

Second Order Models of Traffic Flow: a Fluid Description of Traffic

Michel Rascle ^a

^aNice, <http://www.math.unice.fr/~rascle/>

Collaborations with

- Aw, SIAP 2000: initial model, Riemann Pb
- Aw-Klar-Materne, SIAP 2002: Lagrangian view, rigorous derivation from microscopic models
- Greenberg-Klar, SIAP 2003: oscillations in model with ad-hoc relaxation
- Bagnerini, SIMA 2003: homogenized model, existence and uniqueness
- Berthelin-Degond-Delitala, To appear ARMA: formal asymptotic limit = sticky (incompressible) clusters

- Herty, SIMA 2006: Riemann Pb for junctions, imposed proportions between incoming roads
- Herty-Moutari, NHM 2006: Same pb, maximization of flux (priority to more aggressive drivers)
- Moutari, submitted: new hybrid scheme, with Lagrangian interfaces (regularly refreshed)
- Mauser-Moutari-Siebel, submitted: relaxed model with sometimes negative relaxation time
- Lebacque, Leclercq-Lesort (INRETS): comparisons with other Traffic Flow models, work in progress
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Outline

- Introduction
- The fluid model
- Main properties
 - Lagrangian version
 - Godunov scheme
 - BV estimates
 - Scaling
 - Link with Microscopic Models (FLM)
- Continuous description of Junctions
 - Demand, supply
 - Homogenization pbs on outgoing roads

Introduction

3 classes of models:

- Fully discrete: ODE system (FLM), see further
- Kinetic
- Fluid:

First Order: Lighthill-Whitham-Richards

$$\partial_t \rho + \partial_x(\rho v) = 0, \quad v = V(\rho), \quad V'(\rho) < 0$$

Second Order: Payne-Whitham (cf Gas Dynamics)

$$\begin{aligned} \partial_t \rho + \partial_x(\rho v) &= 0, \\ \partial_t v + v \partial_x v &= -\rho^{-1} p'(\rho) + \dots := -\tilde{p}'(\rho) + \dots \end{aligned}$$

The Fluid Model

- Daganzo (Requiem, 95) PW is a terrible model!!
Paradoxes: 1: $v < 0$ and 2: $\lambda_2 = v + c > v$!!
- Aw-Rascle (Resurrection, 2000), Zhang(2002).
Fixing: $\partial_x p \rightarrow \partial_t p + v \partial_x p$ with e.g. (new) $p := \tilde{p}$

$$\partial_t \rho + \partial_x(\rho v) = 0,$$

$$\partial_t w + v \partial_x w = 0,$$

with e.g. $w := v + p(\rho) =$ **Lagrangian marker**

- "Second order" (fluid) model : mass conservation equation, coupled with a **Lagrangian marker** (w), **with or without influence** on the propagation
- In contrast, possible additional Lagrangian markers **may be** passively advected
- Model by far too sophisticated for real applications ! But ...
- Very general : contains 1st order models, affectation ... and it forces to clarify : Lagrangian vs Eulerian, discrete vs continuous, why homogenization ?... intellectually quite stimulating ! may be useful ...

The Eulerian System



$$\begin{cases} \partial_t \rho + \partial_x(\rho v) = 0, \\ \partial_t(\rho w) + \partial_x(\rho w v) = 0 \end{cases} \quad (1)$$

- in non conservative form, $\partial_t w + v \partial_x w = 0$:
 $w := v + p(\rho)$ is constant along trajectories
- here $\rho \mapsto p(\rho)$ is a known function (distance to equilibrium) s.t. $p'(\rho) > 0$ and λ_1 is GNL, i.e.

$$\forall \rho, \rho p''(\rho) + 2p'(\rho) \neq 0 (> 0 \text{ here})$$

Lagrangian System

- Strictly hyperbolic system, (except for $\rho = 0 \dots$)
- Eigenvalues of 2x2 matrix :

$$\lambda_1(U) = v - \rho p'(\rho) \text{ and } \lambda_2(U) = v$$

- λ_1 : genuinely nonlinear: shock (braking) or rarefaction (acceleration), whose curves **coincide** here, since $[\rho w(v - \sigma)] = ((\rho(v - \sigma)_{\pm}) \cdot [w]$
- λ_2 is linearly degenerate : 2-contact discontinuity.
- Diagonalization: Riemann invariants (on road i) :

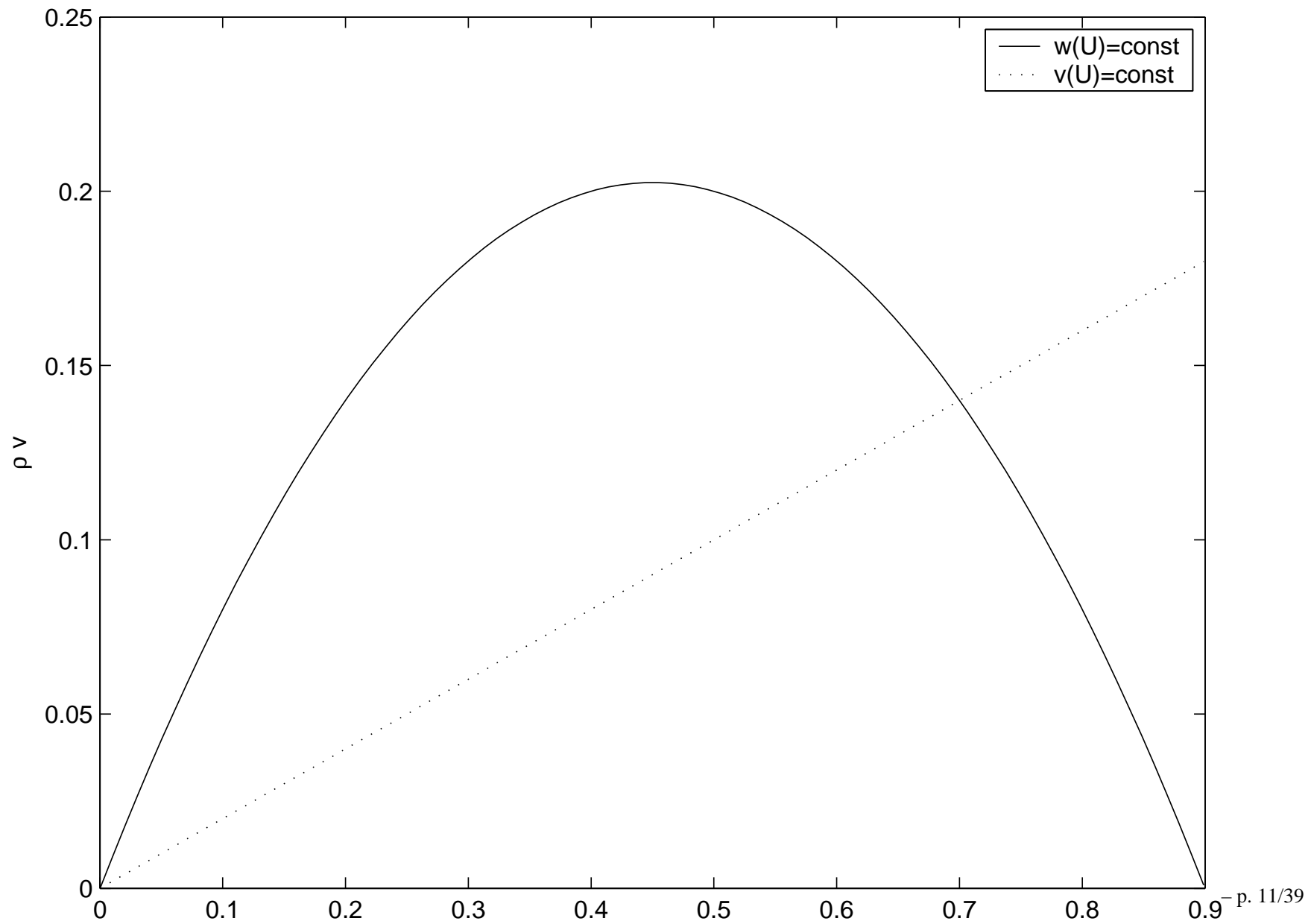
$$w(U) := w_i(U) = v + p_i(\rho) \text{ and } v(U) = v$$

$$\partial_t w + v \partial_x w = 0, \quad \partial_t v + \lambda_{1,i}(U) \partial_x v \approx 0$$

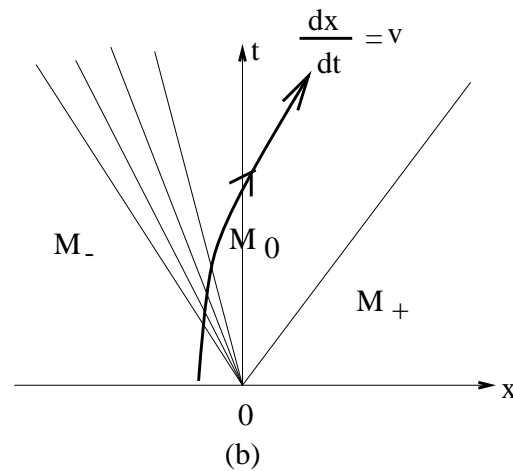
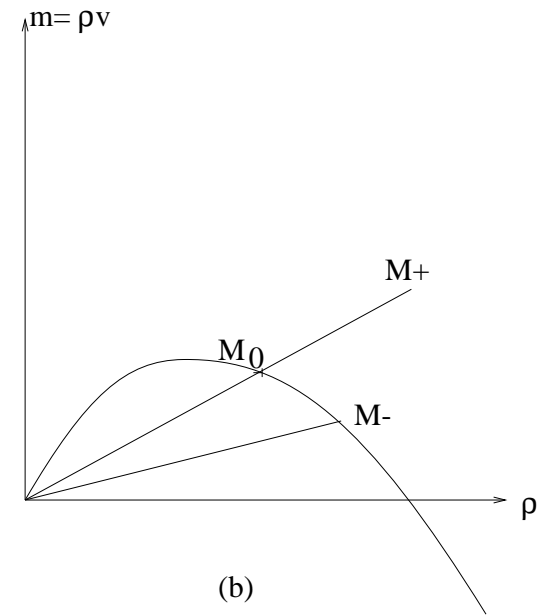
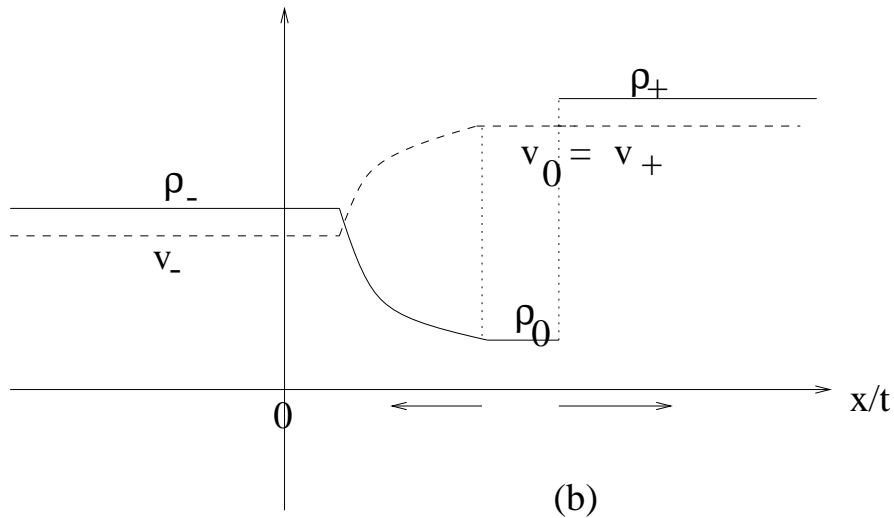
Riemann Problem with initial data U^- and U^+

- 1– waves between U^- and U :
 - Rarefaction: $w(U) := v + p(\rho) = w(U^-)$, if $v > v^-$
 - or shock: $w(U) := v + p(\rho) = w(U^-)$, if $v > v^-$ (**coinciding**)
- 2– waves between U and U^+ : contact discontinuity: $v = v^+$

Solution of Riemann Pb: connect U^- with $U := U^0 := (w^-, v^+)$ through a 1–wave, then connect U^0 with U^+ through a 2–wave, see Figure



Riemann Pb on single road



Back to a junction

Estimates for the Riemann Pb

Corresponding estimates, see Figure in (w, v) plane:

- L^∞ estimates: bounded invariant (convex) regions

$$\{0 \leq v_{\min} \leq v \leq v_{\max}\} \cap \{w_{\min} \leq w \leq w_{\max}\}$$

and $0 \leq v, p(\rho) \leq w \leq w_{\max}$: Paradox 1 is suppressed

- BV estimates: Set $d(U_1, U_2) := |v_2 - v_1| + |w_2 - w_1|$. Then,

$$d(U^-, U^+) \leq d(U^-, U^0) + d(U^0, U^+),$$

(equality iff $U_- \rightarrow U_0 \rightarrow U_+$ in Riemann Pb),

due to coinciding shock and rarefaction curves. -p. 13/39

Motivation I: x or t dependence

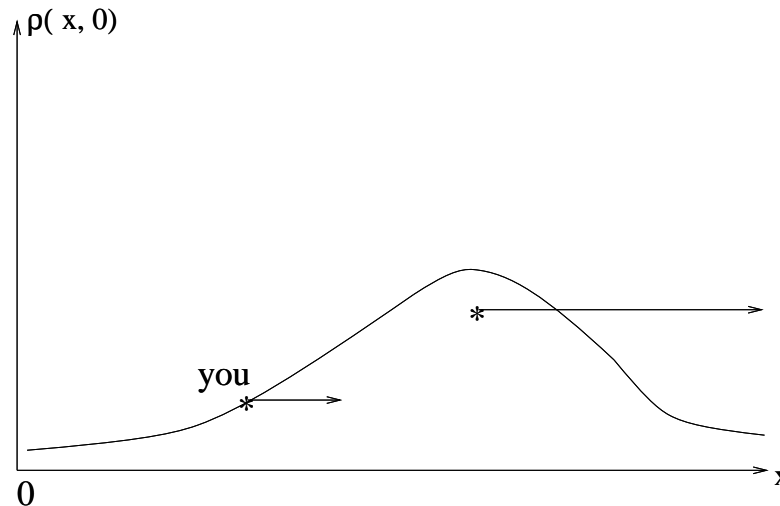
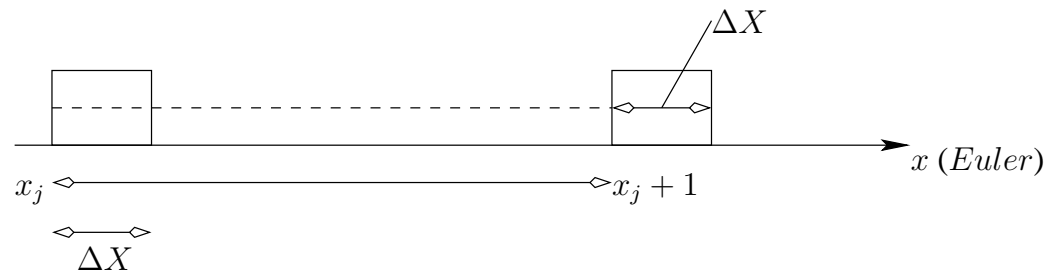


Figure 1: Do we react to flow variations in x or t : if the "wave" is faster than you, should you brake (cf gas dynamics), or accelerate (cf our model)?? Compare:

$$\partial_t v + v \partial_x v = -\rho^{-1} \partial_x p(\rho) \text{ or } = -(\partial_t + v \partial_x)(\tilde{p}(\rho))$$

Motivation II: Lagrangian view

- Lagrangian mass coordinates



- $$X(x, t) = \int_{-\infty}^x \rho(y, t) dy;$$

- $$\rho_j = \frac{\Delta X}{x_{j+1} - x_j} \quad \text{adimensional;}$$

- $$\tau_j := \frac{1}{\rho_j} = \frac{x_{j+1} - x_j}{\Delta X} \quad \text{adimensional;}$$

Follow The Leader Model

$$\begin{cases} \dot{x}_j = v_j \implies \dot{\tau}_j = \frac{v_{j+1} - v_j}{\Delta X} \\ \dot{v}_j = -P' \left(\frac{x_{j+1} - x_j}{\Delta X} \right) \frac{v_{j+1} - v_j}{\Delta X} = -P'(\tau_j) \dot{\tau}_j \end{cases} \quad (2)$$

\Updownarrow

$$\begin{cases} \dot{\tau}_j = \frac{v_{j+1} - v_j}{\Delta X} \\ \dot{w}_j = 0 \end{cases} \quad (3)$$

Compare with Godunov

Hyperbolic Scaling

$$(x, t) \rightarrow (\epsilon x, \epsilon t)$$

$$(X, t) \rightarrow (\epsilon X, \epsilon t)$$

$$\epsilon \rightarrow 0 \quad \text{Zoom} \Rightarrow \quad \Delta X \rightarrow 0$$

$$\partial_{t|L} = \partial_{t|E} + v \partial_x$$

ρ, τ, v : scale invariant

The Lagrangian System

To Eulerian System

- (3) formally CV to: (4)

$$\begin{cases} \partial_t \tau - \partial_x v = 0, & \tau := \rho^{-1}, \\ \partial_t w = 0, & w = v + P(\tau) := v + p(\rho) \end{cases} \quad (4)$$

- Rigorous derivation: Aw-Klar-Materne-Rascle (2002): Godunov for (4) \equiv Euler for (2) ...
- Independent, formal M. Zhang (2002)
- First \exists result (no scaling): J. Greenberg (2001), + Relax, (sub)"characteristic" case; Aw, PhD
- Lagrangian system (4) \Leftrightarrow Eulerian system (1) (cf Wagner, 87)

Details on (4)

Details on Lagrangian system

- Example $P(\tau) = p(\rho) = \rho = \tau^{-1}$
- Eigenvalues become: $\lambda_1 = P'(\tau) < 0$ (GNL), and $\lambda_2 = 0$ (LD)
- **Same solution of Riemann Pb:** connect U^- with $U := U^0 := (w^-, v^+)$ through a 1-wave, then connect U^0 with U^+ through a 2-wave, see Figure
- For all entropy-flux pairs (η, q) , $q \equiv q(v)$, and η convex in τ iff q is concave in v

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Lagrangian Godunov Scheme

- \equiv Eulerian Godunov scheme with moving cells (away from vacuum)
- $\Rightarrow w \equiv w(X)$, constant in each cell, remains BV
- Only one wave (of first family) in each cell $(X_{j-1/2}, X_{j+1/2}) \times (t_n, t_{n+1})$ hence v is monotonous in the solution to each Riemann Pb $\Rightarrow BV$ estimates for v are preserved
- Interfaces between cells are trajectories, and 2-contacts: in Riemann Pb at $(X_{j+1/2}, t_n)$,
$$v_{j+1/2}^n = v_{j+1}^n$$

Godunov scheme

Consequently, $w_j^{n+1} = \dots = w_j^0$ and

- in Eulerian moving coordinates,

$$x_{j+1/2}^{n+1} = x_{j+1/2}^n + \frac{\Delta t}{\Delta X} v_{j+1}^n$$

- \Rightarrow in Lagrangian coordinates

$$\tau_j^{n+1} = \frac{x_{j+1/2}^{n+1} - x_{j-1/2}^{n+1}}{\Delta X} = \tau_j^n + \Delta t \frac{v_{j+1}^n - v_j^n}{\Delta X},$$

- Godunov scheme is **exactly** the explicit Euler scheme for (FLM). See (3)

Moreover, (BV estimates), commutation of limits:

Godunov CV to Lagrangian system (4) when ...

Now Godunov first CV (when ...) to (3), which then CV to (4) when ... Same limit by uniqueness

On a network

- Conservative form on each road:

$$\partial_t \begin{pmatrix} \rho_i \\ y_i \end{pmatrix} + \partial_x \begin{pmatrix} y_i - \rho_i p_i(\rho_i) \\ (y_i - \rho_i p_i(\rho_i)) y_i / \rho_i \end{pmatrix} = 0,$$

and $y_i = \rho_i w_i = \rho(v_i + p_i(\rho_i))$.

- Rankine-Hugoniot conditions through a junction

$$\sum_{i \in \delta^-} (\rho_i v_i)(b_i^-, t) = \sum_{j \in \delta^+} (\rho_j v_j)(a_j^+, t)$$

$$\sum_{i \in \delta^-} (\rho_i v_i w_i)(b_i^-, t) = \sum_{j \in \delta^+} (\rho_j v_j w_j)(a_j^+, t)$$

Weak (entropy) solution on a network must :

- be a weak (entropy) solution on each road i
- conserve total mass and (pseudo)- “momentum”, at junctions $b_i = a_j$ (\Leftrightarrow Rankine-Hugoniot)
- $\forall i \in \delta^-$: incoming, $j \in \delta^+$: outgoing road, **unknown** limit values U_i^+ at $b_i - 0$ and U_j^- at $a_j + 0$ (Attention !!), to be determined below.
- For **Riemann Pb**, **centered** waves have charact speed < 0 on ingoing, > 0 on outgoing.
RP, single road

Incoming 1/2-Riemann Problem

- We want to connect the left Riemann data $U_i^- = (\rho_i^-, v_i^-)$ through a **1-wave** of **negative speed** to a state

$$U_i^+ = \{w_i(U) := v_i + p_i(\rho) = w_i(U_i^-)\} \cap \{\rho v = q\}$$

- The **actual flux** q and U_i^+ are still unknown
- Definition (Daganzo, Lebacque): Demand of $U_i^- :=$ maximal possible such flux q .
- Recall: **Actual** $U_i^+ = U_i(b_i - 0, t)$ (**in**) and $U_j^- = U_j(a_j + 0, t)$ (**out**) must satisfy (RH)

Demand

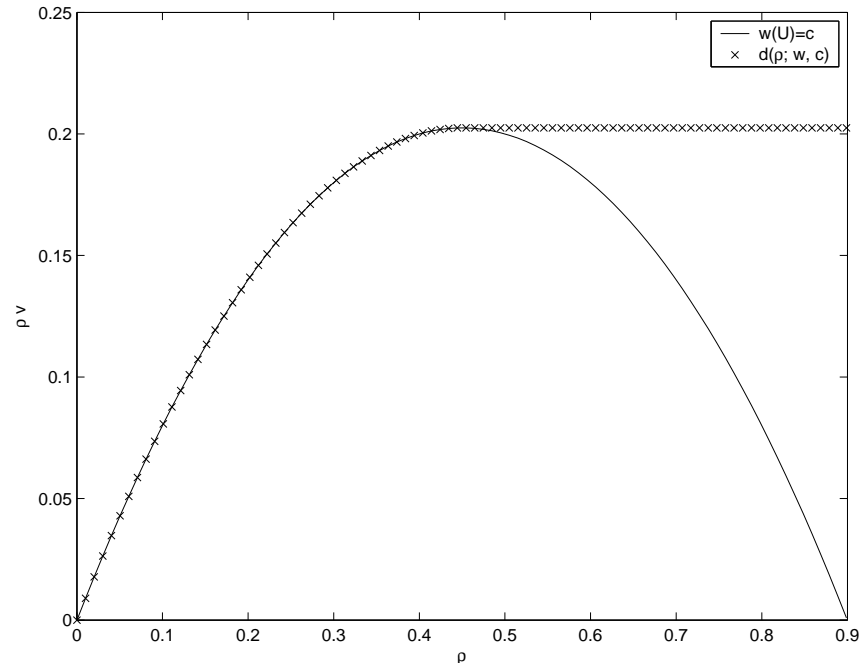


Figure 2: Demand function for $w(U) = v + p(\rho) = C$

Demand: e.g. in uncongested regime, i.e. if $\rho_i^- < \tilde{\rho}$ (the sonic point), then the **maximal flux** at a point U on curve $w(U) = w(U_i^-)$ which can be connected with U_i^- by a wave of speed ≤ 0 is reached for $U = U_i^-$ itself. Conversely, if $\rho_i^- > \tilde{\rho} \dots$

Outgoing Half Riemann Pb

- First connect right Riemann data $U_j^+ = (\rho_j^+, v_j^+)$ through a **2-contact discontinuity (of speed $v_j^+ > 0$)** to a **first** intermediate state U_j^* , still unknown

- Here, U_j^* comes from road i , but is on road j .
Therefore $w_j(U_j^*) := w_j^* := w_i(U_i^-)$!!. So

$$U_j^* = \{w_j(U) := v + p_j(\rho) = w_j^*\} \cap \{v = v_j^+\}$$

- Now, define supply associated with **state U_j^* and the above curve**, as for the demand:

- we want to connect U_j^* (on the right), through a **1-wave of positive speed** to a state

$$U_j^- = \{w_j(U) = w_j^*\} \cap \{\rho_j v = q\},$$

- Definition: Supply of U_j^* := maximal possible such flux q
- **Full solution of Riemann Pb:** Set $q := \min(d_i(U_i^-), s_j(U_j^*))$
- That defines two (in fact, one (a.e.)) possible state on each road, e.g. $U_i^+ := U_i^-$ if $q = q_i^-$
- The corresponding solution is uniquely defined:

$$U_i^- \dots U_i^+ || U_j^- \dots U_j^* \dots U_j^+$$

Supply

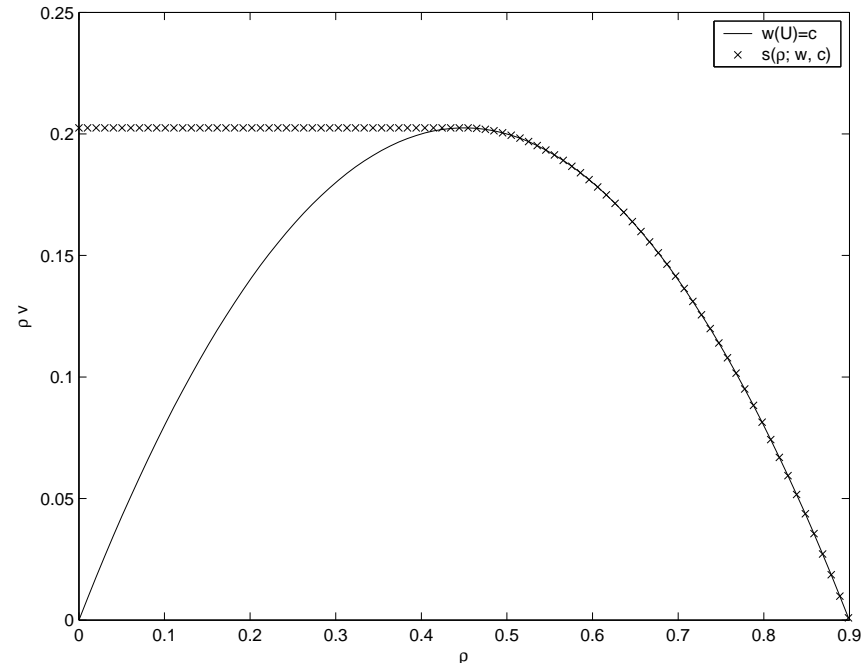
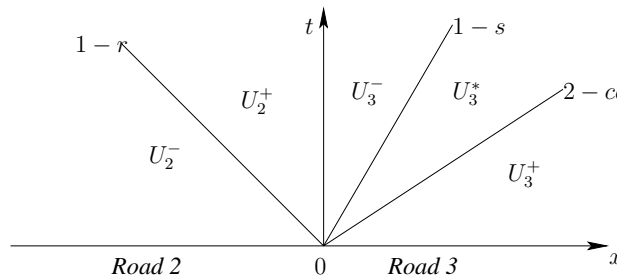
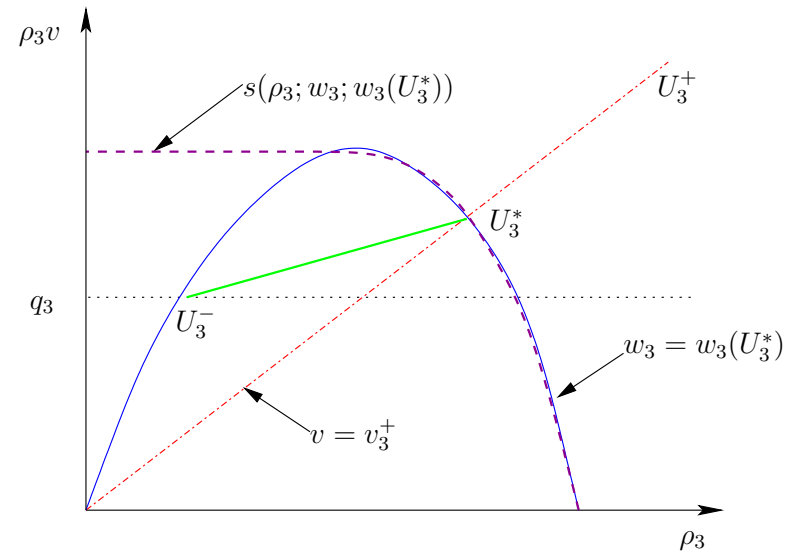
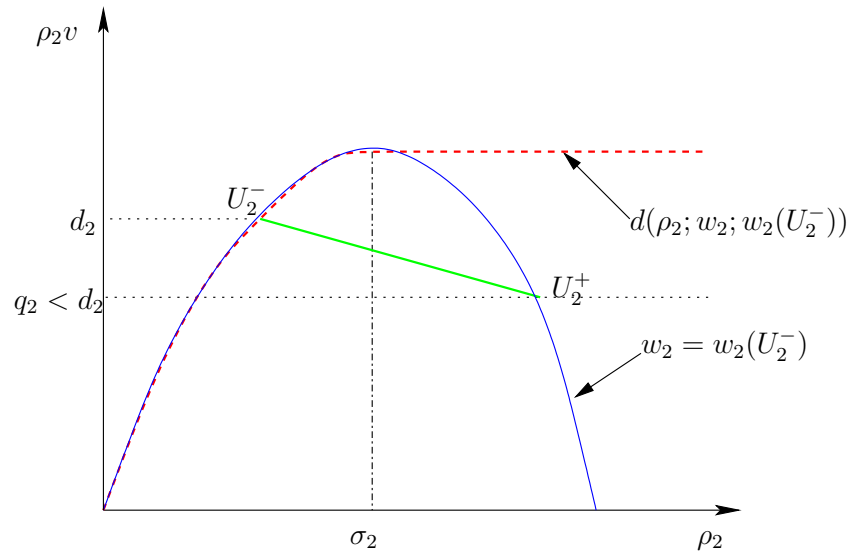


Figure 3: Supply function for $w(U) = v + p(\rho) = C$ e.g. in uncongested regime, i.e. if $\rho_j^* < \tilde{\rho}$ (the sonic point), then the **maximal flux** at a point U on curve $w(U) = w(U_j^*)$ which can be connected with U_j^* by a wave of nonnegative speed is reached for $U = \tilde{U}$.

Homogenized Supply

1-1 Junction: Example

Ex of solution on (incoming) road 2 : $p = p_2, w = w_2^-$
 or on (outgoing) road 3 : $p = p_3, w = v + p_3(\rho) = w_2^-$
!!



1/2 Riemann Pb

Toward Homogenization

- Example : two incoming roads 1 and 2, with resp. black and white cars, with equal priority, and one outgoing road 3
- Then cars mix up on road 3, with average grey color

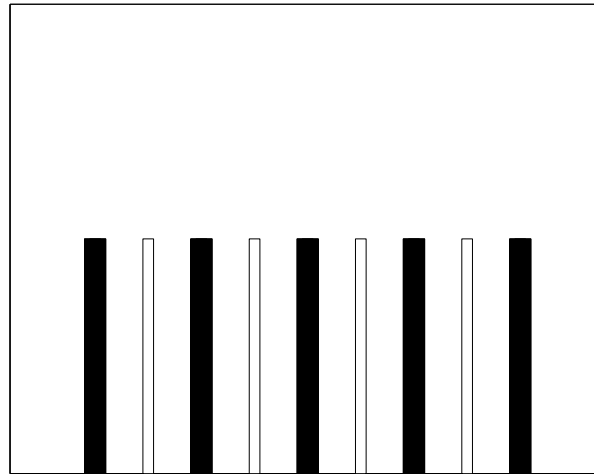


Figure 4: On an outgoing road ...

Figure

Back to Homogenization ...

(with P. Bagnerini)

$$\partial_t \tau^\varepsilon - \partial_X v^\varepsilon = 0$$

$$\partial_t w^\varepsilon = 0$$

$$w^\varepsilon = v^\varepsilon + P(\tau^\varepsilon),$$

with initial data (or incoming boundary conditions, at a junction) oscillating in w

$$v_0^\varepsilon \rightarrow v_0^* ; w_0^\varepsilon \rightarrow w_0^* := w^*$$

Corresponding solution : v^* = strong limit of v^ε : no oscillation, v^* is a BV-function, master unknown function ...

- But oscillations are preserved for $w^\varepsilon \equiv w_0^\varepsilon$ and for any function $F(v^\varepsilon, w^\varepsilon)$
- For any F , weak limit (= “average”) is described by **Young measure** :

$$\langle \nu_{X,t}, F(v, w) \rangle := \int F(v, w) d\nu_{X,t}(v, w)$$
- Since v^ε strongly converges, and since w is time-independent, the above integral equals

$$\langle \mu_X, F(v^*(X, t), w) \rangle := \int F(v^*(X, t), w) d\mu_X(w)$$
- ν and μ : probability measures, resp. in v, w and in w

2-1 Junction

- The homogenized w is: $w^* := \langle \mu_X, w \rangle$
- Since $P(\tau) := p(\tau^{-1})$ is strictly monotonous, $\tau = P^{-1}(w(X) - v)$. Therefore the **homogenized τ** , i.e.

$$\begin{cases} \tau^*(X, t) = \langle \mu_X, P^{-1}(w - v^*(X, t)) \rangle, \\ \tau^* := T(X, v^*(X, t)) \end{cases} \quad (5)$$

satisfies:

$$\partial_t T(X, v^*(X, t)) - \partial_X v^* = 0 \dots \quad (6)$$

- ... In (6), τ^* is naturally a function of v^* and X . We could invert again the roles and write

$$\partial_t \tau^* - \partial_X F(X, \tau^*) = 0, \quad (7)$$

scalar conservation law whose flux is discontinuous in X

- Integration in X of (7) \rightarrow Hamilton-Jacobi equation. See Lions-Papanicolaou-Varadhan for homogenization in periodic case.

Details on Homog System

- Here, by monotonicity, we deal directly with (6), and use **informations on Lagrangian system (4)**
 - any (convex) entropy $\eta \leftrightarrow$ (concave) flux $q(v)$
 - Def: v^* is an entropy solution to (5) if $\forall k$,

$$\partial_t |T(X, v^*(X, t)) - T(X, k)| - \partial_X |v^*(X, t) - k| \leq 0,$$

which is equivalent (!!) to

$$\partial_t < \mu_X, |P^{-1}(w - v^*(X, t)) - P^{-1}(w - k)| > - \partial_X |v^*(X, t) - k| \leq 0!!$$

- Theorem: \exists a unique entropy solution to (5)

Example: 2-1 Junction

- Here, incoming roads 1 and 2 merge on outgoing road 3, with % α and $1 - \alpha$.
- Typically, if e.g. $\alpha = 1/2$, then $\forall F(v, w)$,
 $\langle \mu_X, F(v, w) \rangle = \frac{1}{2} (F(v, w_1^-) + F(v, w_2^-))$
- Again, since $P_3(\tau) := p_3(\tau^{-1})$ is monotonous, the **homogenized τ** is (for $\alpha = 1/2$):

$$\begin{aligned} \tau^*(X, t) &= \langle \mu_X, P_3^{-1}(w - v^*(X, t)) \rangle \\ &:= \frac{1}{2} (P_3^{-1}(w_1 - v^*(X, t)) + P_3^{-1}(w_2 - v^*(X, t))) \end{aligned}$$

- For any given v , the 1 and 2-drivers share the spacing, see Figure.

Homog.

Therefore, on outgoing road 3

- On outgoing road 3, (for $\alpha = 1/2$), set $w^\dagger := w^* = (w_1 + w_2)/2$, rewrite homogenized τ as

$$\begin{aligned}\tau^* &:= \frac{1}{2}(P^{-1}(w_1 - v^*(X, t)) + P^{-1}(w_2 - v^*(X, t))) \\ &= T(X, v^*(X, t)) \text{ , here, } P = P_3\end{aligned}$$

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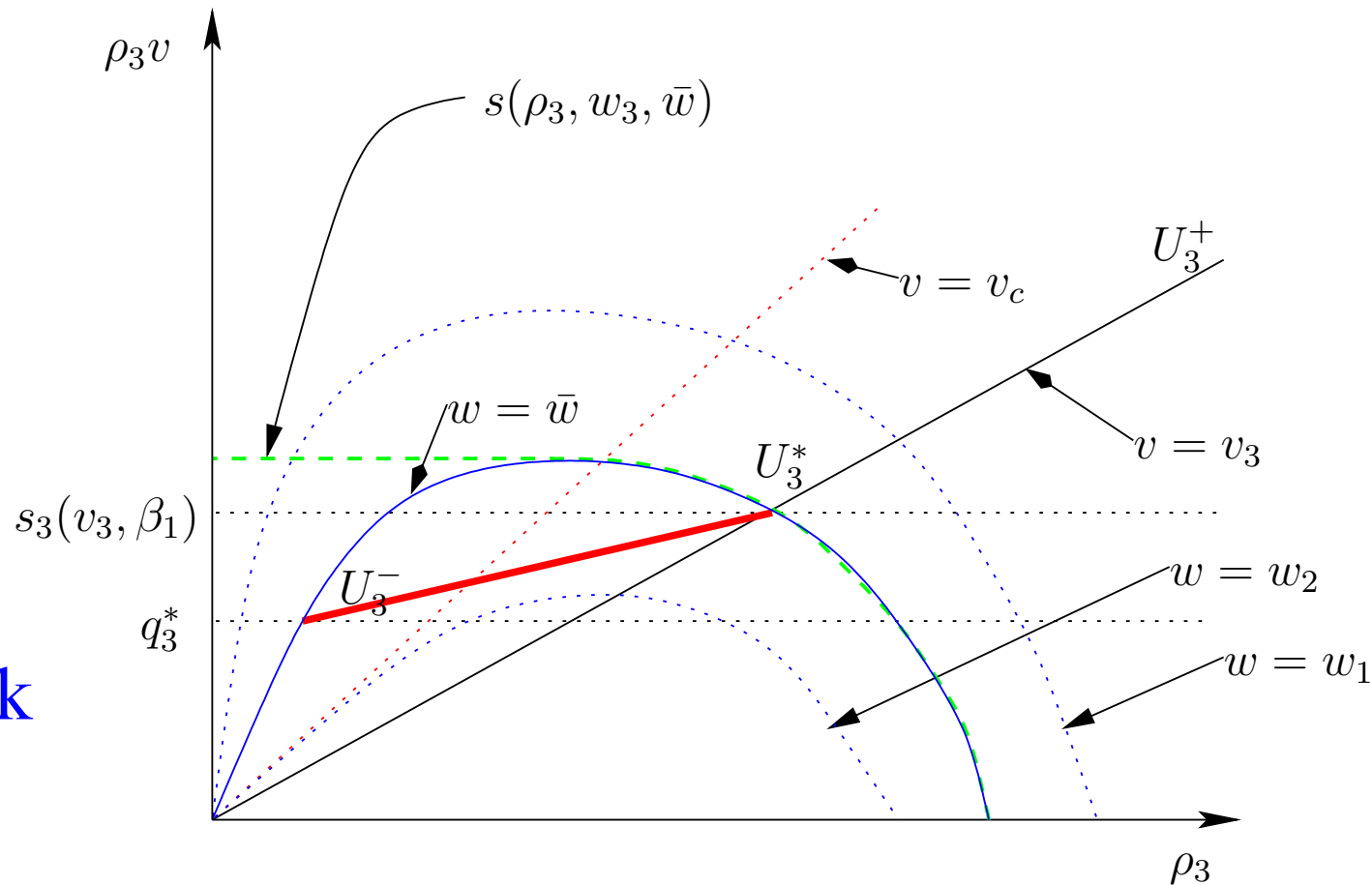
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- That defines a unique homogenized $\tau := \tau^*$ as a function of $v := v^*$, hence a curve in $(\rho, \rho v)$ plane
- define the corresponding supply, see Figure below.

Supply

Homogenized supply

The supply on road 3 corresponds to this curve and to the unique point U_3^* on this curve with velocity v_3^+ , with $p = p_3^*$, $w = w^*$



Back

Conclusion

- If several incoming roads and **if** influence of w on the propagation, then homogenization is needed
- Other ingredients are unchanged, e.g. here, in a 2 – 1 junction with equal fluxes, compare d_1, d_2 (incoming) to (homogenized) outgoing $\frac{1}{2} s_3$
- Similar arguments in general case with **imposed** ratios between incoming fluxes,
- **But** maximization of flux **must** be restricted to states which also conserve each color !!
- Calculations not **that** complicated, like for two resistances in parallel, and can be strongly simplified (work in progress) ...