

# Traffic Flow Theory & Simulation

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Lecture 3  
Fundamental diagram



# 1.

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*Traffic Flow Variables*

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# Overview of variables

	Local measurements	Instantaneous measurements	Generalized definition (Edie)
Variable	Cross-section $x$ Period $T$	Section $X$ Time instant $t$	Section $X$ Period $T$
Flow $q$ (veh/h)	$q = \frac{n}{T} = \frac{1}{h}$	$q = ku$	$q = \frac{\sum_i d_i}{XT}$
Density $k$ (veh/km)	$k = \frac{q}{u}$	$k = \frac{n}{X} = \frac{1}{\bar{s}}$	$k = \frac{\sum_j r_j}{XT}$
Mean speed $u$ (km/h)	$u_L = \frac{n}{\sum_i (1/v_i)}$	$u = \frac{\sum_j v_j}{n}$	$u = \frac{q}{k}$

# 2.

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*Macroscopic flow characteristics*

*Fundamental Diagram*

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# Overview of lecture

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- Fundamental relation (recall)
- Fundamental diagrams
  - Causality
  - Special points
  - Model alternatives
- Studies of the fundamental diagram
  - Effect of weather conditions
- Applications
  - Capacity estimation
  - Effect of rain

# Fundamental relation

- Consider traffic flow in stationary + homogeneous state; then

$$q = ku$$

- Which average speeds are to be used? Local (time-mean speed) or instantaneous (space-mean speed)?
- Recall: consider group  $i$  with constant speed  $u_i$  (per group:  $u_L = u_M$ )
- Density of group on  $X$  equals  $k_i$
- For each group  $q_i = k_i u_i$ , and thus

$$q = \sum_i q_i = \sum_i k_i u_i \quad \text{and} \quad k = \sum_i k_i = \sum_i (q_i / u_i)$$

yielding

$$u = \frac{q}{k} = \frac{\sum_i k_i u_i}{\sum_i k_i} = \frac{\sum_i q_i}{\sum_i q_i / u_i} = u_M$$

# Fundamental diagram

- Assumptions:
  - On **average** drivers behave the same under similar **stationary conditions**
  - E.g. when drivers have a certain speed  $v$ , they will on average maintain the same following distance  $s$
- Example vehicle  $i$  follows vehicle  $i-1$  at distance headway  $s_i$

$$s_i = s_i^0 + T_i v_i \quad \Leftrightarrow \quad h_i = s_i^0 / v_i + T_i$$

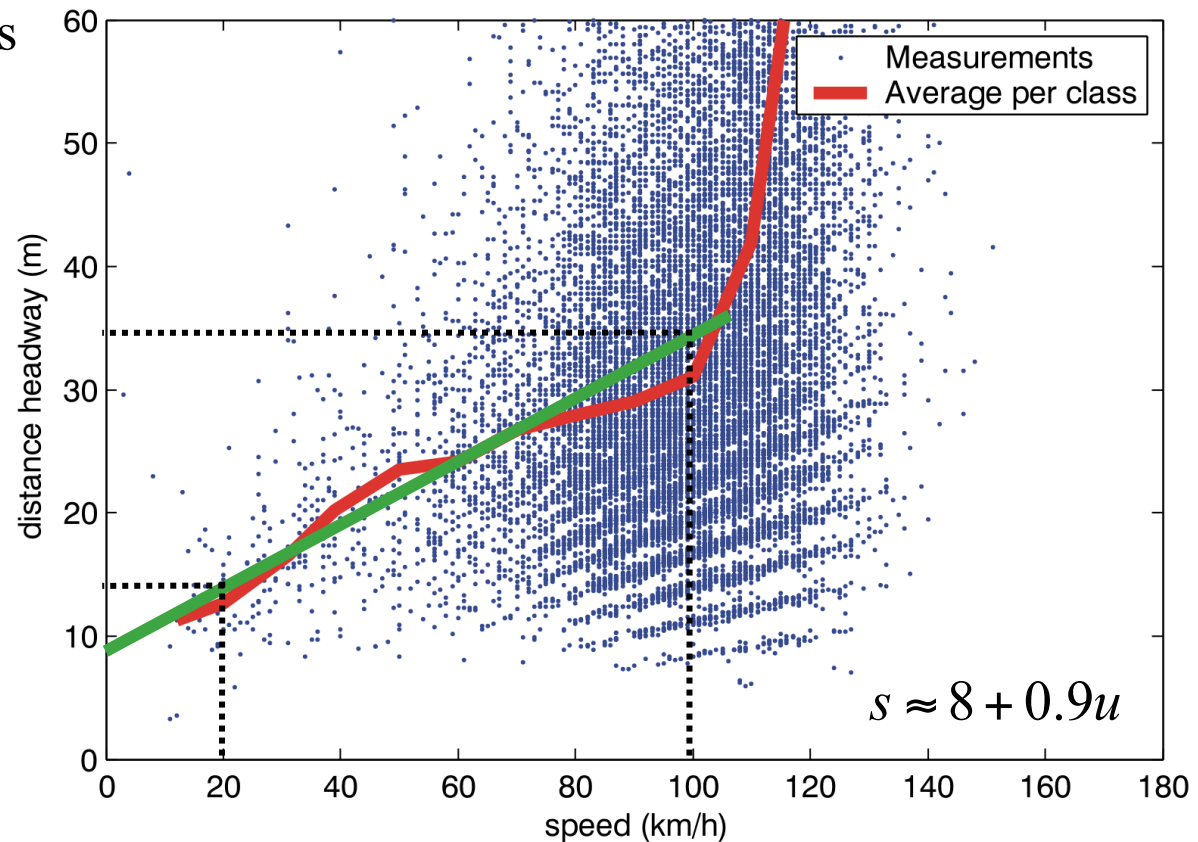
- Distance headway increases as speed increases since driver needs more space to ensure not colliding with the vehicle in front in case of an unexpected situation
- For averages we have

$$\frac{1}{k} = \bar{s} = \frac{1}{m} \sum s_i = \frac{1}{m} \sum (s_i^0 + T_i v_i) = \bar{s}_0 + Tu$$

- How about data?

# Data collected at A9 motorway (left lane)

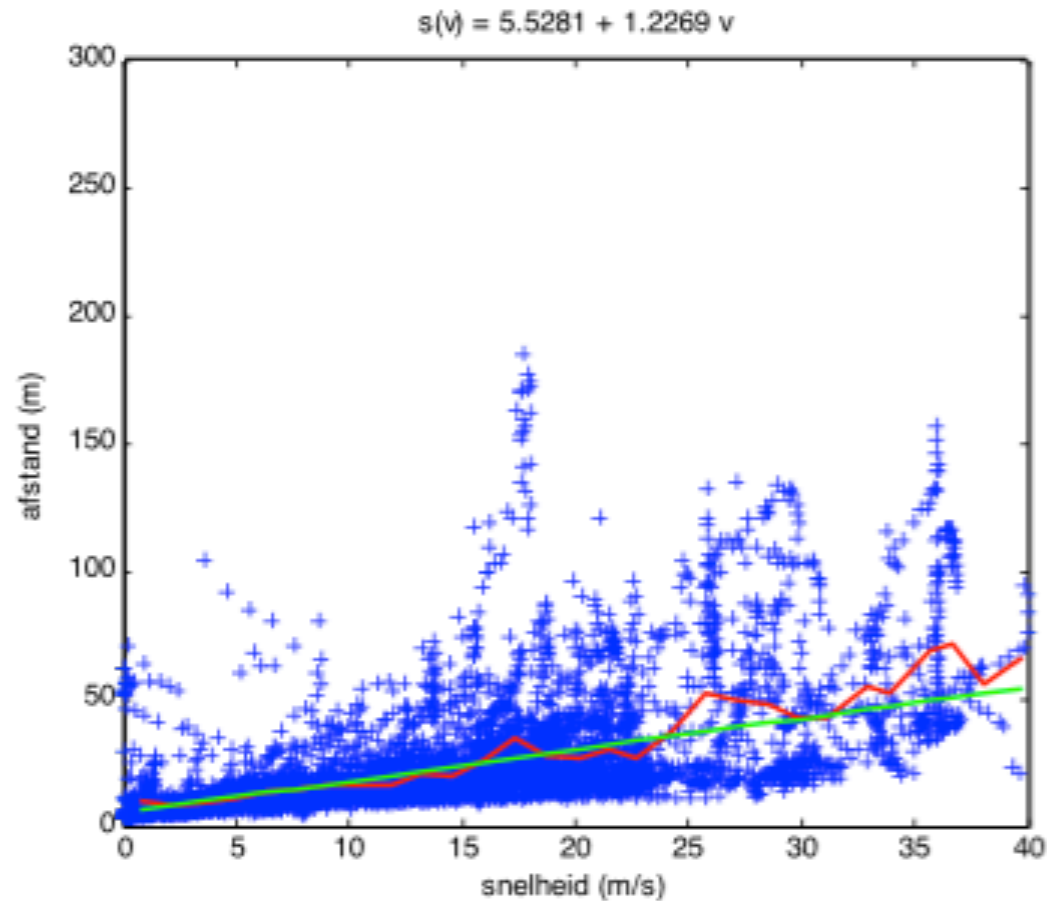
- A9 motorway data
- Green line indicates 'fitted' linear relation between  $s$  and  $u$
- *Much scatter due to differences between vehicles and within driver behaviour, non-stationarity, etc.*





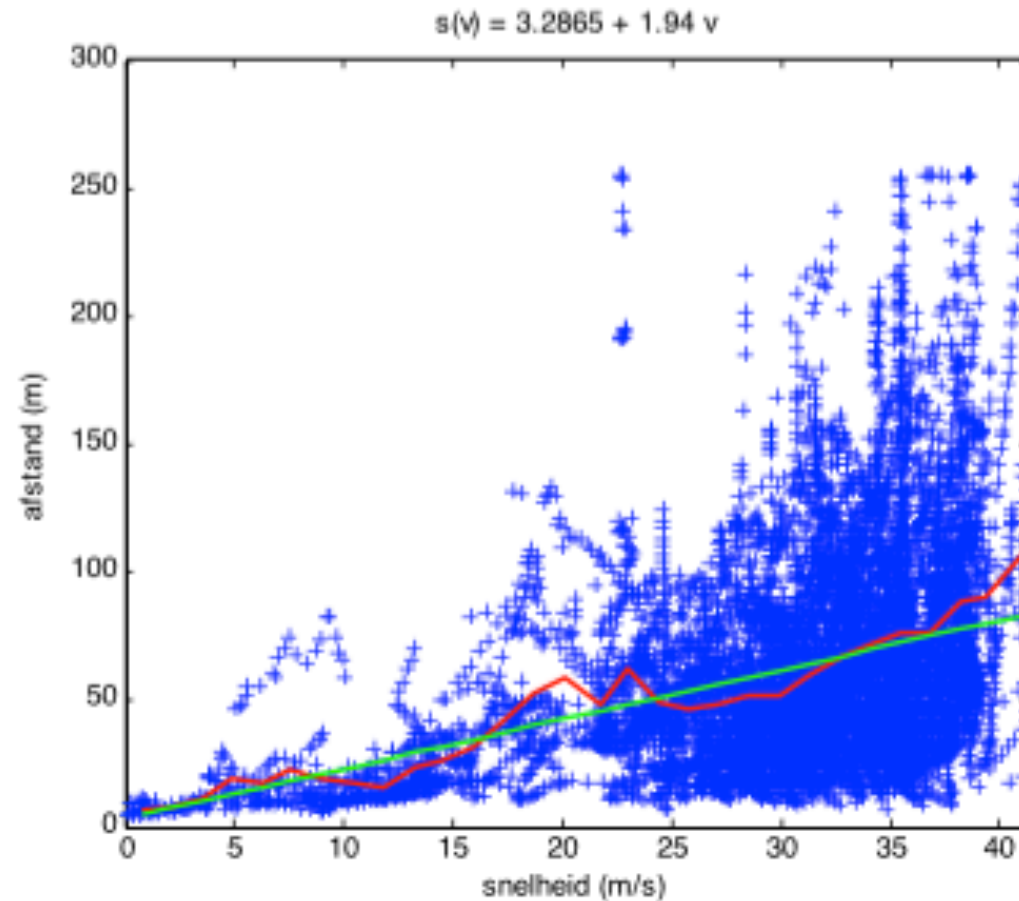
# Data from Full Traffic project

- Instrumented vehicles (net distance headways)



# Data from Full Traffic project

- Instrumented vehicles (net distance headways)



# Fundamental diagram

- For the density we have

$$k = \frac{1}{\bar{s}} = \frac{1}{\bar{s}_0 + Tu} = K(u) \quad \left( u = U(k) = \frac{1}{kT} - \frac{\bar{s}_0}{T} = \frac{\bar{s} - \bar{s}_0}{T} \right)$$

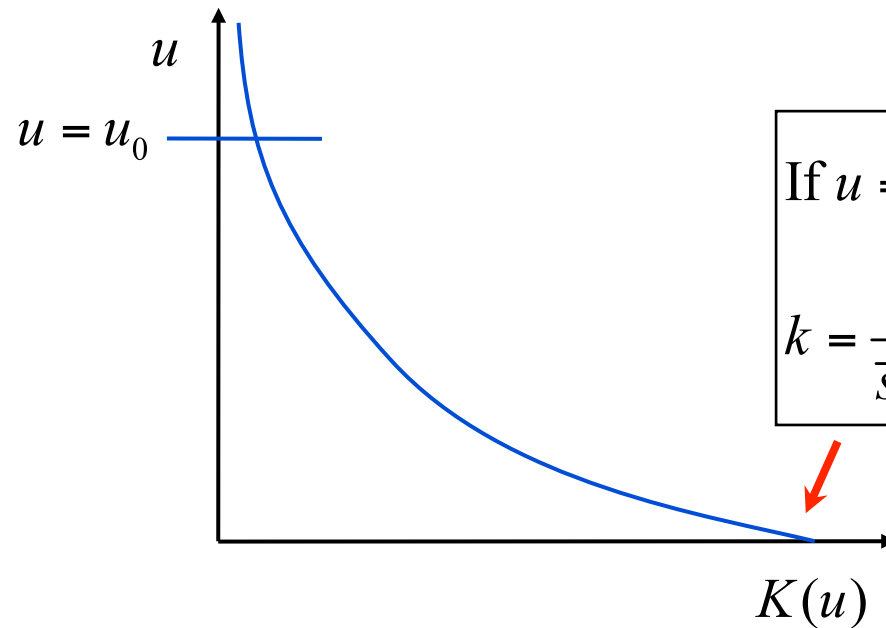
- In other words, the ***density  $k$  is a function of the space-mean speed  $u$***
- Relation will be influenced by
  - Road characteristics (grade, width, etc.)
  - Flow composition (% trucks, % commuters)
  - External / environmental conditions (weather, ambient conditions)
  - Traffic regulations
- What happens at  $u = 0$ ? I.e. what density occurs when traffic is stopped?
- Is this relation valid for  $k = 0$  (low density traffic)? Why (not)?

# Fundamental diagram

- Plot relation between speed and density

For  $k \downarrow 0 \rightarrow u = \infty$

$$u = U(k) = \frac{1}{kT} - \frac{\bar{s}_0}{T}$$

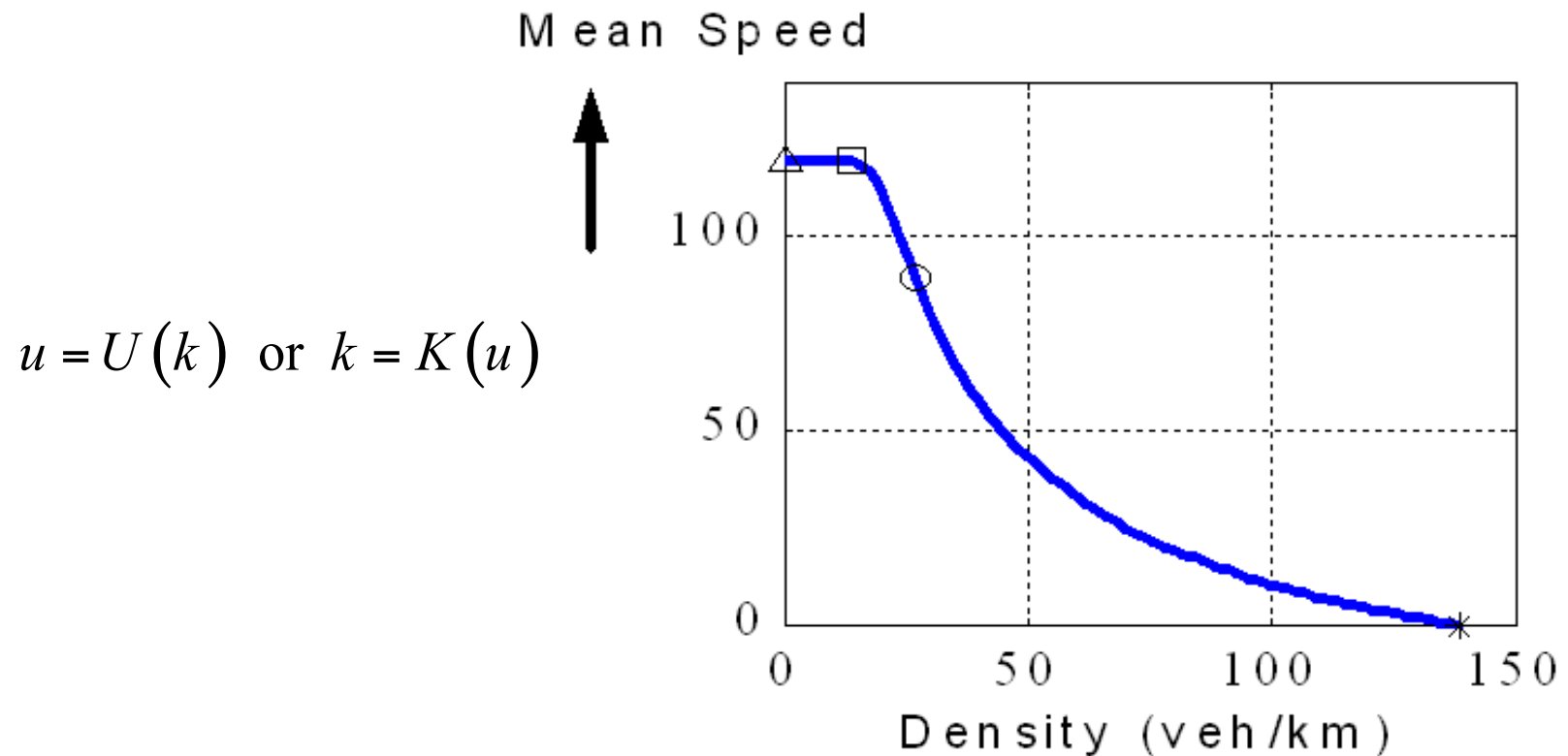


If  $u = 0$  then  $\frac{1}{kT} - \frac{\bar{s}_0}{T} = 0$

$$k = \frac{1}{\bar{s}_0} = k_{j(am)}$$

# Fundamental diagram

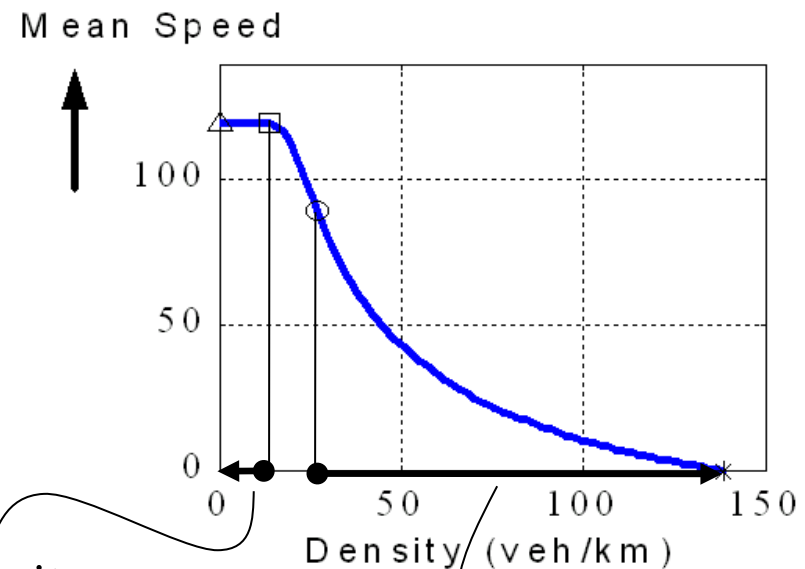
- In sum: considering a stationary / homogeneous flow → reasonable to assume that there exist some relation between density  $k$  and instantaneous speed  $u$



# Fundamental diagram

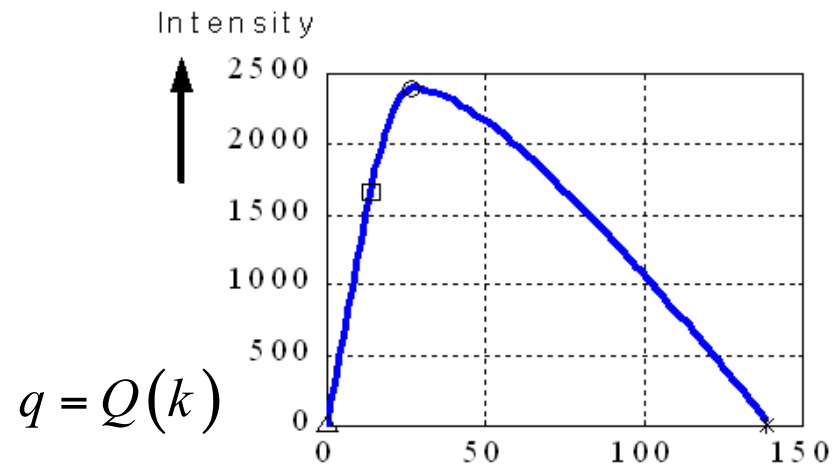
- Three relations are used in traffic flow theory:
  - $q = Q(k)$
  - $u = U(k)$
  - $u = U(q)$
- Relation does not imply causality: in congested conditions density (inverse distance headway) is determined by speed; flow under uncongested conditions is determined by density (via  $q = ku_0$ )

*Flow 'determined' by density  
and free speed*

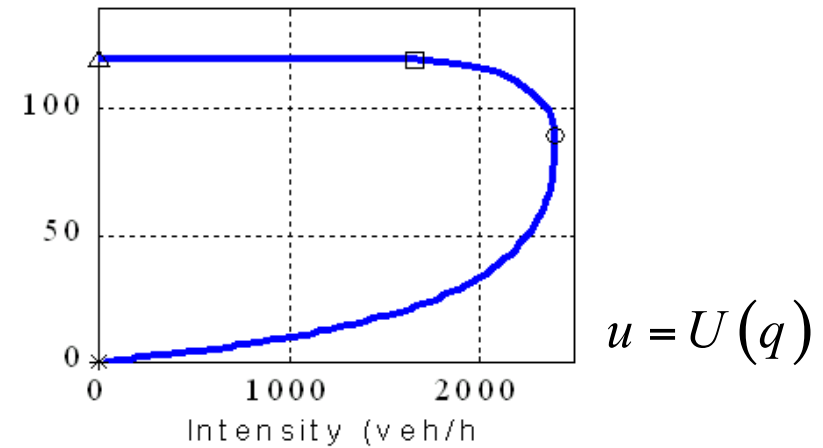
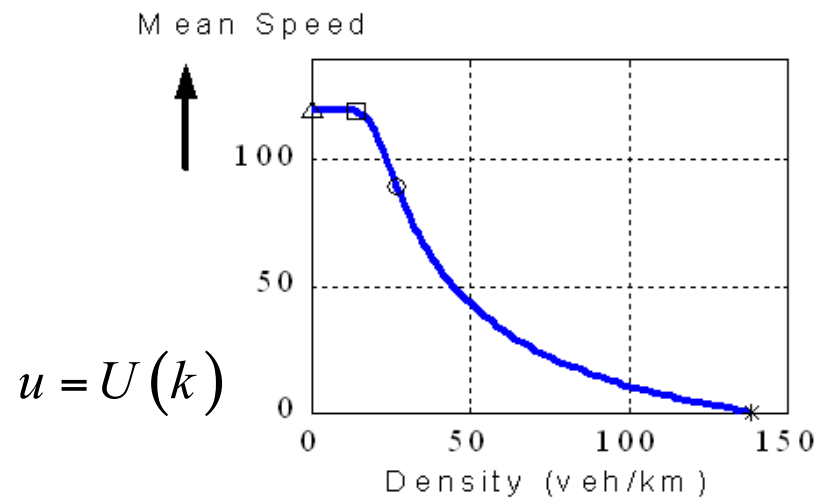


*Density determined by speed*

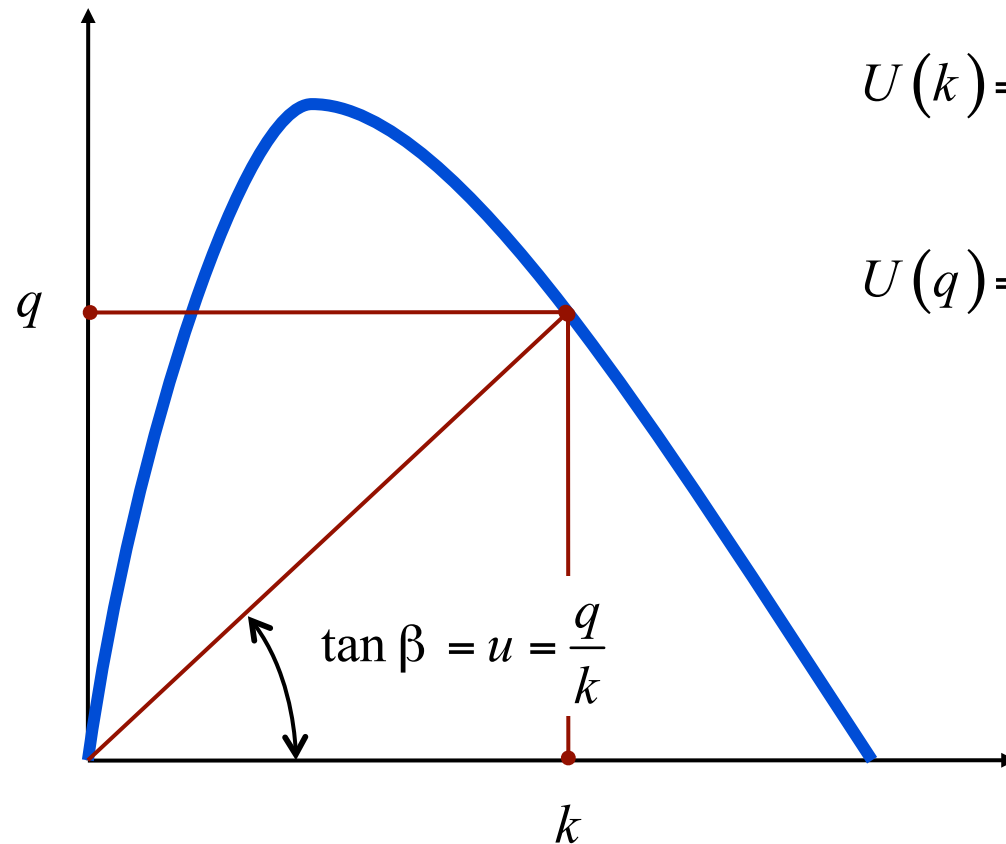
# Fundamental diagram



- $\triangle$  Empty Road
- $\square$  Max  $q$  with  $u = u_0$
- $\circ$  Capacity Point
- $*$  Jam Point



# Fundamental diagram

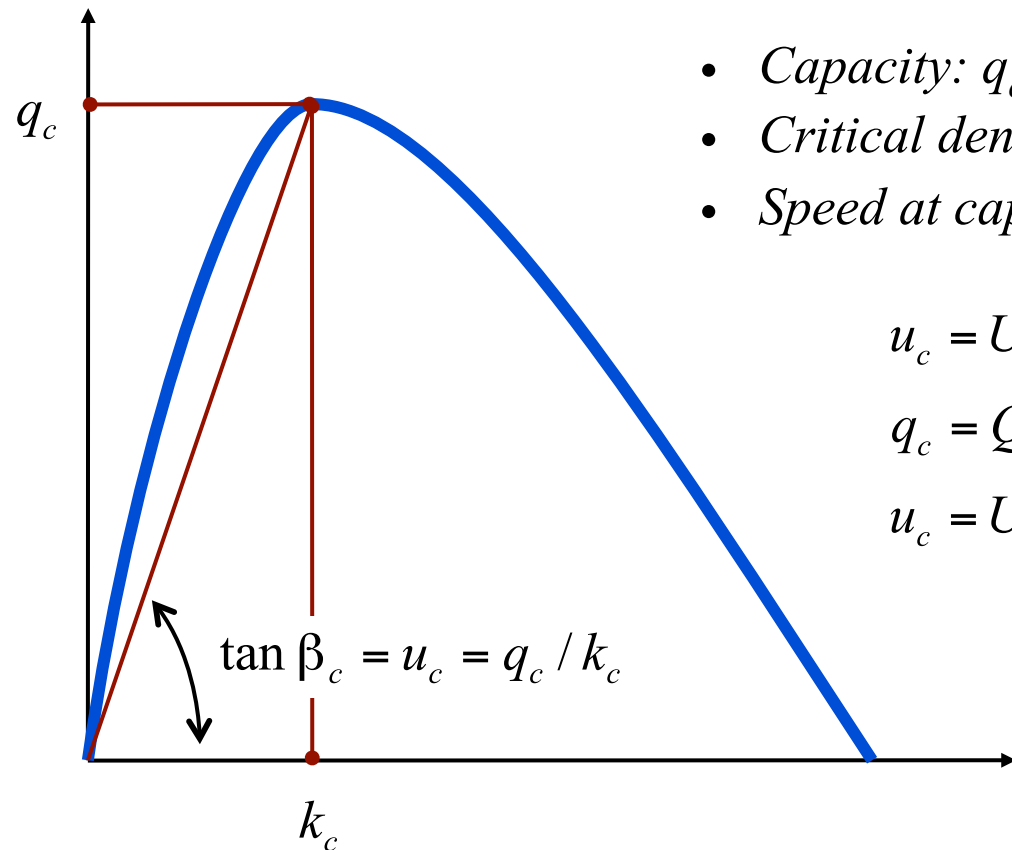


$$U(k) = \frac{q}{k} = \frac{Q(k)}{k}$$

$$U(q) = \frac{q}{k} = \frac{q}{K(q)}$$



# Fundamental diagram



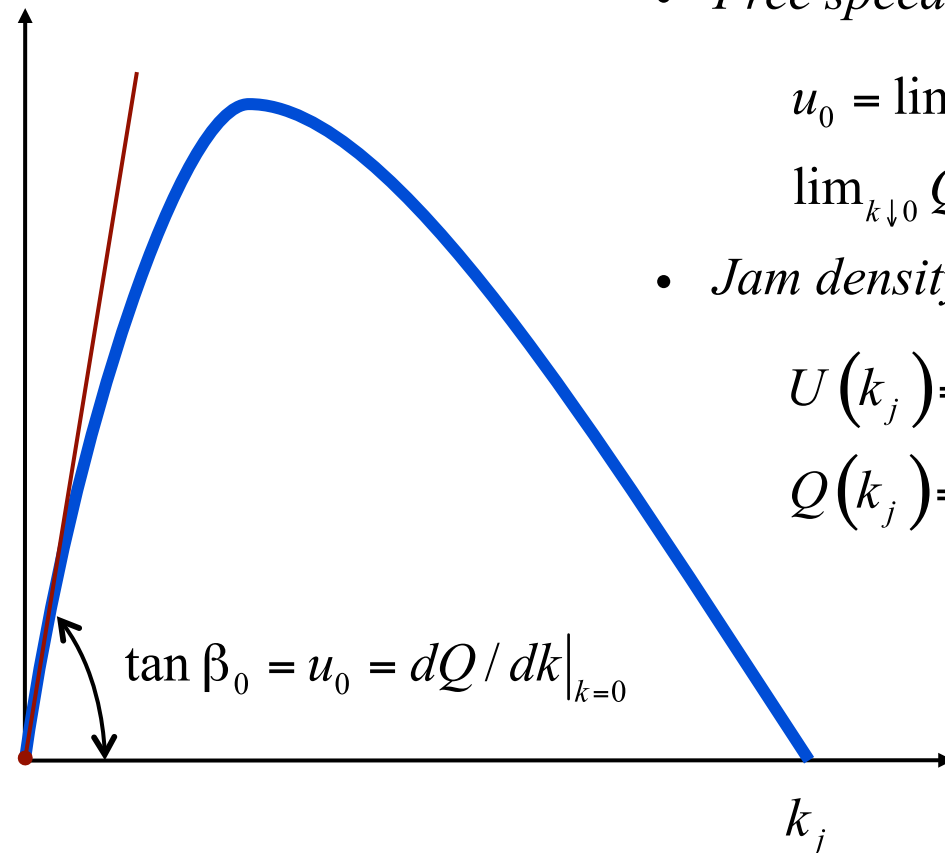
- Capacity:  $q_c$
- Critical density:  $k_c$
- Speed at capacity:  $u_c$

$$u_c = U(q_c)$$

$$q_c = Q(k_c)$$

$$u_c = U(k_c)$$

# Fundamental diagram



- Free speed:  $u_0$

$$u_0 = \lim_{k \downarrow 0} U(k)$$

$$\lim_{k \downarrow 0} Q(k) = 0$$

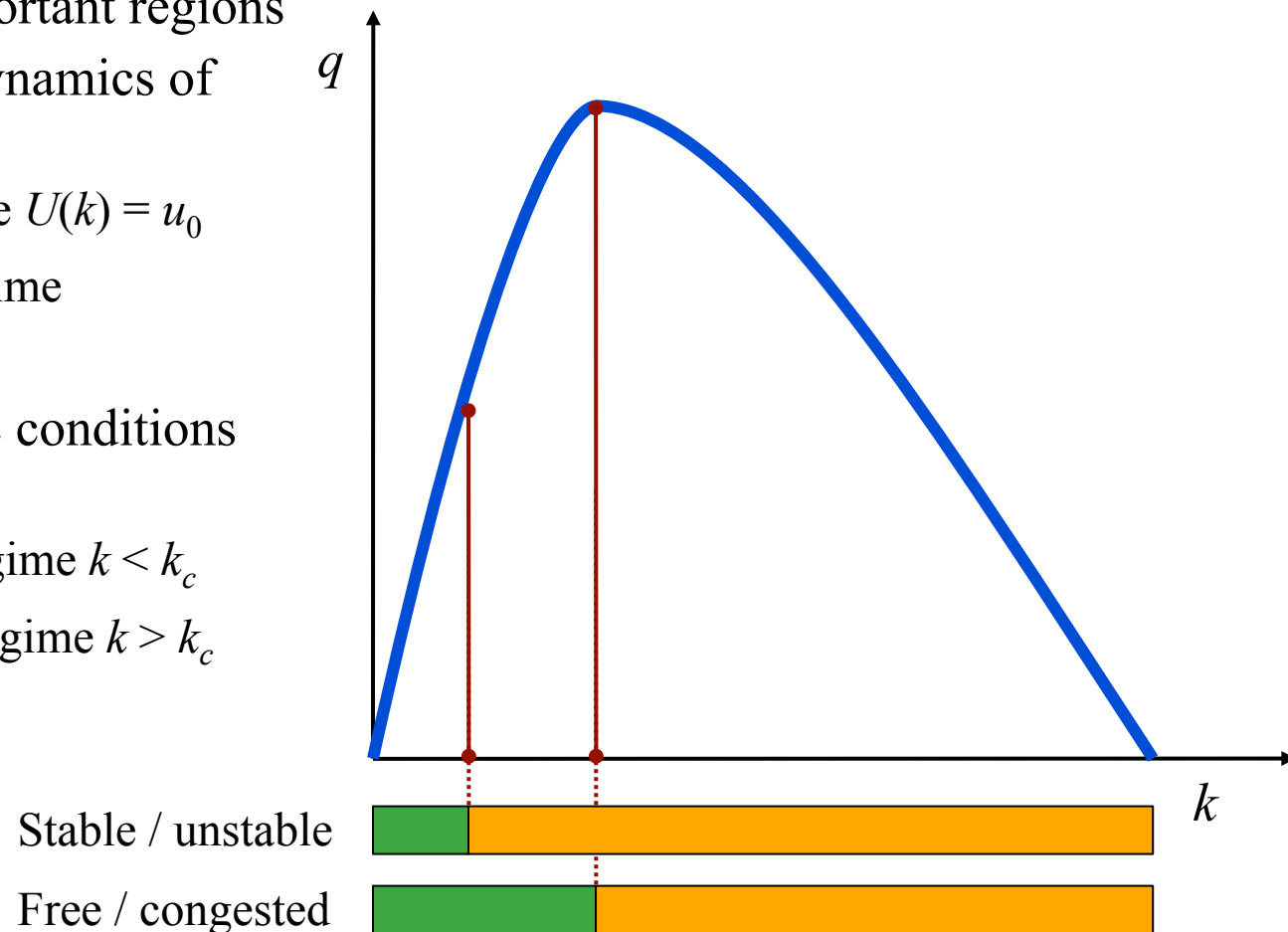
- Jam density  $k_j$

$$U(k_j) = 0$$

$$Q(k_j) = 0$$

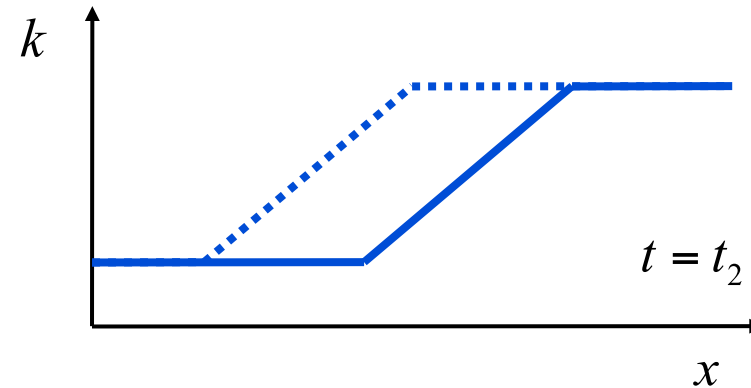
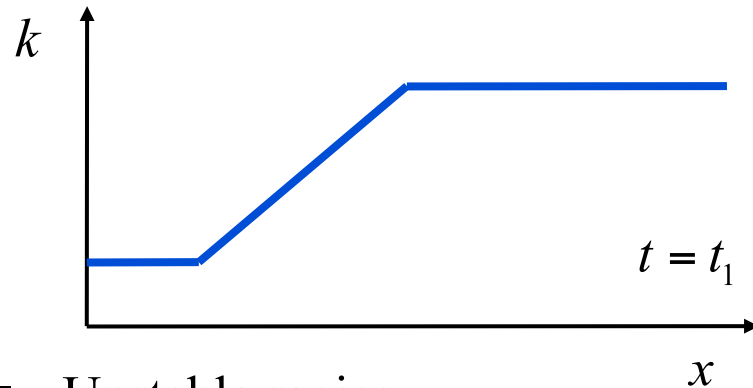
# Flow regimes

- Number of important regions
- Based on the dynamics of ‘disturbances’
  - Stable regime  $U(k) = u_0$
  - Unstable regime
- Based on traffic conditions (LOS)
  - Free flow regime  $k < k_c$
  - Congested regime  $k > k_c$

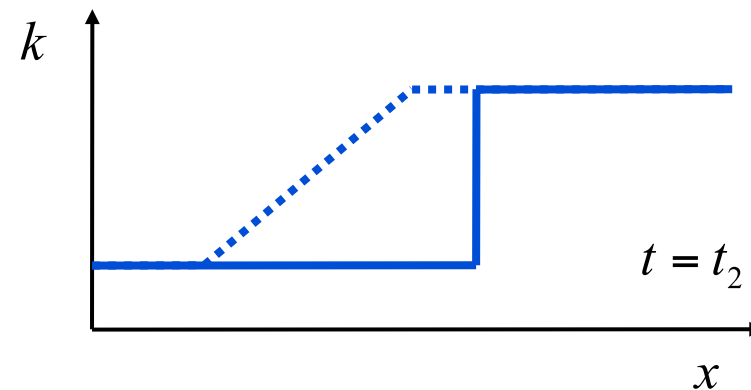
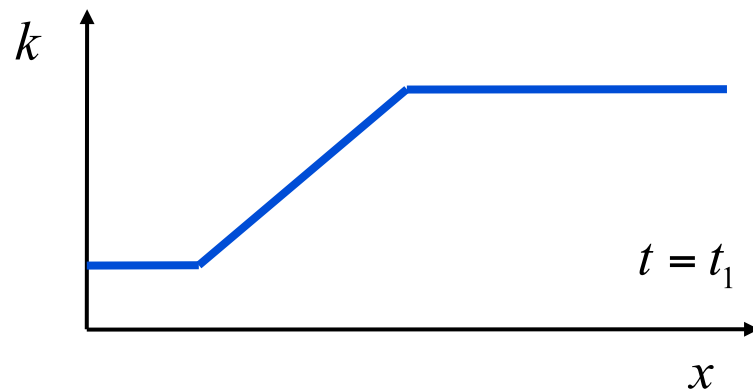


# Macroscopic flow models (chapter 8)

- Stable region

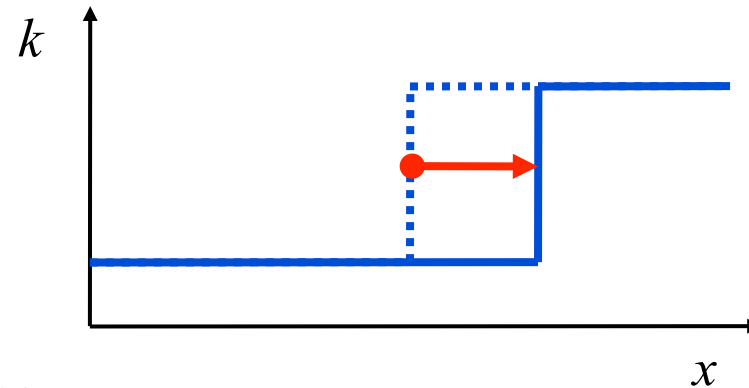


- Unstable region

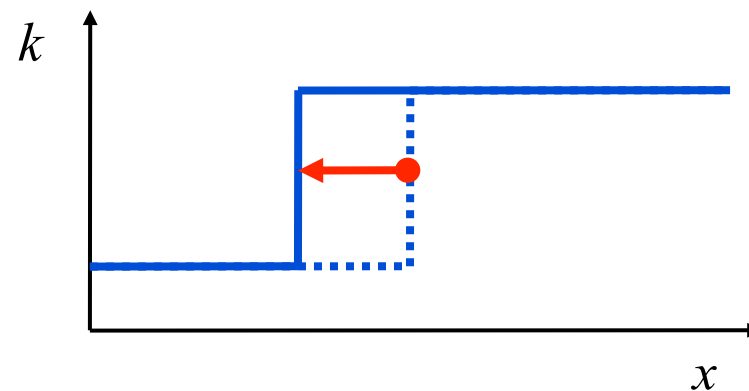


# Macroscopic flow models (chapter 8)

- Free flow regime



- Congested regime



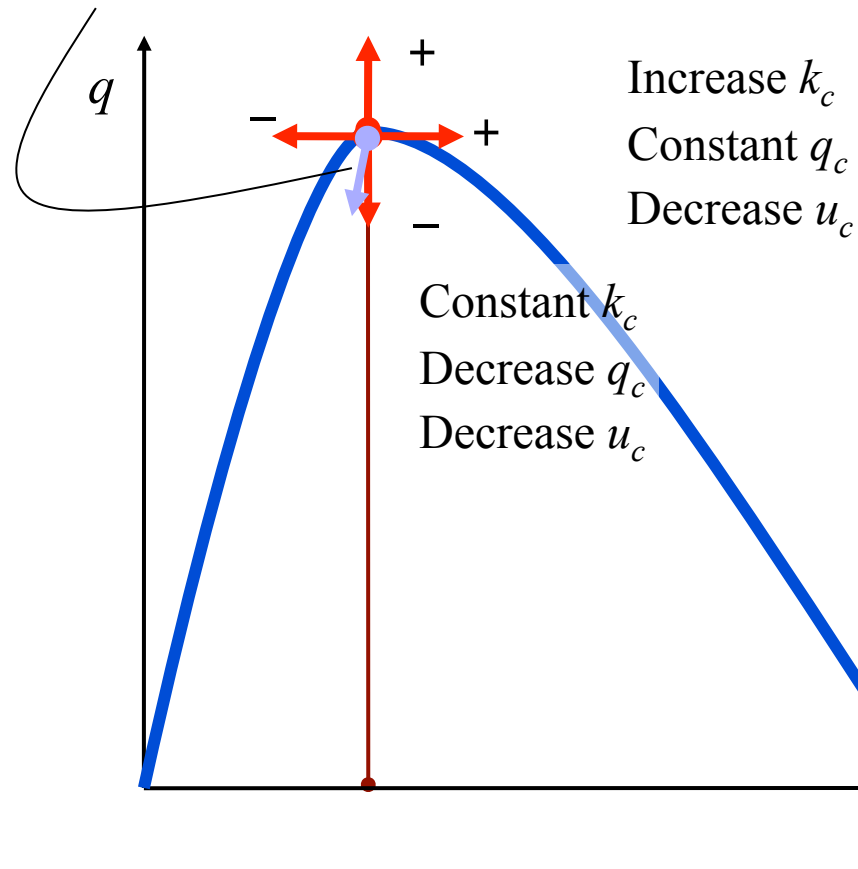
# Influence of circumstances on capacity

- Non-ideal conditions

Circumstances	Capacity
Ideal conditions	100%
Darkness (no illumination)	95%
Darkness (with illumination)	97%
Dense Asphalt Concrete (DAC) <sup>2</sup> with rain	91%
Open Asphalt Concrete (OAC) with rain <sup>3</sup>	95%
DAC / rain / darkness	88%
DAC / rain / darkness / illumination	90%
OAC / rain / darkness	91%
OAC / rain / darkness / illumination	92

## Effect of circumstances on capacity (2)

Effect of rain on  
capacity, density and speed



## Influence of circumstances on capacity (3)

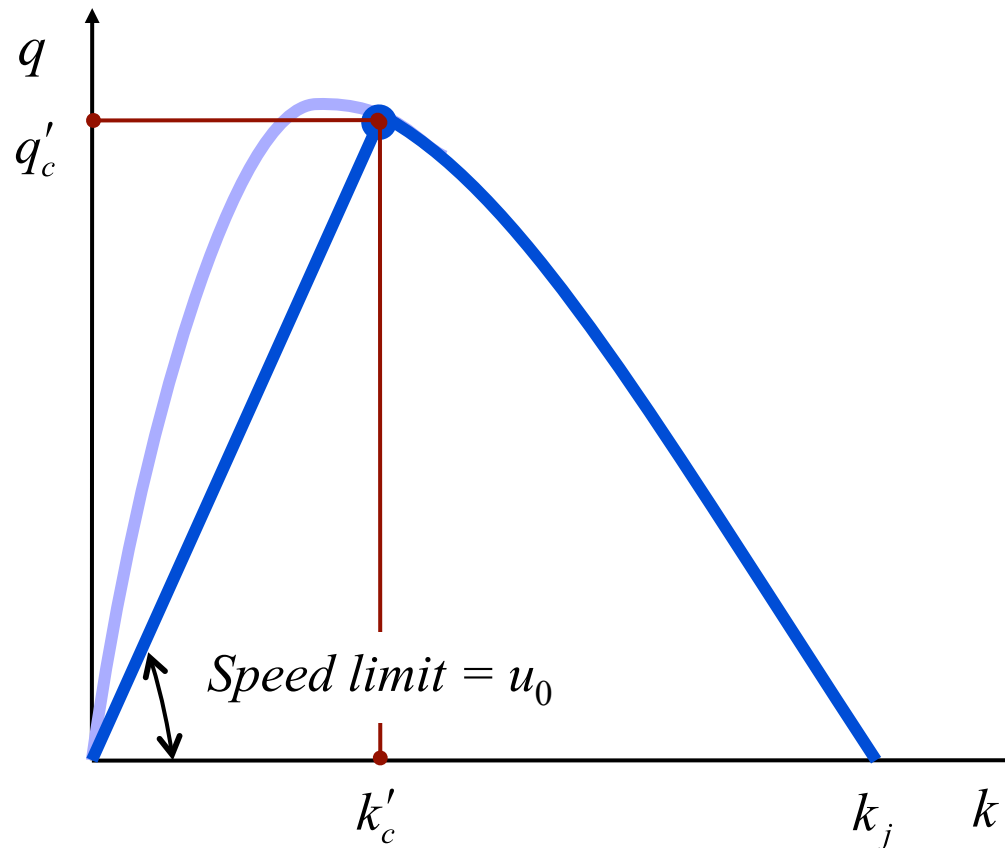
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- Effect of changing speed-limits (e.g. from 120 to 80 km/h)
- Question: how will the fundamental diagram change due to a speed limit?
- Please draw the diagram for a speed limit of 80 km/h and 50 km/h



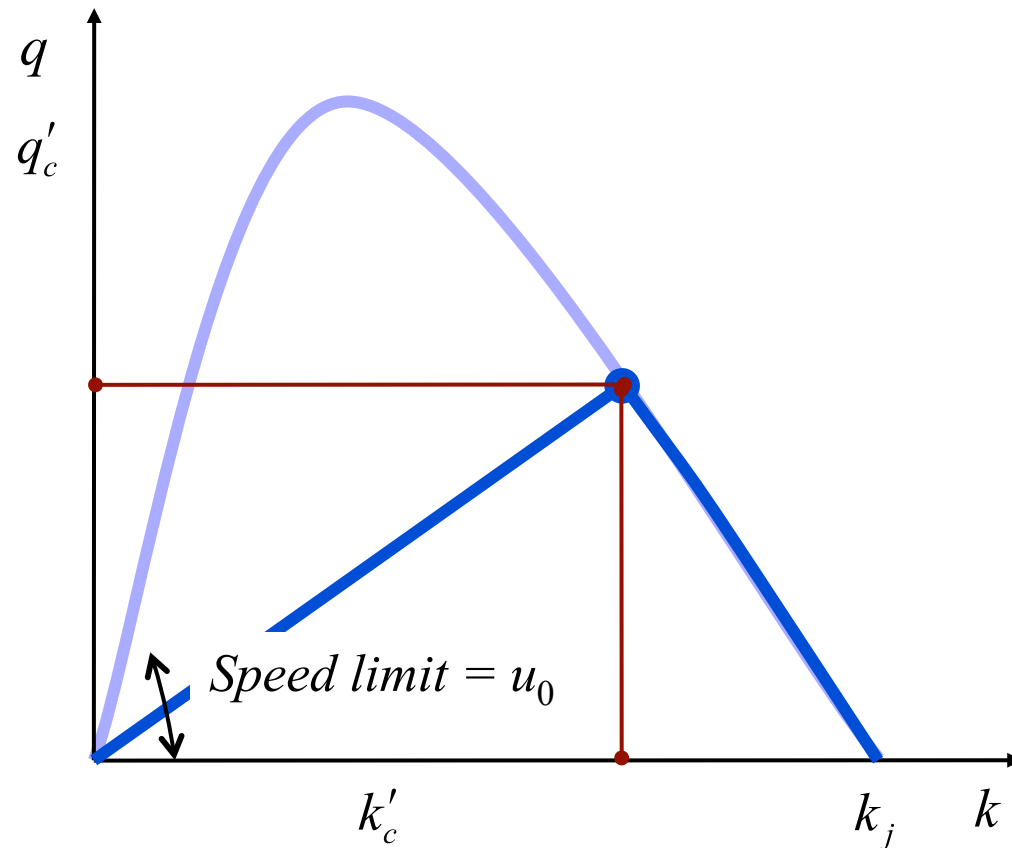
## Influence of circumstances on capacity (3)

- Effect of changing speed-limits (e.g. from 120 to 80 km/h)



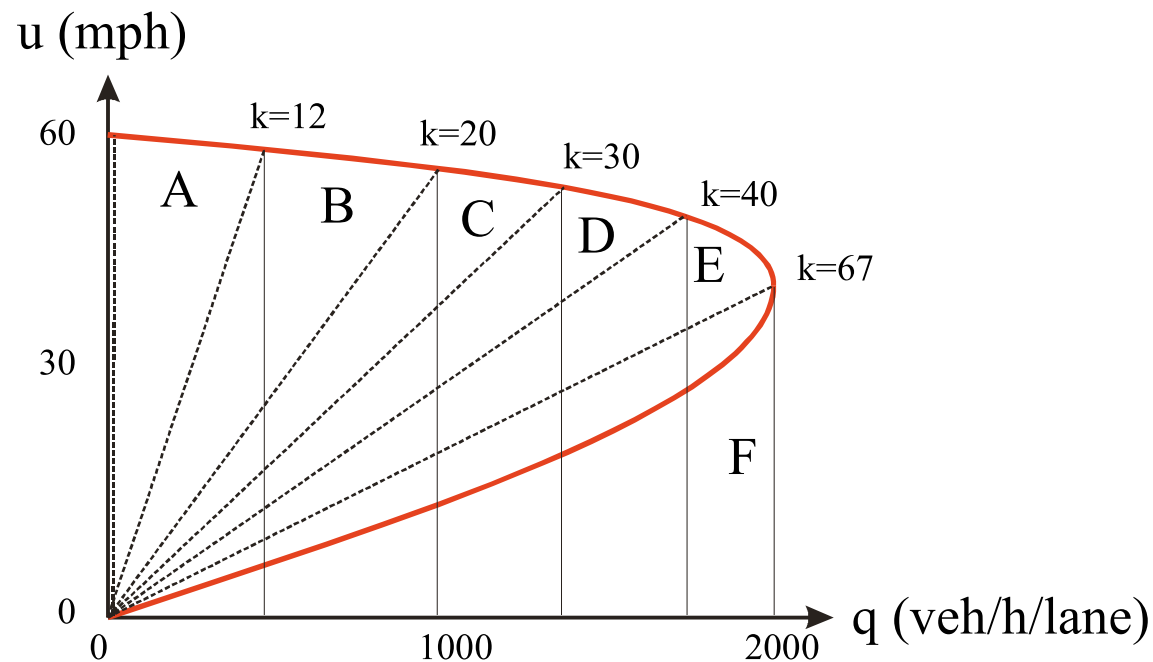
## Influence of circumstances on capacity (4)

- Effect of changing speed-limits (e.g. from 120 to 50 km/h)

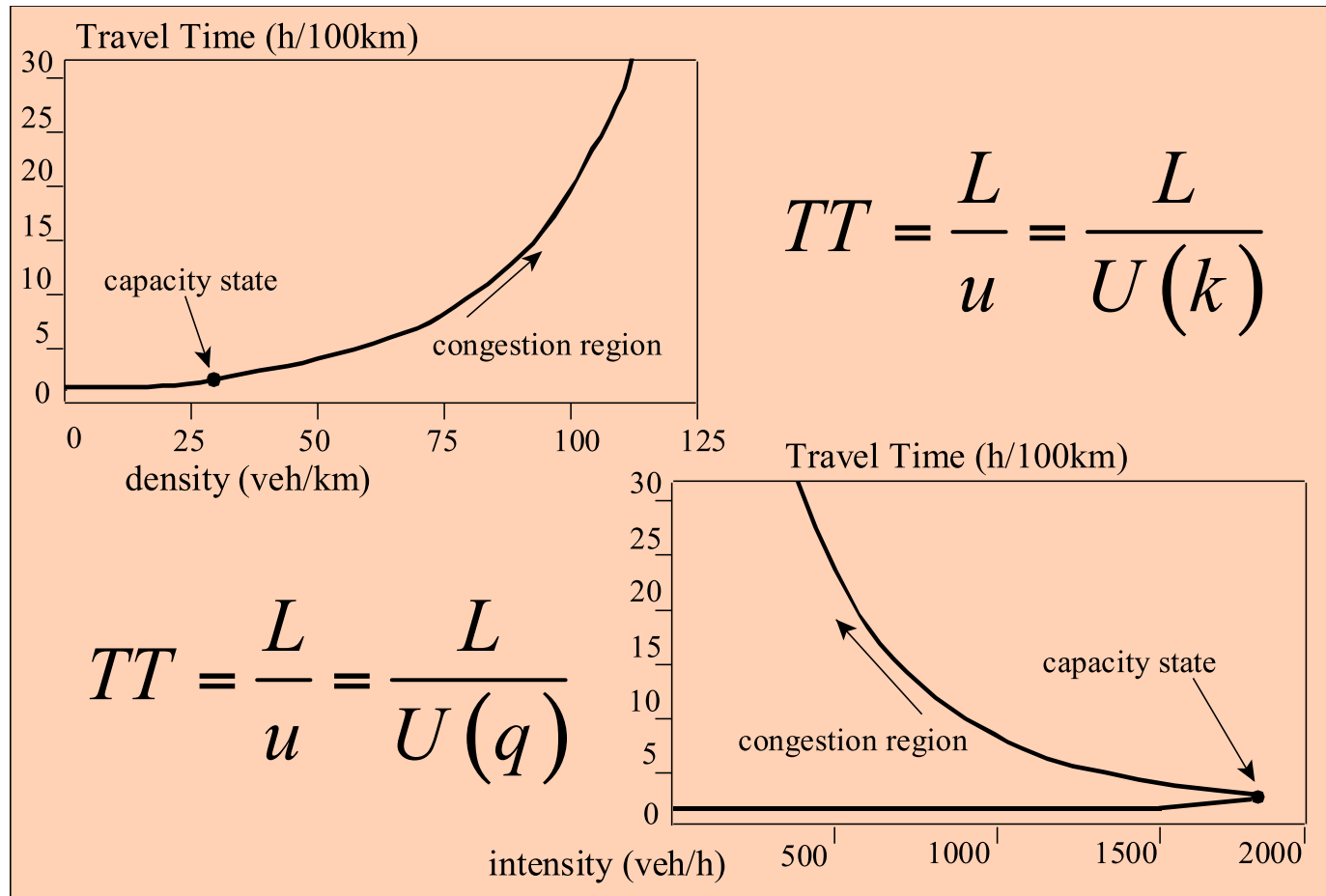


# Importance of Fundamental Diagram

- Definition of Level of Service (LOS)
- Relation between intensity and travel time
- Capacity estimation
- Shockwave analysis and macroscopic traffic flow models

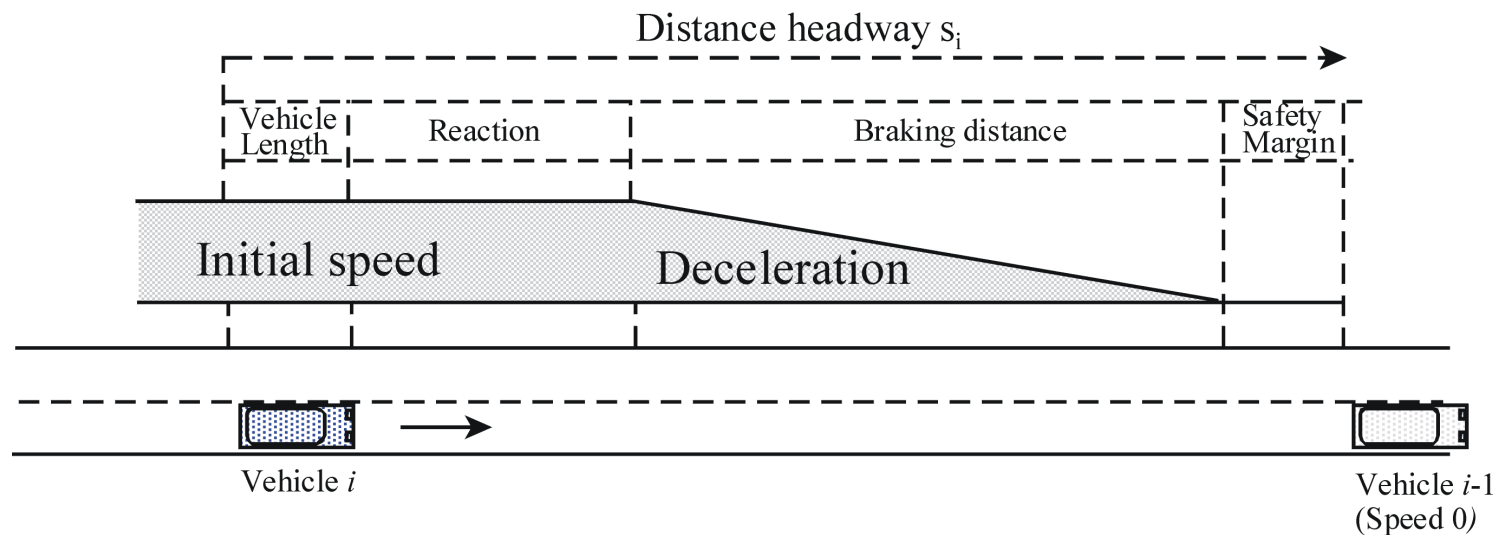


# Importance of Fundamental Diagram (2)



# Fundamental diagram and car-following

- Car  $i$  following car  $i-1$
- Behavioral assumptions regarding driver behavior:
  - Keep safe distance between vehicles
  - Vehicle  $i$  has a max. deceleration rate  $a > 0$
  - Vehicle  $i-1$  might suddenly brake with deceleration rate  $\alpha \cdot a$  to complete stop
  - Safety margin between vehicles when coming to stop =  $L_m$



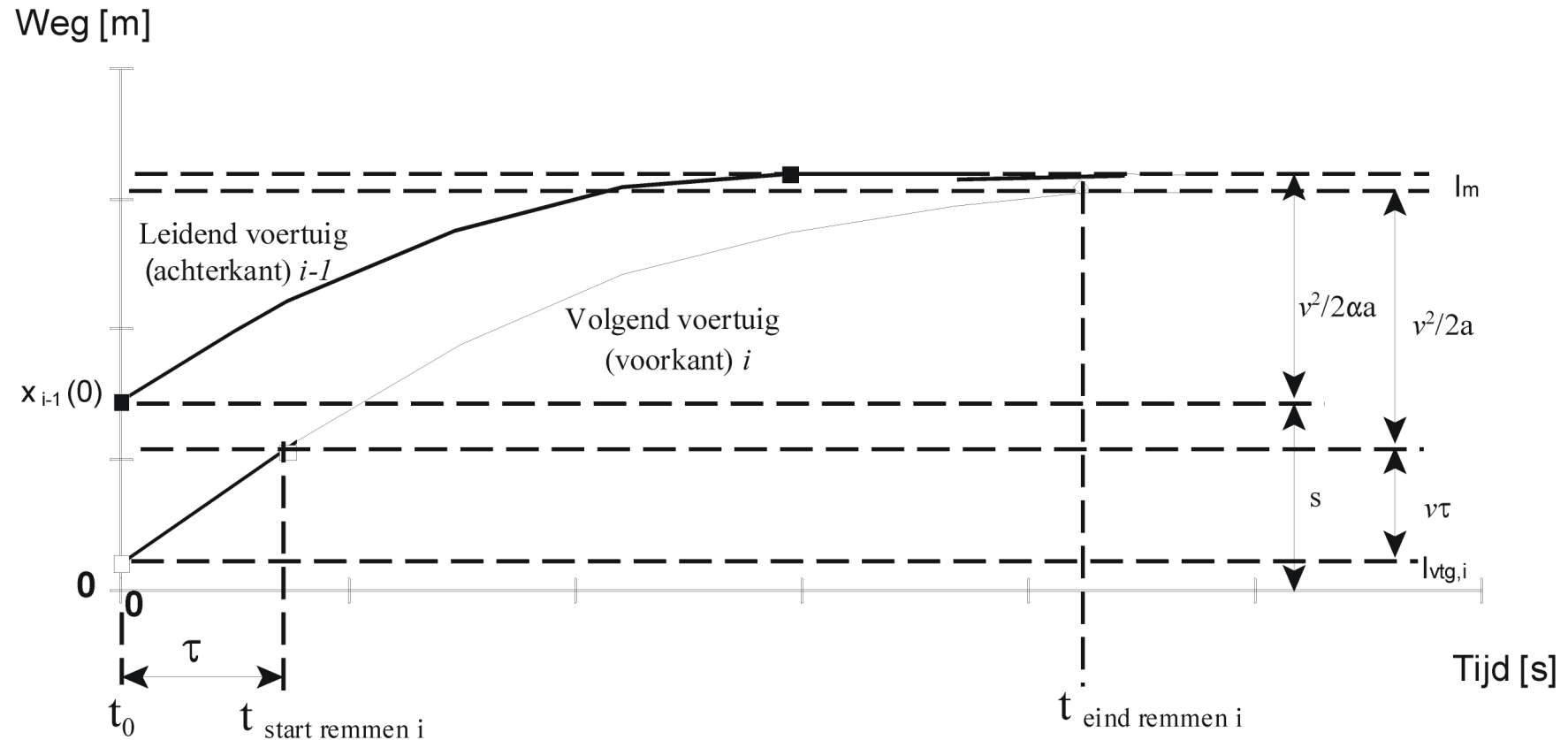
# Exercise

- Assume that driver  $i$  has reaction time  $T_i$
- Determine the distance driver  $i$  needs to maintain in order to be able to stop at distance  $L_m$  when the vehicle in front stops with maximum acceleration
- Initial distance headway? (for  $t < t_0$ )

$$s_i(t) = \text{distance\_travelled\_to\_stop}_i + L_{veh} + L_m \\ - \text{distance\_travelled\_to\_stop}_{i-1}$$

- This rule results in the fact that after braking, vehicles have net distance  $L_m$
- Based on this driving distance, how can you determine the fundamental diagram from this driving rule?

# Fundamental diagram and car-following



## Fundamental diagram and car-following (2)

- Factor  $\alpha$  expresses attitude towards risk
- For general drivers:  $\alpha \geq 1$
- Distance traveled by  $i-1$  before coming to standstill:  $\frac{v_i^2}{2\alpha a_i}$
- Distance traveled by  $i$  before coming to standstill:  $v_i T_i + \frac{v_i^2}{2a_i}$
- For the safe distance headway we thus find:

$$s_i = \underbrace{L_{veh} + L_m}_{\text{stopping distance between } i \text{ and } i-1} + \underbrace{vT + \frac{v^2}{2a}}_{\text{distance travelled until stopped by vehicle } i} - \underbrace{\frac{v^2}{2\alpha a}}_{\text{distance travelled until stopped by vehicle } i-1} = s_0 + vT + \frac{v^2}{2a} \left( 1 - \frac{1}{\alpha} \right)$$

$$\left( \text{What if } vT + \frac{v^2}{2a} < \frac{v^2}{2\alpha a} ? \right)$$



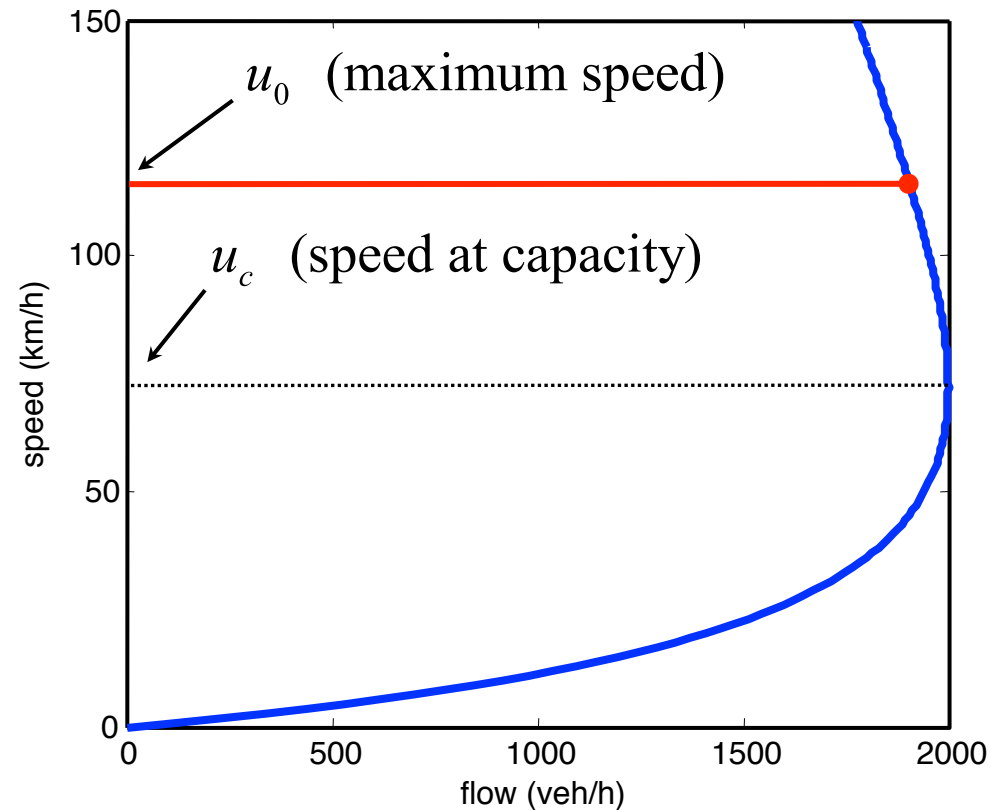
# Fundamental diagram and car-following (3)

- Assume that  $s_i = s$  is the average distance headway of all vehicles
- $s = 1/k$  and  $s_0 = 1/k_j$

$$\frac{1}{k} = \frac{1}{k_j} + uT + \frac{u^2}{2a} \left( 1 - \frac{1}{\alpha} \right)$$

$\Leftrightarrow$

$$q = \frac{1}{\frac{1}{uk_j} + T + \frac{u}{2a} \left( 1 - \frac{1}{\alpha} \right)}$$



## Fundamental diagram and car-following (4)

- How can you determine the capacity of this model?
- Determine critical speed  $u_c$  for which

$$\frac{dq(u)}{du} = 0$$

Ⓐ

$$u_c = \sqrt{\frac{2}{k_j} \frac{a\alpha}{\alpha - 1}}, \quad q_c = \frac{u_c k_j}{2 + Tu_c k_j} \quad \text{and} \quad k_c = \frac{k_j}{2 + Tu_c k_j}$$

- What can we say for  $\alpha = 1$ ?

$$s_i = s_0 + v_i T_i \quad \text{Ⓐ} \quad q(u) = \frac{uk_j}{1 + Tuk_j}$$

- $q(u)$  is a monotonic increasing function of  $u \rightarrow u_c = \infty$

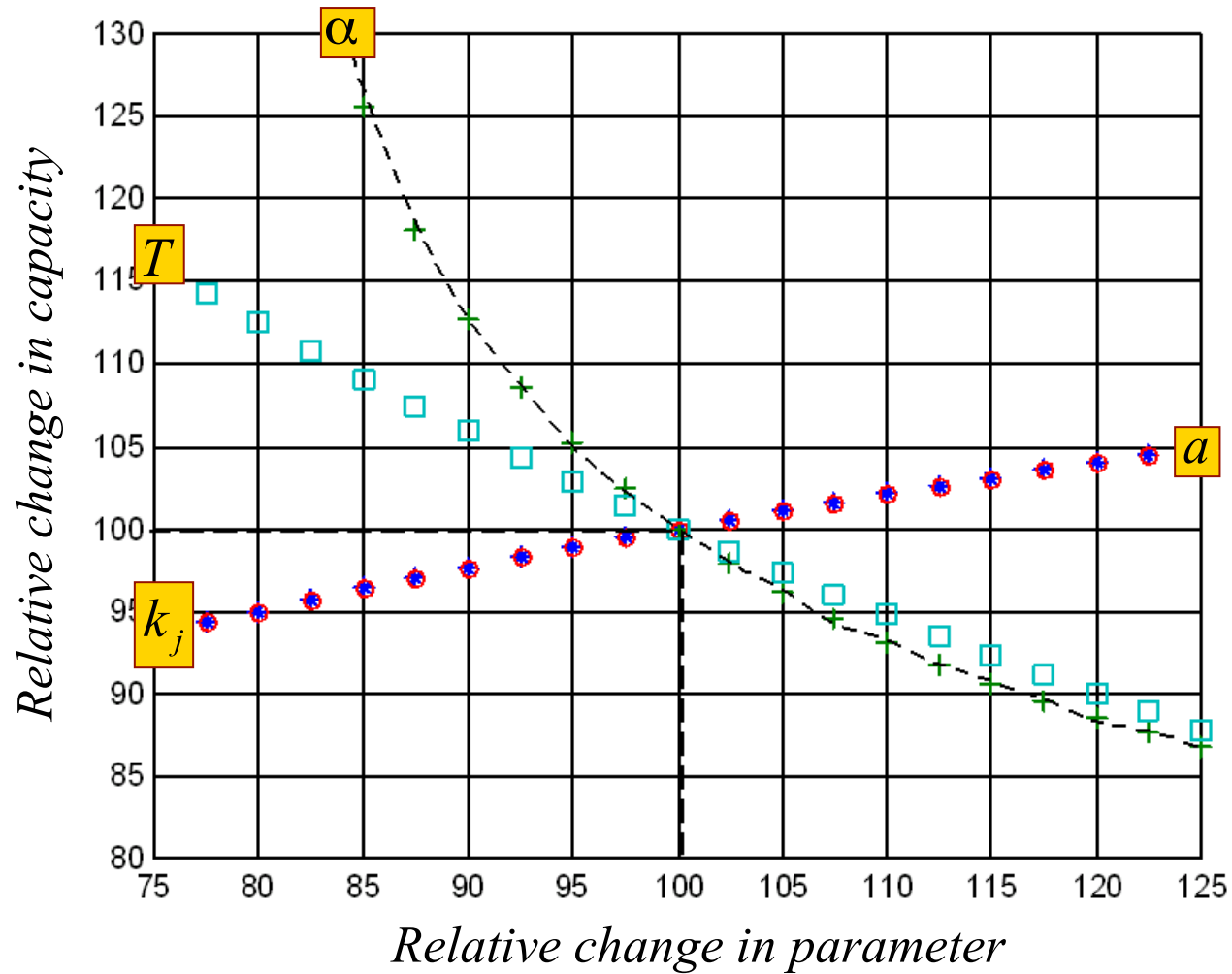
# Fundamental diagram and car-following (5)

- Effect of car-following parameters on capacity

$$q_c = \frac{1}{T + \sqrt{2(L_{veh} + L_m) \frac{1 - \alpha^{-1}}{a}}} < \frac{1}{T}$$

- Sensitivity analysis shows that capacity can be increased by:
  - Decrease  $\alpha$  (attitude towards risk)
  - Decreasing the (perceived) reaction time
  - Decreasing the vehicle length / safety margin
  - Increasing max. deceleration

# Fundamental diagram and car-following (6)



# Models of the fundamental diagram

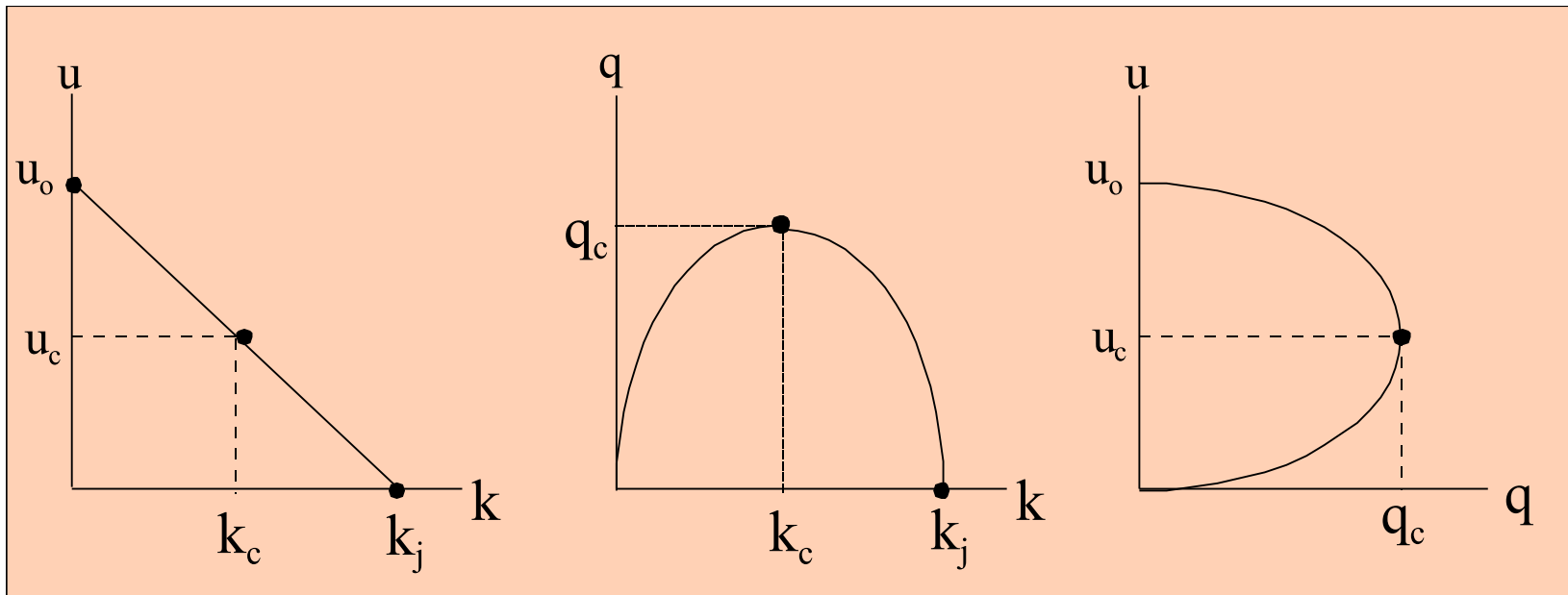
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- Approach to model derivation
  1. From microscopic theories about driver behavior (see example, but also car-following models of the stimulus-response type)
  2. Curve fitting to empirical observations
  3. Analogy with flow phenomena in other fields of science (e.g gas-dynamics)
- Remainder will consider some examples of fundamental diagrams that have been / are applied frequently in the past

## Models of the fundamental diagram (2)

- Model of Greenshields (based on seven observations!)

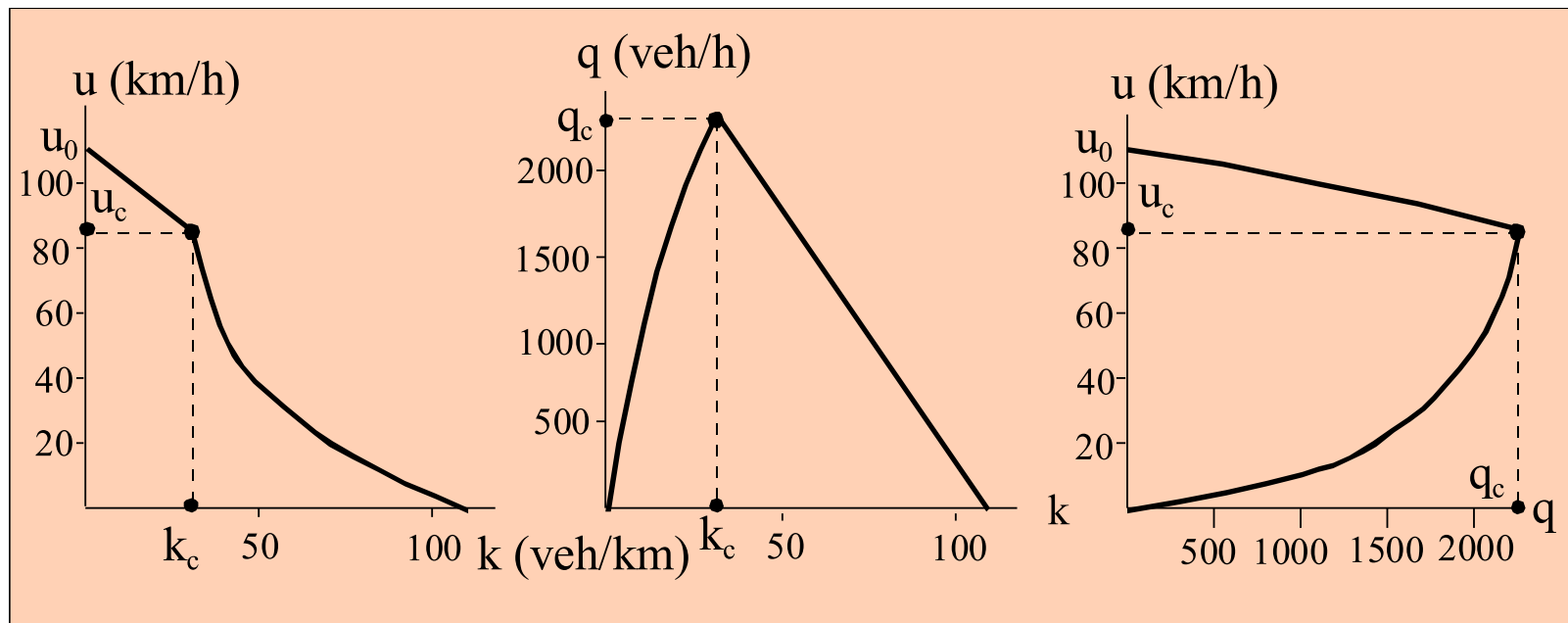
$$u = u_0 \left(1 - \frac{k}{k_j}\right) \quad q = u_0 k \left(1 - \frac{k}{k_j}\right) \longrightarrow k_c = \frac{k_j}{2} \quad u_c = \frac{u_0}{2} \quad q_c = \frac{k_j u_0}{4}$$



# Models of the fundamental diagram (3)

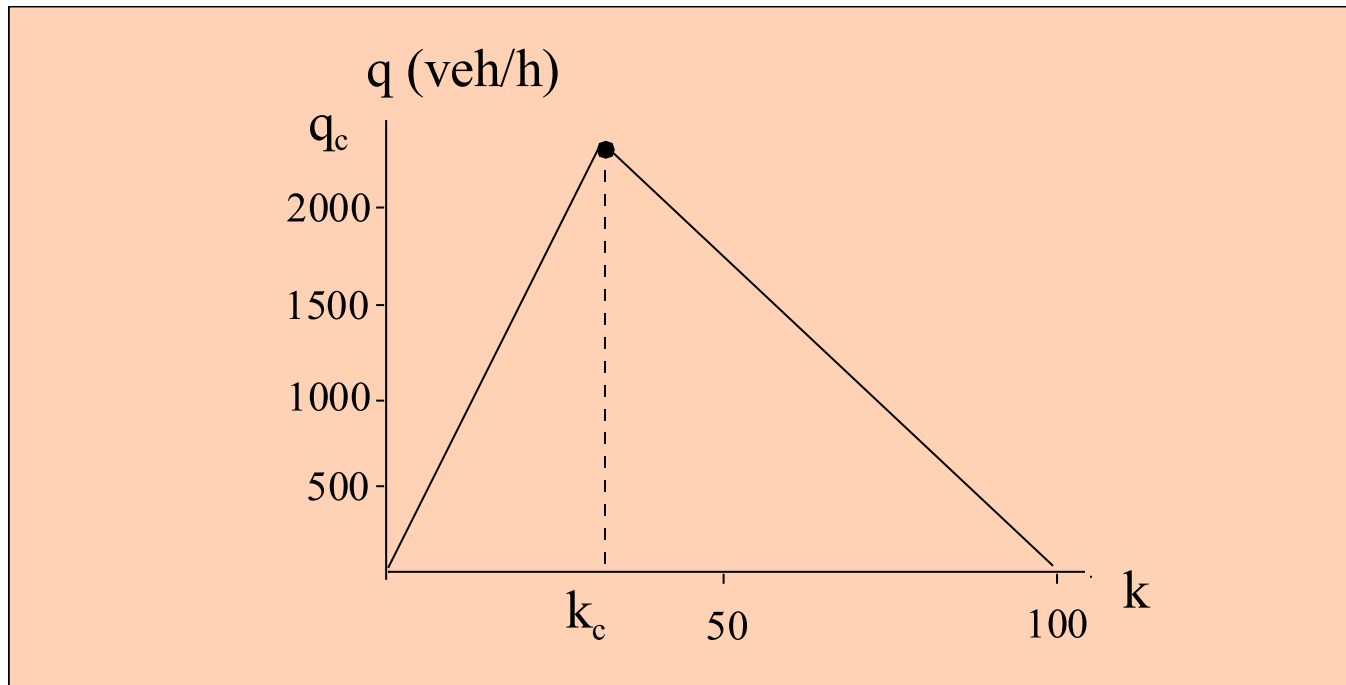
- Fundamental diagram of Smulders

$$u(k) = \begin{cases} u_0 \left(1 - k/k_j\right) & k < k_c \\ \beta \left(1/k - 1/k_j\right) & k > k_c \end{cases} \longrightarrow \beta = u_0 k_c$$



## Models of the fundamental diagram (4)

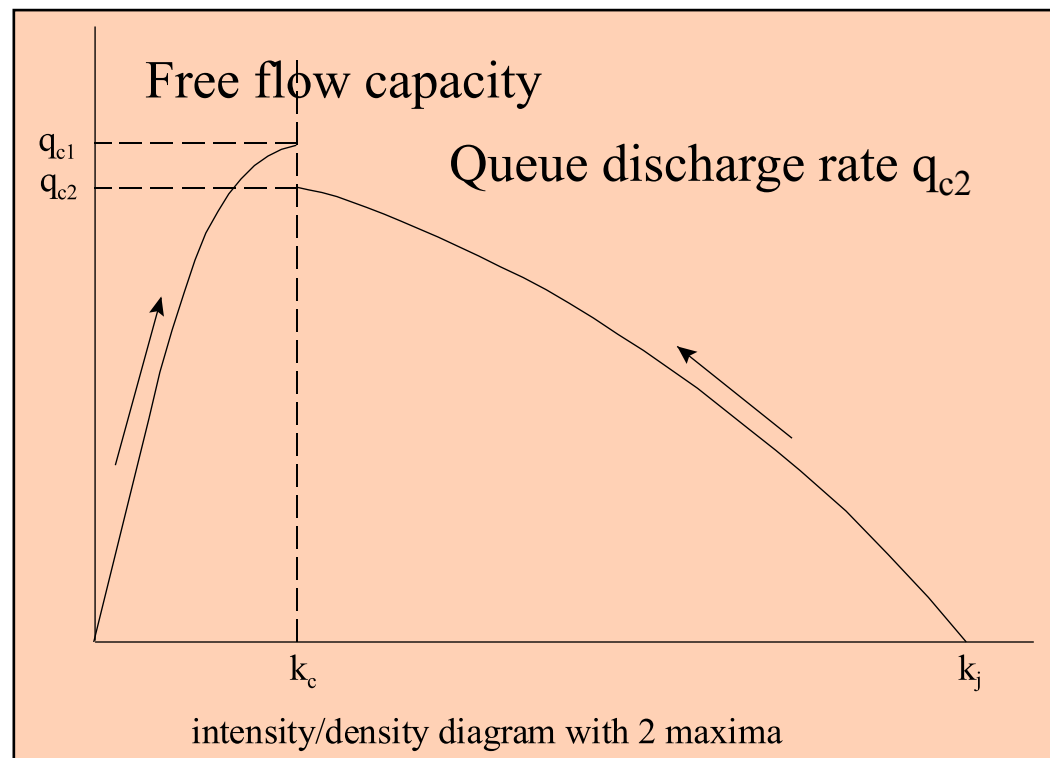
- Schematized model of Daganzo
- Two linear curves
- Free parameters:  $u_0$ ,  $q_c$ , and  $k_j$





# Concept of discontinuous diagram

- Discontinuity in the diagram around the capacity point



# Wu's model with capacity drop

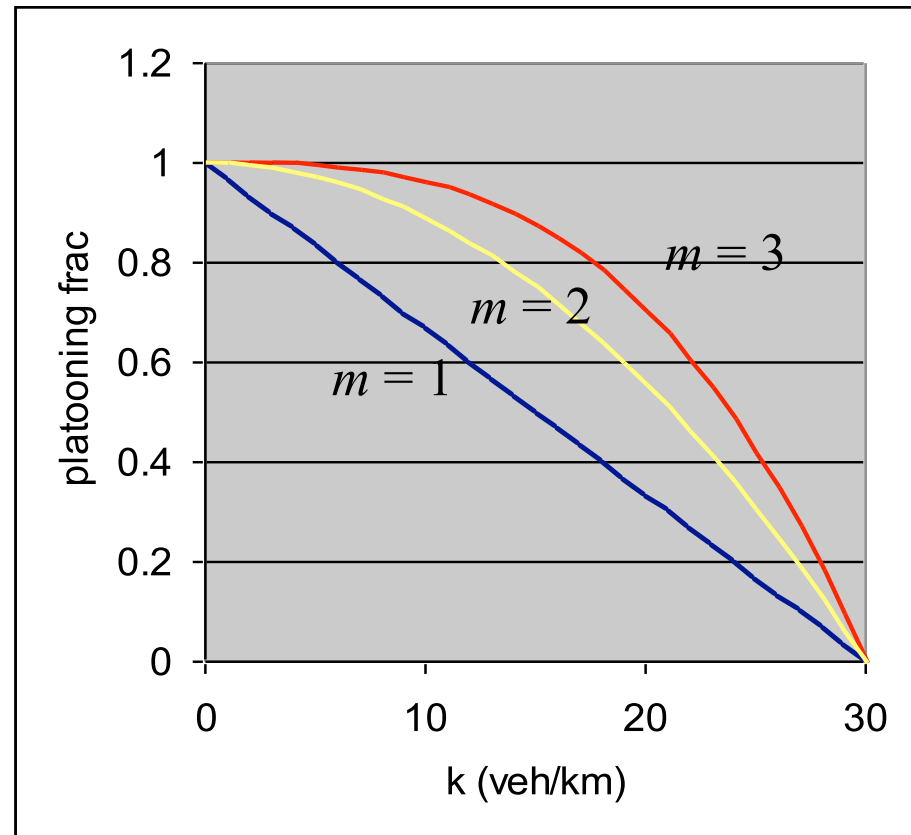
- Microscopic foundation
- Two regimes + mix
  - Free flow ( $0 < k < k_1$ )
  - Congested flow ( $k_2 < k < k_j$ )
- Model for the free-flow  $u(k) = \phi u_0 + (1 - \phi) u_p$ 
  - Free speed  $u_0$
  - Platooning fraction  $\phi$
  - Platooning speed  $u_p$

## Wu's model with capacity drop (2)

- For  $k = k_1$  all vehicles are platooning with speed  $u_p$

$$k_1 =$$

- Fraction of platooning vehicles for different roadway types (number of lanes)
- Why  $h_{net}^f$ ?
  - Observable in practice
  - Constant for all states



## Wu's model with capacity drop (3)

- Congested branch ( $k > k_2$ )
- All vehicles are in car-following state and remain at constant net headway

$$s_{net} = uh_{net}^c \quad \text{where } u = \text{mean speed}$$

$$s_{gross} = s_{net} + 1/k_j = uh_{net}^c + 1/k_j$$

$$k = 1/s_{gross} = \frac{1}{uh_{net}^c + 1/k_j}$$

- Which can be solved for  $u$  and leads to

$$u = \frac{1}{h_{net}^c} \left( \frac{1}{k} - \frac{1}{k_j} \right) \quad \text{and} \quad q = \frac{1}{h_{net}^c} \left( 1 - \frac{k}{k_j} \right)$$

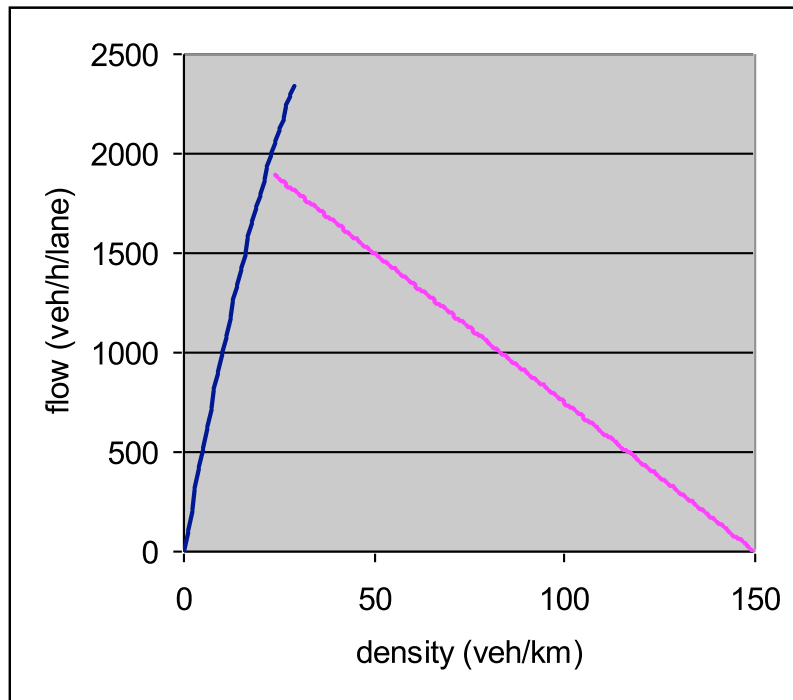
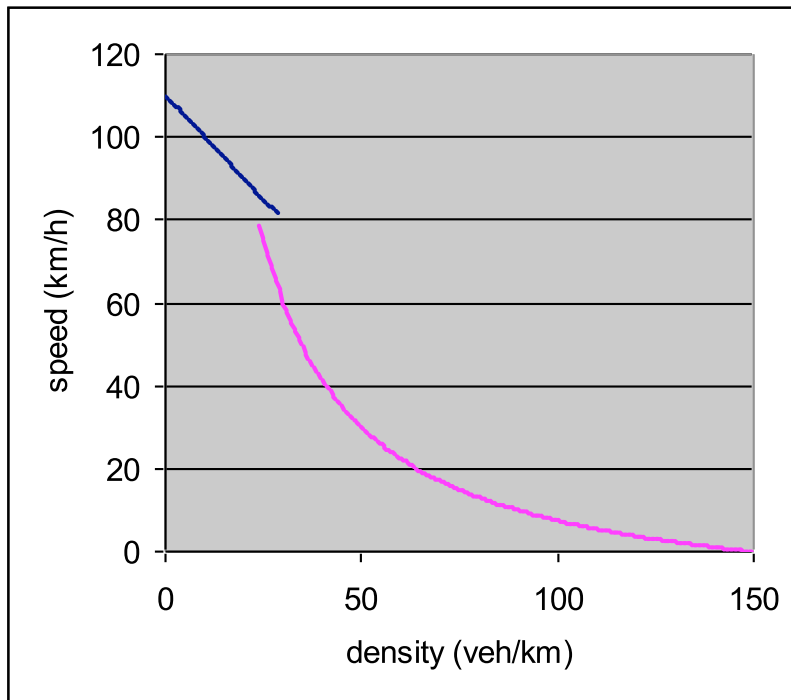
## Wu's model with capacity drop (4)

- Determine  $k_2$
- Assumption: maximum speed at congestion is equal to the minimum speed  $u_p$  during free flow (at which all vehicles are platooning)

$$u_p = \frac{1}{h_{net}^c} \left( \frac{1}{k_2} - \frac{1}{k_j} \right) \Rightarrow k_2 = \left( u_p h_{net}^c + 1/k_j \right)^{-1}$$

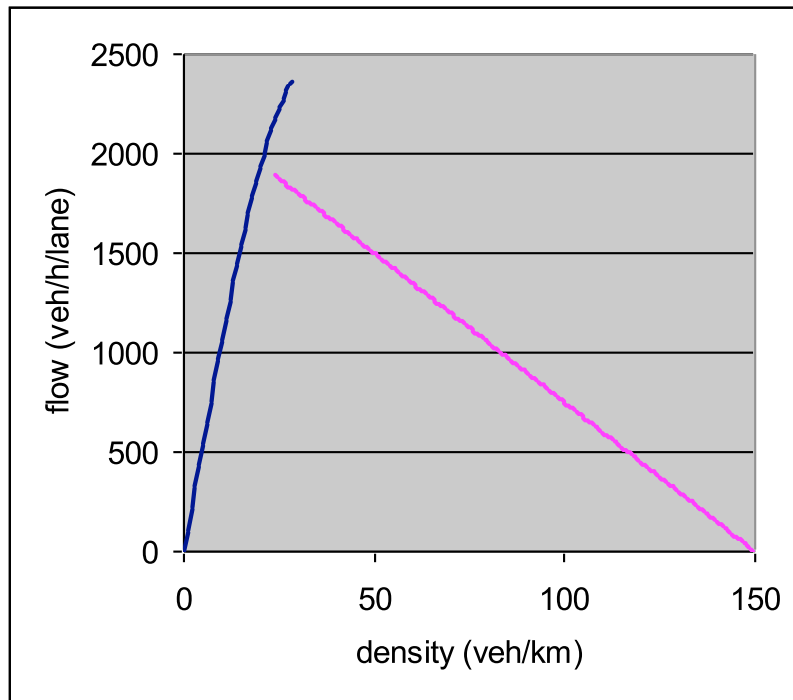
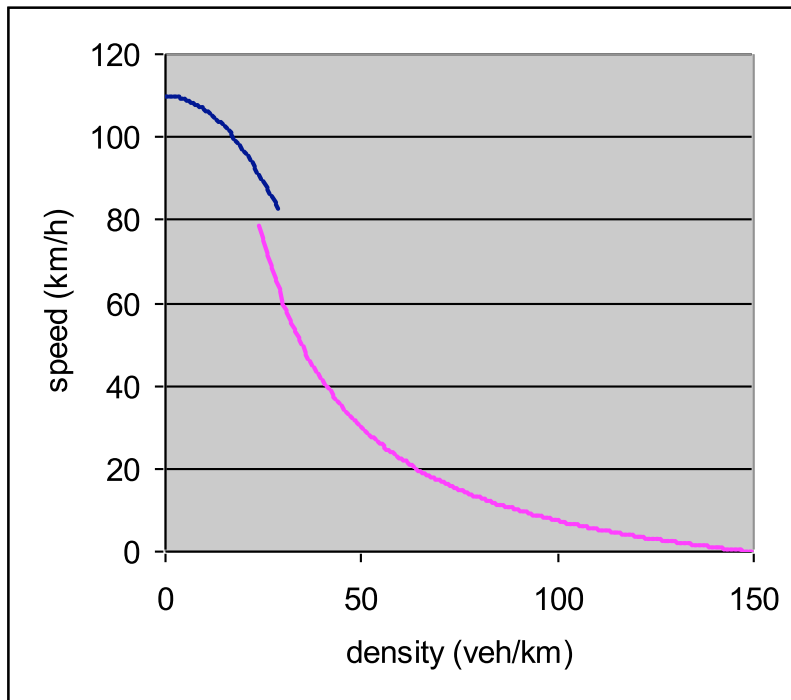
# Wu's model with capacity drop (5)

- One-lane road (capacity drop: approx. 21%)



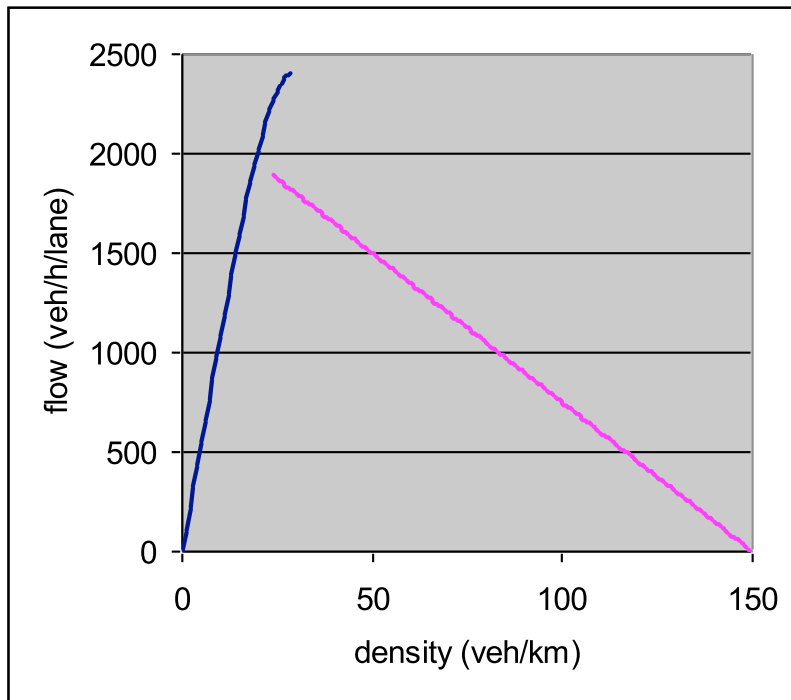
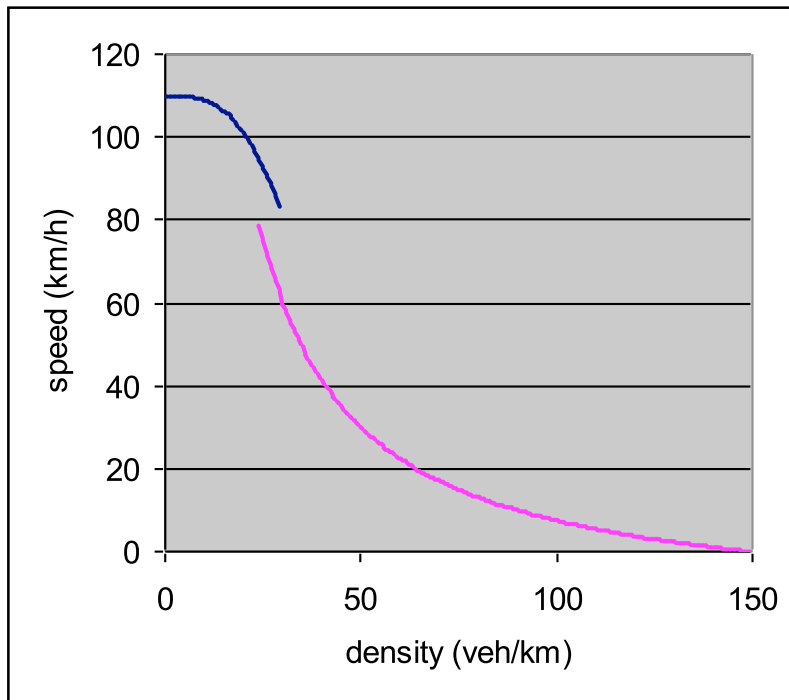
# Wu's model with capacity drop (6)

- Two-lane road



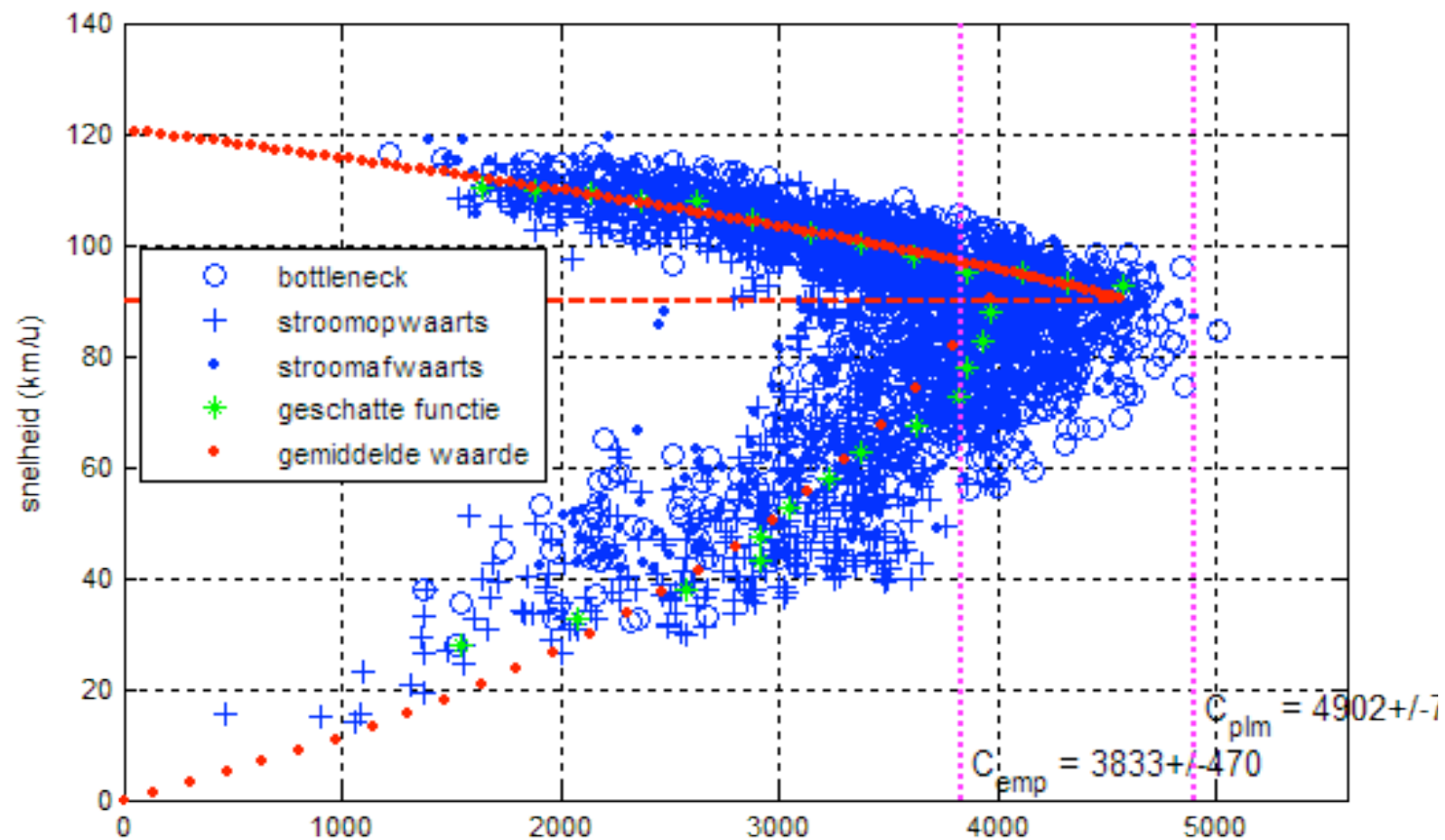
# Wu's model with capacity drop (7)

- Three-lane road

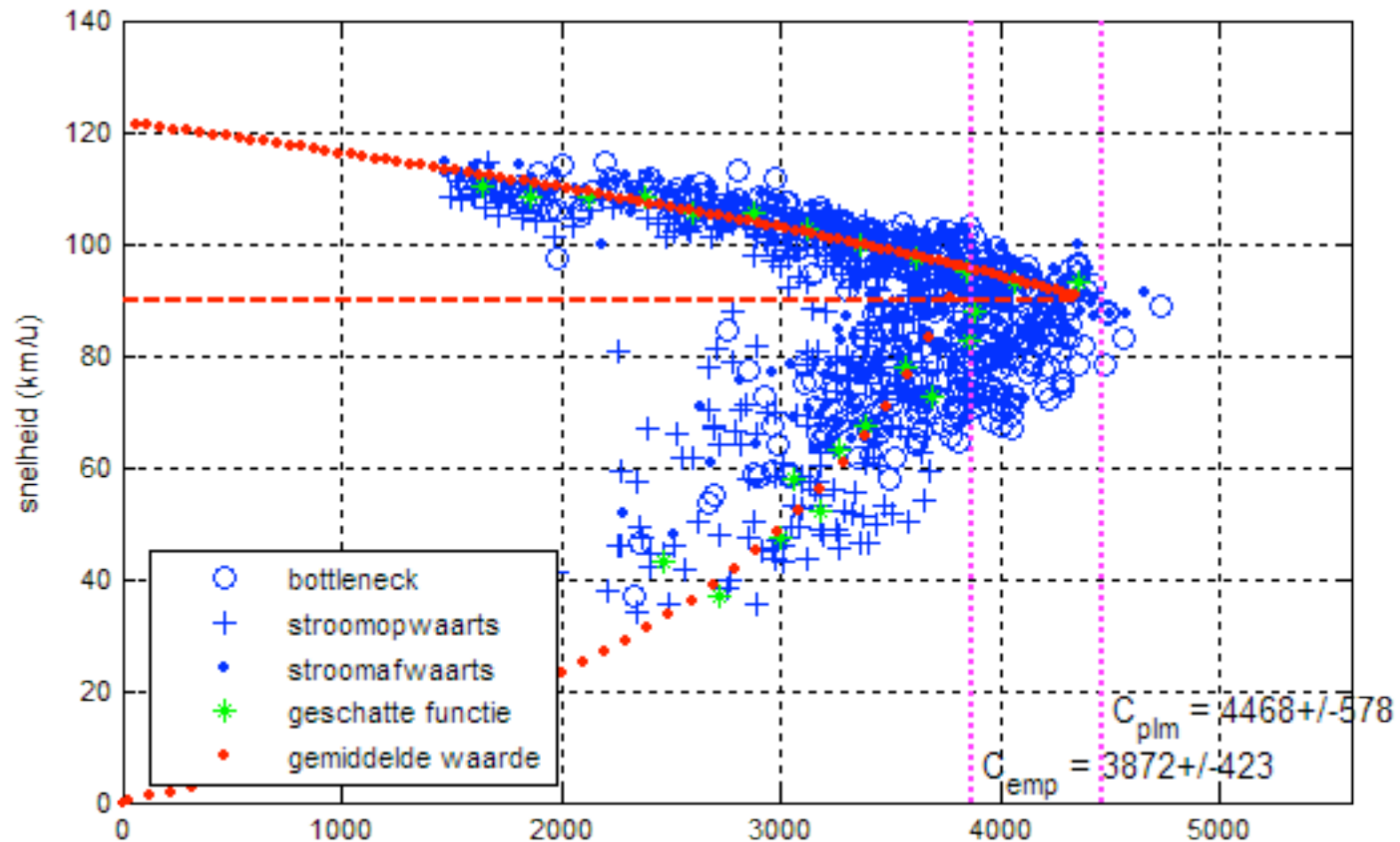




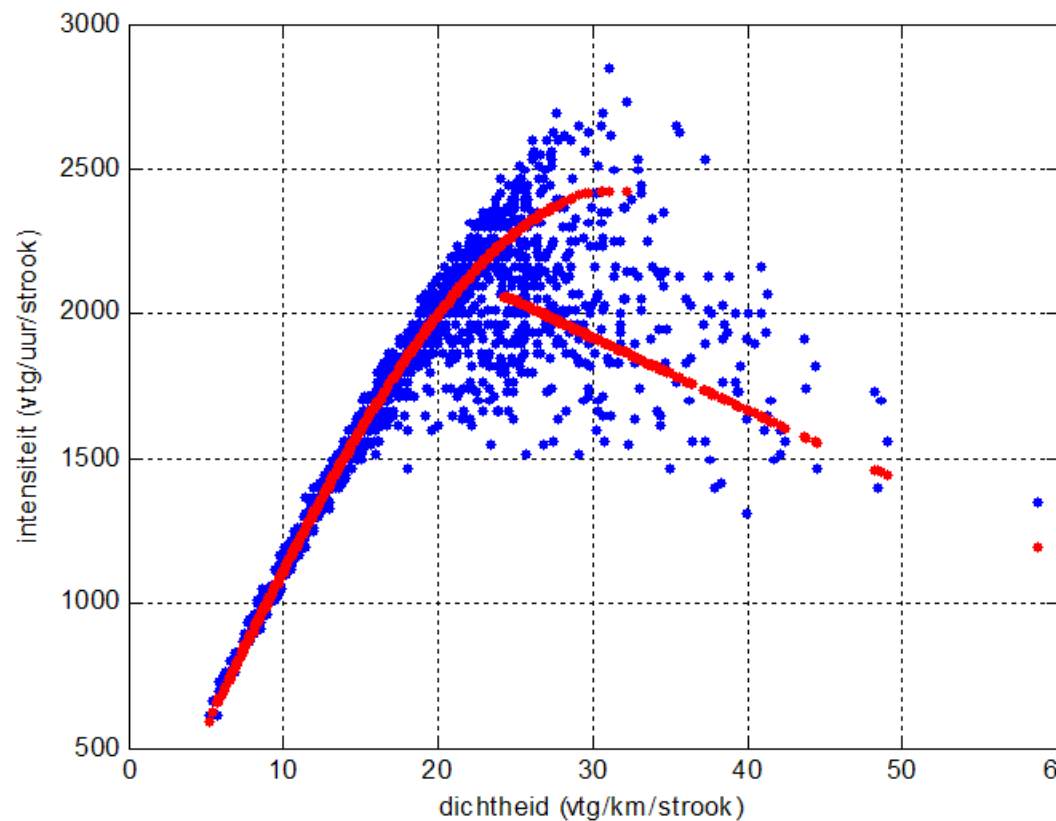
# Comparison Wu's diagram and real data



# Comparison Wu's diagram and real data



# Comparison Wu's diagram and real data



# Theory of Kerner

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- Kerner: there is no fundamental diagram
- Three fases:
  - Free flow
  - Jam: (near) standstill
  - Synchronized flow
- In the  $q$ - $k$  plane, the synchronized flow region is characterized by an 2-D area and **not by a straight line**

# Fundamental 'diagram' of Kerner

