# Graphical analysis II 

Cumulative diagrams
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1.041/1.200 Transportation: Foundations and Methods

## Readings

1. C. Daganzo, Fundamentals of transportation and traffic operations, vol. 30. Pergamon Oxford, 1997. Chapter 2: Cumulative plots. URL.
2. John D.C. Little and Stephen C. Graves, Chapter 5: Little's Law from Building Intuition: Insights From Basic Operations Management Models and Principles, 2008. doi: 10.1007/978-0-387-73699-0.
3. (Optional) How Do Traffic Signals Work? Practical Engineering, YouTube, 2019. URL.

## Outline

1. Cumulative diagrams
2. Ramp metering problem

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1. Cumulative diagrams
a. Application: Signalized intersections
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## Limitations of time-space diagrams

| $\begin{aligned} & 06: 00 \\ & \text { M 59.0 } \end{aligned}$ | 06:30 | 07:00 | 07:30 | 08:00 | 08:30 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| M 59.5 |  |  |  |  |  |
| M 60.0 | $4$ |  |  |  |  |
| M 60.5 |  |  |  |  |  |
| M 61.0 |  |  |  |  |  |
| M 61.5 |  |  |  | Wrinfine |  |
|  |  |  |  |  |  |
| M 62.0 |  |  |  |  |  |
| M 62.5 |  |  |  |  |  |
|  | $15 \mathrm{MPH} \quad 30 \mathrm{MPH}$ | 45 MPH 55+ MPH |  |  |  |

- Delay: How long did drivers wait?
- Issue: Too many trajectories!


## Cumulative diagram - Moskowitz (1954)

- Cumulative diagrams $N(t)$ are for analyzing delay in transportation systems.
- Represents the cumulative number (count) of arrivals at a fixed location




## Cumulative diagram: illustrating system delays

- We can use two observers:
- Observer A looks at the arrivals to the system
- Observer D looks at the departures from the system

- The following diagram represents the cumulative number of arrivals and departures
- Assumptions: FIFO, no passing / reordering



## Cumulative diagram vs. time space diagram

- Cumulative diagram can be obtained from the time-space diagram
- Time space diagram has complete info
- Cumulative diagram has a subset of the info
- Remark: Slope of cumulative diagram = flow (veh/time)



## Use cases - rules of thumb

- Time-space diagram $x(t)$
- Identifying patterns in trajectories
- Cumulative diagram $N(t)$
- Identifying properties of a single bottleneck (arrivals and/or departures)



## Continuous cumulative diagrams

- Cumulative count are typically discrete in transportation (e.g. passengers, buses, cars), so $N(t)$ is a step function.
- When the exact count is not important, can leverage continuous analysis.
- Advantage for continuous analysis: differential calculus can be used, i.e. $q(t) \approx \frac{d \widetilde{N}(t)}{d t}$, where $\widetilde{N}(t)$ is a
 smooth approximation of $N(t)$


## Cumulative diagrams apply across scales



(b)

(c)

Seconds or minutes (queue)
Hours (peak demand or rush hours)

(d)

Days (different patterns on different days)

## Oblique cumulative diagram

- In freeways, large flows obscure details.
- An oblique coordinate system (linear transformation), isolates changes in arrivals by retaining the relative relationship [1, 2]:

$$
(N, t) \Longrightarrow\left(N-q_{0} t, t\right)
$$

where $q_{0}$ is a coefficient.


[^0]
## Cumulative arrivals and departures

- Arrivals at $x_{0}$; departures at $x_{1}$ (not shown)
- Starting counting with a reference customer / vehicle;
- Let $A(t)$ denote the arrivals
- Let $D(t)$ denote the departures
- Let $\mu$ denote the service rate (customers / time)

$t_{0}$


## Virtual arrivals

- Total time in the system is composed of
- "Service time": time to go through the system independently of traffic conditions
- E.g. travel time along a link in uncongested conditions: free flow travel time (fftt)
- Delay: additional time in system due to congestion
- Virtual arrivals $V(t)=A(t-\mathrm{fftt})$ isolate the delay in the system, obtained by shifting $A(t)$ right by fftt.
- $V(t)$ represents the departure time under no delay

- The delay of vehicle $n$ : $w(n)$
- Queue at $t_{2} \approx$ excess vehicle accumulation: $Q\left(t_{2}\right)$
- Total Delay:

$$
\begin{aligned}
T D & =\int_{t_{0}}^{t_{1}}[V(t)-D(t)] d t \\
& =\int_{t_{0}}^{t_{1}} Q(t) d t
\end{aligned}
$$

## Little’s Law (1961) - deterministic version

- Simple relationship between arrival rate, average queue length, and average delay (waiting time).
- Definition (Average arrival rate): $\lambda=\frac{n_{1}-n_{0}}{t_{1}-t_{0}}$
- The delay of vehicle $n: w(n)$
- Queue at $t_{2}: Q\left(t_{2}\right)$
- Total Delay: $T D=\int_{t_{0}}^{t_{1}}[V(t)-D(t)] d t=\int_{t_{0}}^{t_{1}} Q(t) d t$

- Assumption 1: Finite time window \& vehicles
- Assumption 2: Conservation of vehicles (all arriving vehicles eventually depart)
- Then: $\bar{Q}=\lambda \bar{w}$

Proof:

## Example: Toll booths for East Boston Tunnel (I-90)

- Ted Williams Tunnel connecting East Boston to South Boston
- Massachusetts Transit Authority (MTA) modulates the number of open toll booths (up to 6 booths) such that on average there are no more than 20 vehicles waiting.
- Tunnel handles up to 3600 vehicles/h during morning rush hour (with all 6 booths).
- The tunnel sees a total of 50,000 vehicles/day.
- Little's law for quick approximation of quality of service
- Arrival rate to toll booth: $\lambda=3600$ veh/h (1 veh/sec)
- Expected number of vehicles in the system: $\bar{Q}=20$
- Average time spent at toll booth: $\bar{w}=20 / 3600 \mathrm{~h}=20 \mathrm{~s}$



## Outline

1. Cumulative diagrams
a. Application: Signalized intersections
2. Reconstructing cumulative diagrams
3. Ramp metering problem

## Reconstructing the departure curve

- We often have incomplete information.
- We might have $V(t)$ or $A(t)$ and the operating features of the server (e.g., constant service rate $\mu$ ), but we need $D(t)$
- Consider:



## Example: Traffic signals

How poorly timed traffic lights can make climate change worse


The average signal caused more than 80 hours of delay each day in October, 2020

Source: INRIX

## Queuing diagram application

- Example: On-off service (traffic signal basics)
- Given: Arrival flow (rate) at a one way signalized intersection is constant $\lambda$; we have information about the green/red timing plan of the signal (server), and the service rate during green $\mu$
- Find: The departure curve, total delay, average delay



## Deterministic intersection delay



## Reality check

Real traffic signals are more complex

## Traffic control fundamentals



## Outline

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## Ramp metering problem

- A ramp meter is being considered at an entrance to a freeway.
- Currently, rush hour traffic arrives at the on-ramp at a rate $q_{1}$ from time $t=$ 0 to time $t=t^{*}$. After $t=t^{*}$, vehicles arrive at a (lower) rate $q_{2}$.

1. Assuming that drivers will not change their trips, draw and label a cumulative plot showing a metering (i.e. departure) rate of $\mu$, s.t. $q_{2}<$ $\mu<q_{1}$.

- Label the maximum delay experienced by any vehicle, $w_{\max }$.
- What is $w_{\max }$ as a function of $q_{1}, q_{2}, \mu$, and $t^{*}$ ?

2. If an alternate route is available to drivers, and it is known that they will take this route if their expected delay at the ramp meter is greater than $\frac{w_{\max }}{2}$, add this new scenario to your diagram. Now, show graphically the following:
a) The number of vehicles which will divert.
b) How much earlier the queue will dissipate (compared to part 1)?

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2. John D.C. Little and Stephen C. Graves, Chapter 5: Little’s Law from Building Intuition: Insights From Basic Operations Management Models and Principles, 2008. doi: 10.1007/978-0-387-73699-0.
3. Prof. Nikolas Geroliminis' lecture Fundamentals of Traffic Operations and Control, Spring 2010 EPFL
4. Some slides adapted from Profs. Zhengbing He, Carolina Osorio, and Dan Work.

[^0]:    1 Cassidy M. Bivariate relations in nearly stationary highway traffic. Transportation Research Part B. 1998.
    2 Cassidy M. Some traffic features at freeway bottlenecks. Transportation Research Part B. 1999;33:25-42.

