# Modeling Traffic Emissions in Networks with Macroscopic Traffic Models

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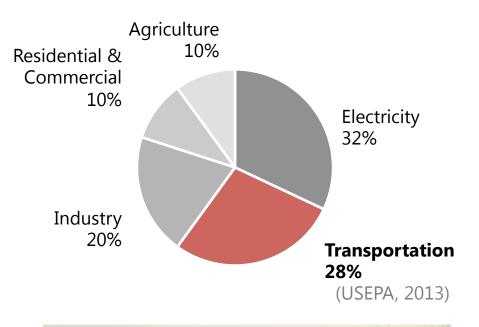
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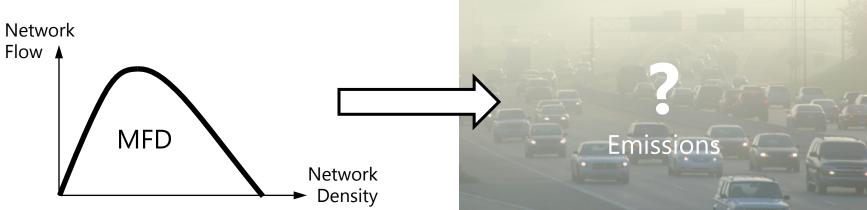


#### **Problem of Interest**

Traffic is a major source of greenhouse gas emissions  $(CO_2 \text{ equivalent}).$ 

#### How can macroscopic traffic models be used for making aggregated emissions estimates?





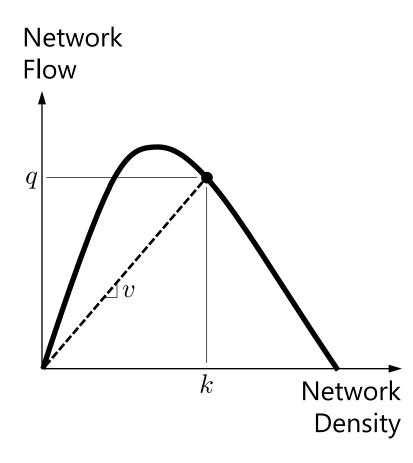
### **Modeling Traffic and Emissions**

	Traffic	Emissions
Microscopic	Detailed movements of individual vehicles (includes micro-simulation)	Detailed emissions estimates based on second-by-second speeds; requires extensive data
Mesoscopic	Traffic streams, accounting for some characteristics (such as heterogeneous driver behavior)	Driving cycles estimated from aggregated inputs; requires speeds and number of stops
Macroscopic	Aggregated network-wide traffic conditions; useful for analysis of large networks	Direct estimation of aggregated emissions; not sensitive to changes in driving cycles

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### **Macroscopic Traffic Model**



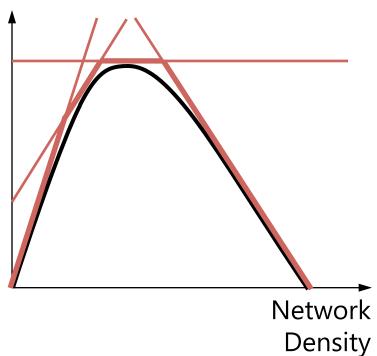
Macroscopic Fundamental Diagram (MFD) relates flow and density for a network based on the properties of the network and traffic.

(Daganzo and Geroliminis, 2008)

- Free flow speed
- Saturation Flow
- Jam Density
- Block Length
- Signal Timings

#### Macroscopic Traffic Model

Network Flow

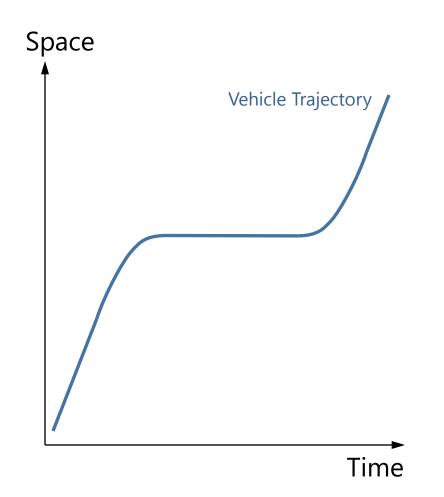


The MFD can approximated analytically by identifying bounds of the feasible flows that can be achieved.

The analytical MFD is a tight bound for homogeneous networks with uniform distribution of traffic.

(Daganzo and Geroliminis, 2008)

### **Microscopic Emissions Models**



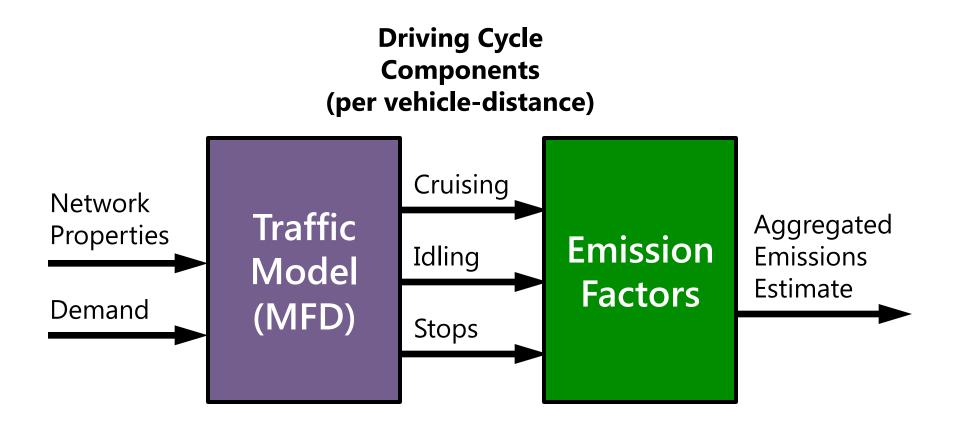
Second-by-second vehicle trajectory data

- Speed
- Acceleration

are inputs for microscopic emissions models

- VT-Micro (Rakha et al., 2000)
- CMEM (Barth et al., 2000)
- Project-level MOVES (USEPA, 2010)

#### **Proposed Model Framework**

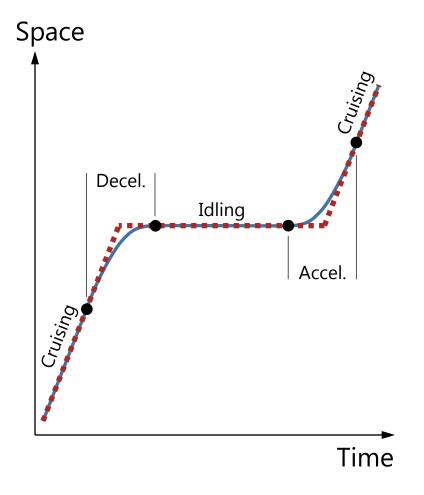


# **Driving Cycles and Traffic Flow Theory**

Space Effective Cruising **Effective Idling** Effective Cruising Time

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Analytical models for trajectories with instantaneous acceleration are consistent with aggregate dynamics of real traffic streams.

Trajectories can be broken into components of a driving cycle

- **Cruising Time**
- Idling Time
- Acceleration Deceleration
- Stopping

# **Estimating Effective Cruising and Idling**

We want to use the macroscopic traffic state to estimate components of the driving cycle.

Start by considering the implications for idealized trajectories with instantaneous acceleration and deceleration:

Effective Cruising Timeeffective  $T_c = \frac{1}{v_f}$ Effective Idling Timeeffective  $T_i = \frac{1}{v} - \frac{1}{v_f}$  $v_f$  free flow speed

### Estimating the Number of Stops

In a *homogeneous network* with *no signal offset*, suppose vehicles stop at least once per signal cycle (reasonable if red signal is longer than time to traverse one block).

Vehicles have an extra stop if they are blocked by long queues at downstream intersections.

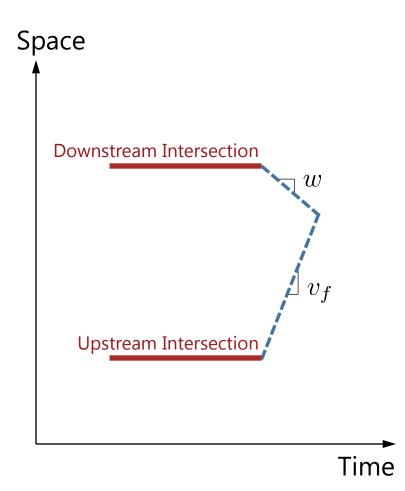
**Number of Stops** 
$$n = \begin{cases} 1/vC & \text{if } k (w + v_f) \le k_j w \\ 2/vC & \text{otherwise} \end{cases}$$

- v network avg. speed
- k vehicle density  $v_f$  free-flow speed
- C signal cycle length

 $k_i$  jam density

w backward wave speed

### **Estimating the Number of Stops**



If the front of a platoon from an upstream intersection reaches the queue of the downstream intersection, every vehicle in the platoon stops an extra time.

# **Estimating the Driving Cycle**

Actual time cruising and idling can be estimated by adjusting the effective time estimates are based on the average duration of acceleration and deceleration associated with each stop,  $\tau$ .

Driving Cycle per Vehicle-Distance:

Cruising Time
$$T_c = \frac{1}{v_f} - \frac{\tau}{2}n$$
Idling Time $T_i = \frac{1}{v} - \frac{1}{v_f} - \frac{\tau}{2}n$ Stops $n = \begin{cases} 1/vC & \text{if } k (w + v_f) \le k_j w \\ 2/vC & \text{otherwise} \end{cases}$ 

### **Estimating Network-wide Emissions**

Aggregated emissions are calculated by multiplying components of the driving cycle by corresponding emissions factors:

Emissions per Vehicle-Distance

 $E = e_c T_c + e_i T_i + e_s n$ 

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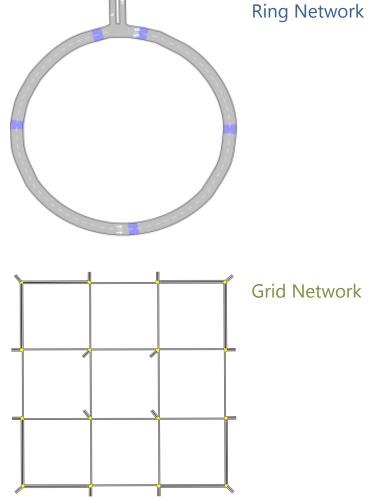
Emission factors depend on the free flow speed and average from a sample of accelerations and decelerations.

Using MOVES	cruising	$e_c = 2.79 \text{ gCO}_2 \text{eq/sec}$
$v_f = 53 \text{ km/hr}$ $\tau = 8.75 \text{ sec}$	idling	$e_i = 0.88 \text{ gCO}_2 \text{eq/sec}$
(USEPA, 2010; Shabihkhani and Gonzales, 2013)	vehicle stop	$e_s = 22.23 \text{ gCO}_2 \text{eq/sec}$

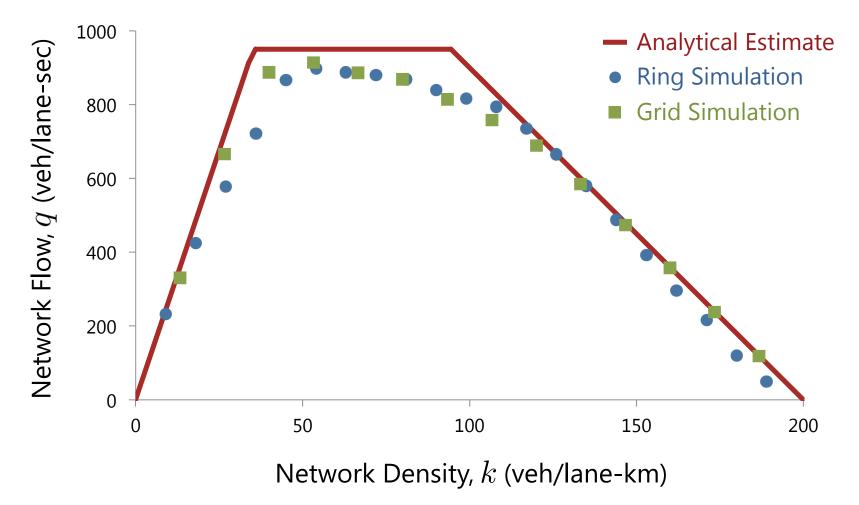
# **Analytical Model vs. Simulation**

Simulation is used for comparison with conventional, detailed, microscopic emission analysis.

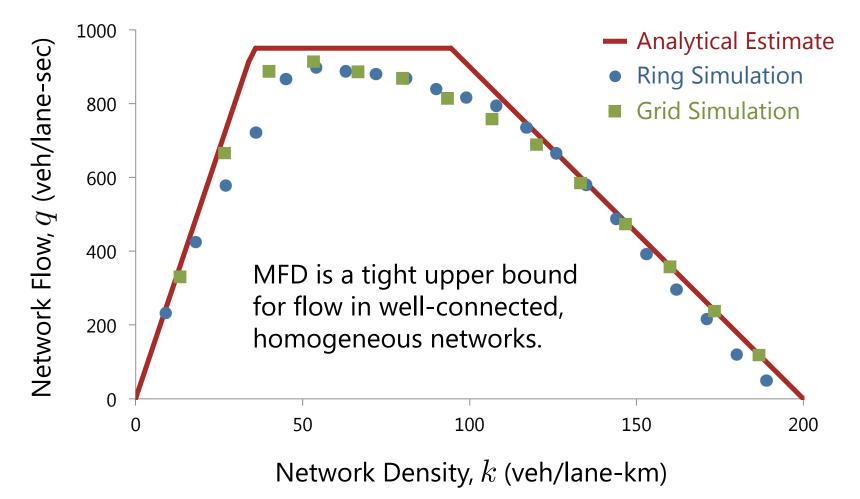
 $v_f = 53 \text{ km/hr}$  free-flow speed s = 1900 veh/lane-hr capacity  $k_j = 200 \text{ veh/lane-km}$  jam density G/C = 0.5 green ratio C = 60 sec signal cycle length  $\ell = 150 \text{ m}$  block length



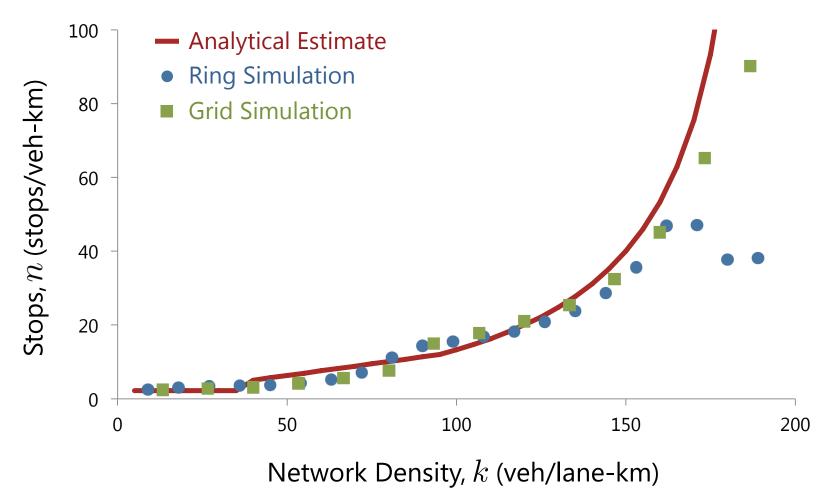
#### Analytical Model vs. Simulation Network Flow



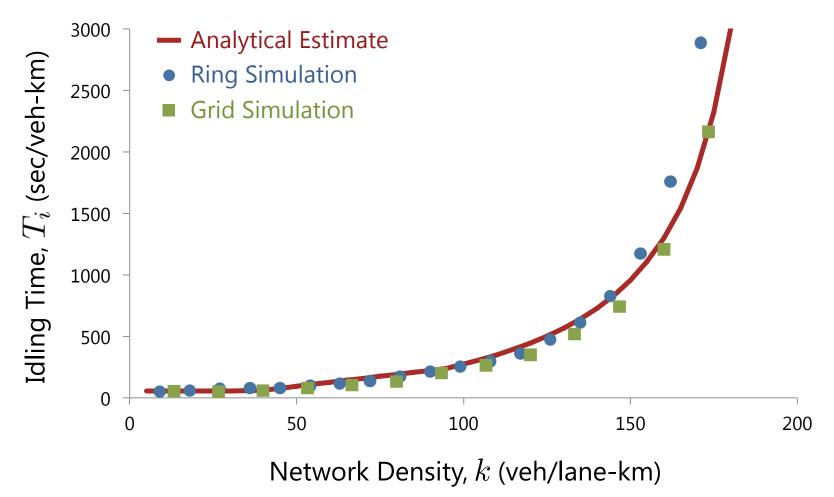
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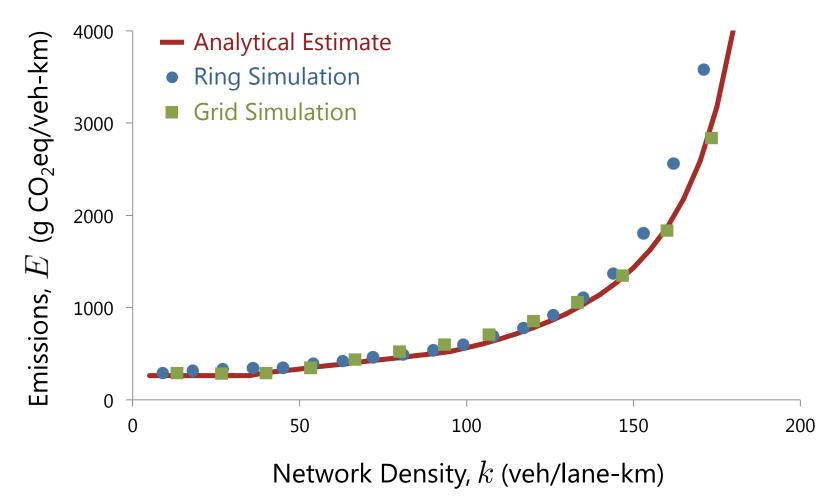
#### **Analytical Model vs. Simulation** Number of Stops



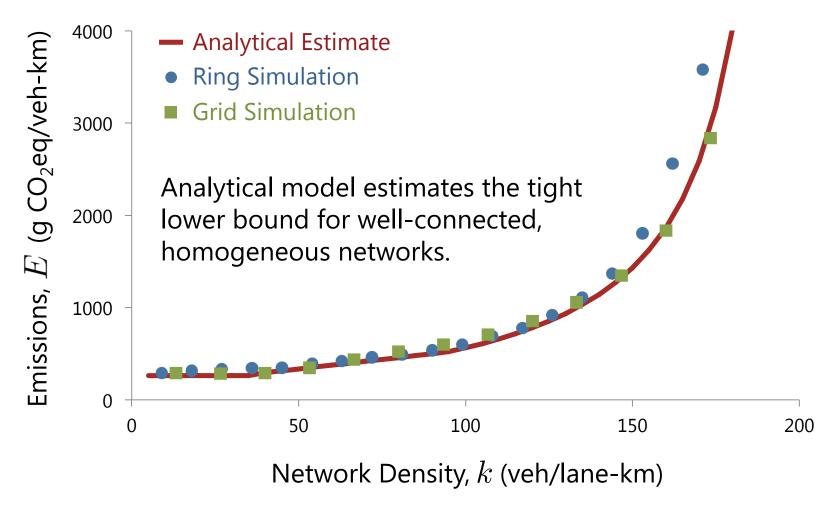
#### Analytical Model vs. Simulation Idling Time



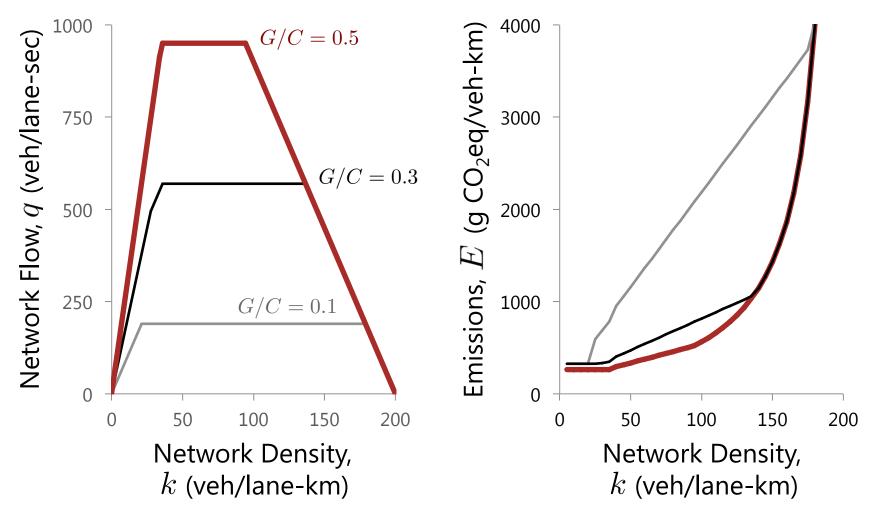
#### Analytical Model vs. Simulation Greenhouse Gas Emissions



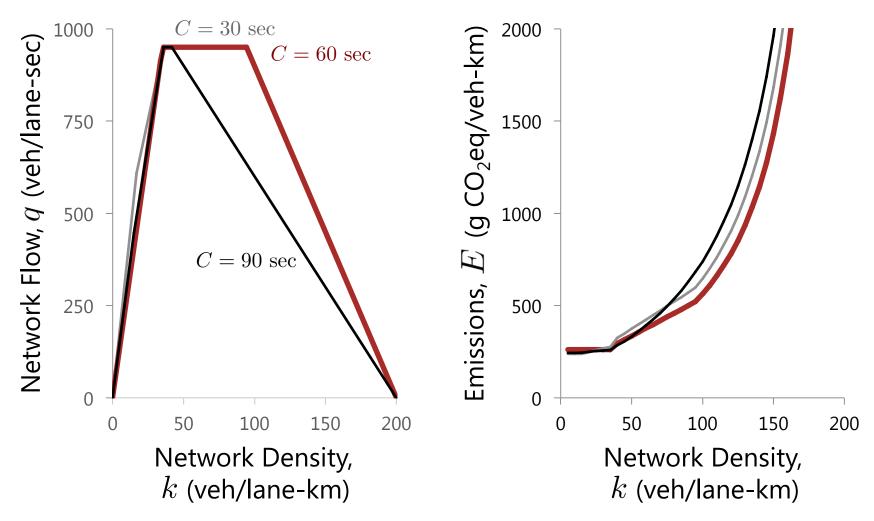
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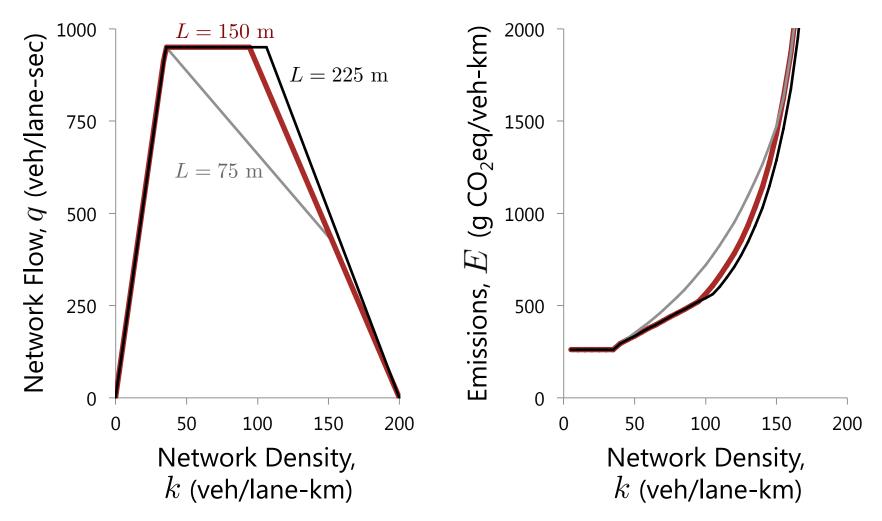
### Changing the Green Ratio, G/C



# Changing the Signal Cycle Length, ${\cal C}$



### Changing the Block Length, $\boldsymbol{L}$



# Insights

The MFD embodies useful information for estimating driving cycles without the need for extensive trajectory analysis using conventional microscopic methods. Analytical MFD provides upper bound for flow.

Useful to estimate greenhouse gas emissions, which matter in aggregate, for analysis or monitoring of network traffic. Analytical emission model provides a lower bound for emissions.

Analytical model can account for variations in many network and traffic characteristics (signal timings, block length, etc.).

Current work is to variability of traffic densities across links in a network.

### Questions

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