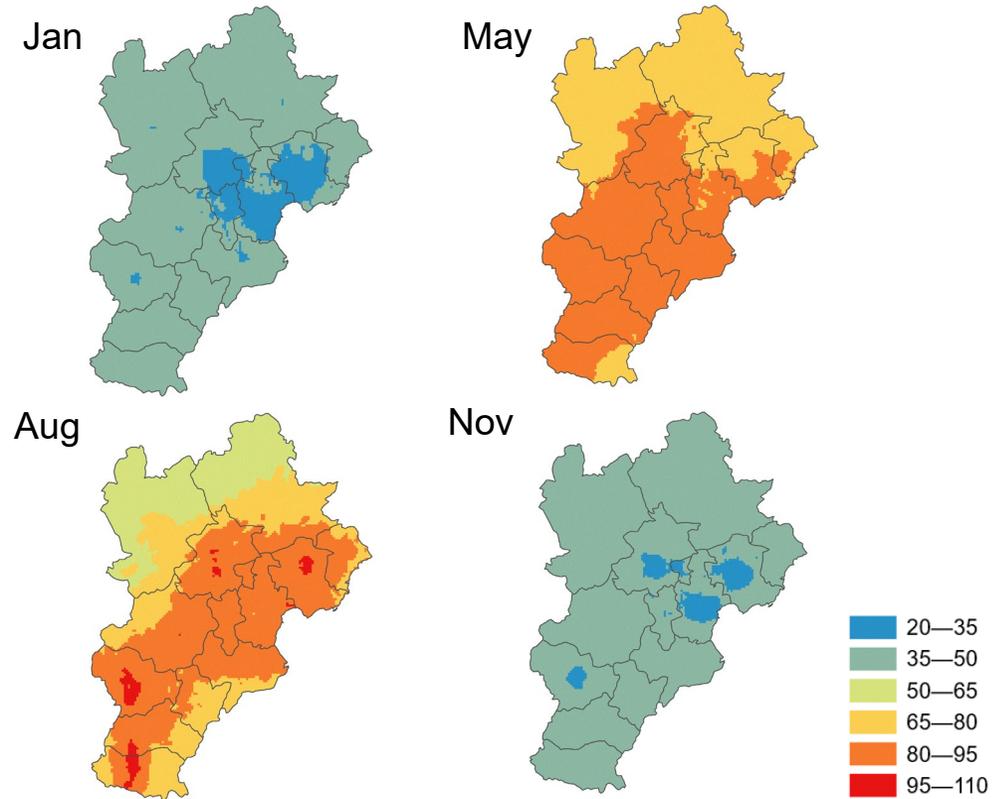
$\text{NO}_2$  concentration change



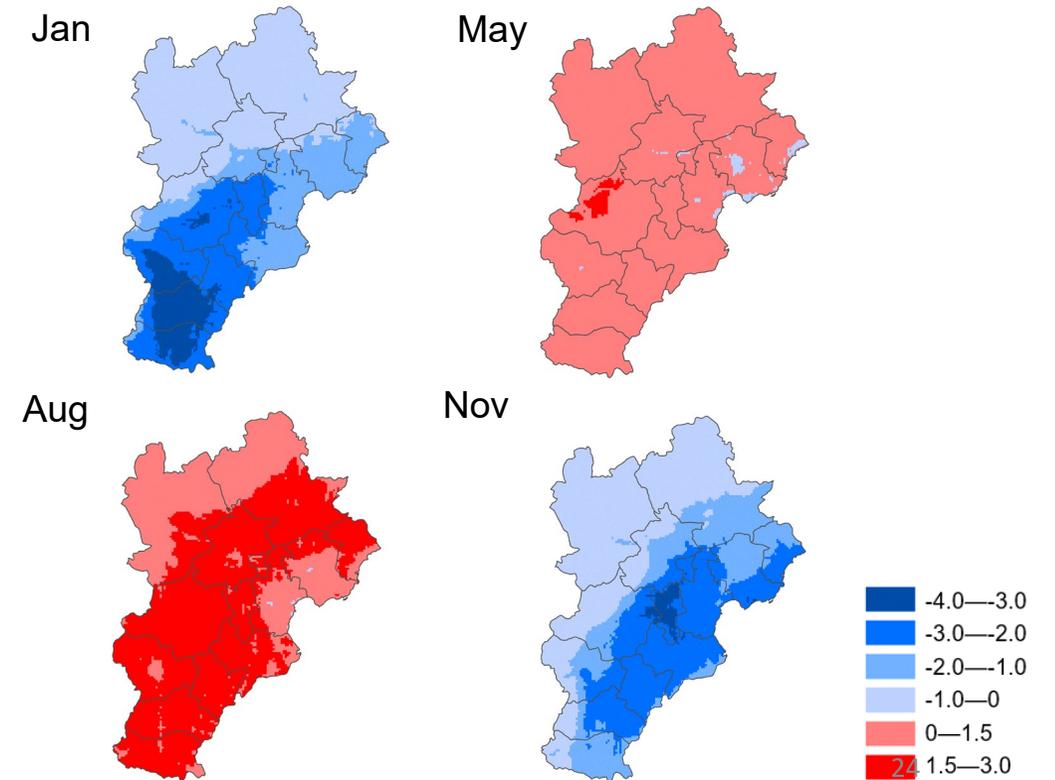
# Air quality impacts: ozone

- Summer: O<sub>3</sub> concentrations increased due to increased NO<sub>x</sub> emissions
- Winter: O<sub>3</sub> concentrations decreased by ~2 ppbv due to strong VOC-limited conditions.

2020 baseline 8-h maximum O<sub>3</sub> concentration



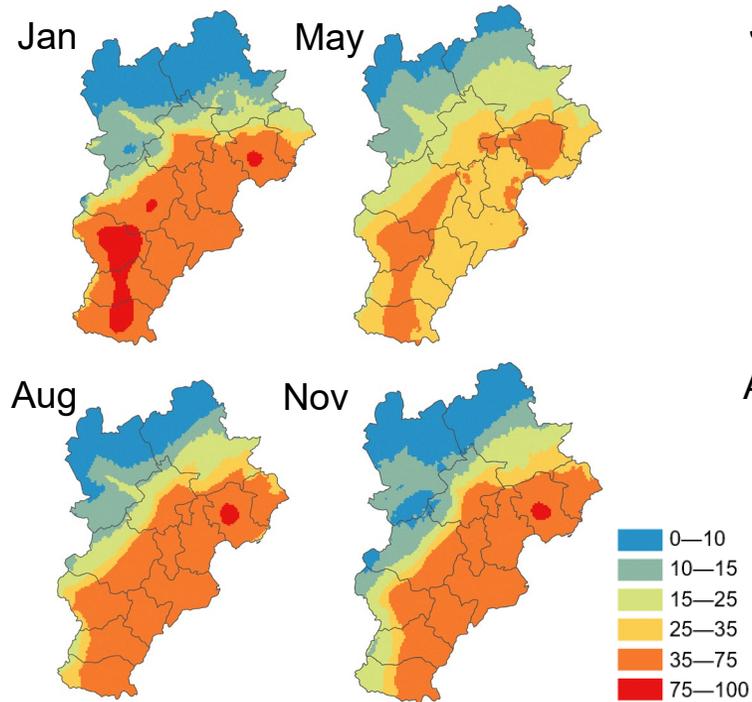
O<sub>3</sub> concentration change



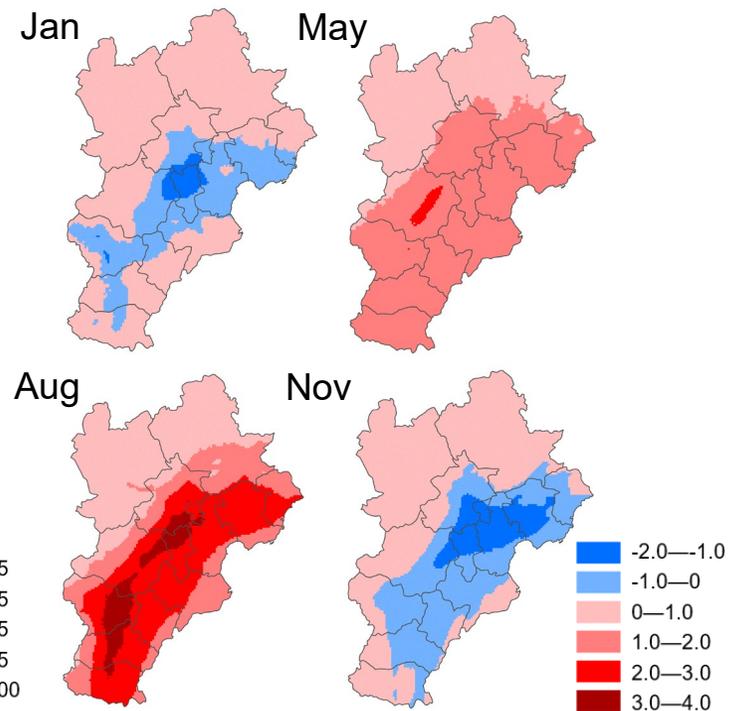
# Air quality impacts: PM<sub>2.5</sub> and key components

- Summer: PM<sub>2.5</sub> is predicted to increase 1.2-2.3 μg m<sup>-3</sup> (4%-5%) due to increased nitrate.
- Winter: decreased atmospheric oxidability (i.e., O<sub>3</sub>) leads to PM<sub>2.5</sub> reduction from baseline

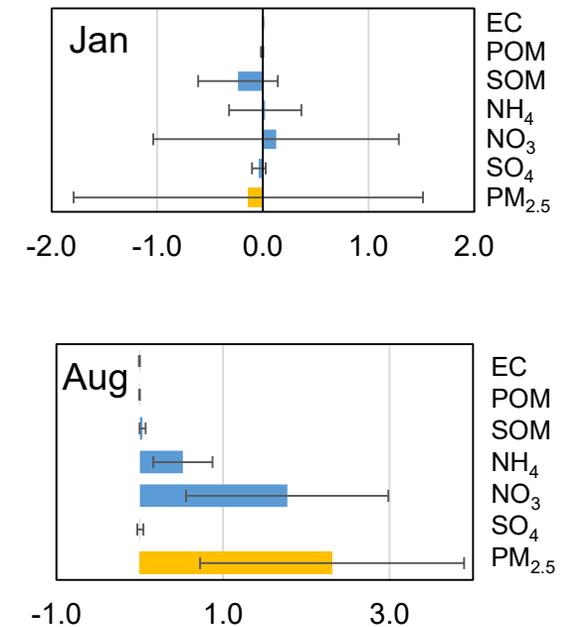
2020 baseline PM<sub>2.5</sub> concentration



PM<sub>2.5</sub> concentration change



Changes by aerosol component



# Summary

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- On-road evaluations were conducted for plume chasing tests by comparing with PEMS measurements.
- Chasing tests indicate that  $\text{NO}_x$  emissions have not been significantly improved with the emission standard for HDVs in China.
- BC emissions for HDVs have been reduced with the emission standard; however, high emitters were still found among the fleet.
- With updated  $\text{NO}_x$  emission factors, which will not decline before 2020, we estimated increased ambient concentrations for annual  $\text{NO}_2$  and  $\text{PM}_{2.5}$ , and summer  $\text{O}_3$  in the Jing-Jin-Ji region.



# Thank you for your attention !

Contact. E. [zhsjun@Tsinghua.edu.cn](mailto:zhsjun@Tsinghua.edu.cn)

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