# Uniqueness of equilibrium

Frédéric Meunier

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Frédéric Meunier and Thomas Pradeau, The uniqueness property for networks with several origin-destination pairs, *European Journal of Operational Research*, 2014.

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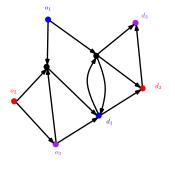
# Model

D = (V, A) a directed graph.

 $\mathcal{L} \subseteq V^2$  a set of origin-destination pairs.

 $b^{od}$  = number of users going from o to d (the demand).

On each arc  $a \in A$ , there is a continuous cost  $c_a(\cdot) : \mathbb{R}_+ \to \mathbb{R}_+$ .



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 $x_a$  = number of users choosing arc a.

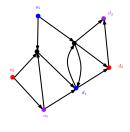
$$\sum_{a\in P} c_a(x_a) = \text{cost} \text{ of a path } P.$$

# Equilibrium

 $x_a^{od}$  = number of users choosing arc *a* among those going from *o* to *d*.

 $(x_a^{od})_{a \in A, (o,d) \in \mathcal{L}}$  is an equilibrium if

$$\begin{aligned} (x_a^{od})_{a\in A} &= o \text{-}d \text{ flow of value } b^{od} \quad (o,d) \in \mathcal{L} \\ x_a &= \sum_{(o,d)\in\mathcal{L}} x_a^{od} \qquad a \in A \\ \sum_{a\in P} c_a(x_a) &\leq \sum_{a\in Q} c_a(x_a) \qquad P, Q \in \mathcal{P}^{od}, P \text{ is used, } (o,d) \in \mathcal{L} \end{aligned}$$



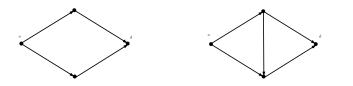
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 $\mathcal{P}^{od} = \text{set of } o\text{-}d \text{ paths}$ 

P used if  $x_a^{od} > 0$  for all  $a \in P$ .

## Practical interest

- This model = good approximation of what happens in practice
  - \* used in transport engineering, telecoms,...
- Useful since the phenomenons are nonintuitive
  - Braess paradox = opening a new road may increase all travel times
  - \* paradox recovered by the model



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#### Existence and uniqueness of the equilibrium

#### Theorem (Beckman, 1956)

An equilibrium always exists and it is unique when the cost functions  $c_a(\cdot)$  are increasing.

"Unique" means there are unique  $x_a$ 's solutions of the system

$$\begin{array}{ll} (x_a^{od})_{a\in A} = o \cdot d \text{ flow of value } b^{od} & (o,d) \in \mathcal{L} \\ x_a = \sum_{(o,d)\in\mathcal{L}} x_a^{od} & a \in A \\ \sum_{a\in P} c_a(x_a) \leq \sum_{a\in Q} c_a(x_a) & P, Q \in \mathcal{P}^{od}, \\ P \text{ is used}, \\ (o,d)\in\mathcal{L} \end{array}$$

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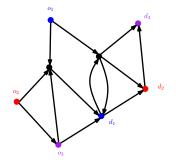
#### Model – multiclass case

D = (V, A) a directed graph.

 $\mathcal{L} \subseteq V^2$  a set of origin-destination pairs.

 $b^{od,k}$  = number of class *k* users going from *o* to *d* (the demand).

On each arc  $a \in A$  and for each class k, there is a continuous cost  $c_a^k(\cdot) : \mathbb{R}_+ \to \mathbb{R}_+.$ 



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 $x_a$  = number of users choosing arc a.

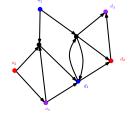
 $\sum_{a \in P} c_a^k(x_a) = \text{cost of path } P \text{ experienced by class } k.$ 

# Equilibrium

 $x_a^{od,k}$  = number of class *k* users choosing arc *a* among those going from *o* to *d*.

 $(x_a^{od,k})_{a \in A, (o,d) \in \mathcal{L}, k \in K}$  is an equilibrium if

$$(x_a^{od,k})_{a \in A} = o \cdot d \text{ flow of value } b^{od,k} \quad (o,d) \in \mathcal{L}, \ k \in K$$
$$x_a = \sum_{(o,d) \in \mathcal{L}, \ k \in K} x_a^{od,k} \qquad a \in A$$
$$\sum_{a \in P} c_a^k(x_a) \le \sum_{a \in Q} c_a^k(x_a) \qquad \qquad P, Q \in \mathcal{P}^{od}, \ P \text{ is used, } (o,d) \in \mathcal{L}, \\ k \in K$$



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 $\mathcal{P}^{od} = \text{set of } o-d \text{ paths}$ 

*P* used if 
$$x_a^{od,k} > 0$$
 for all  $a \in P$ .

# The uniqueness issue

#### Theorem (Schmeidler, 1973)

An equilibrium always exists in the multiclass setting.

There are examples with several equilibria, i.e. several possible  $x_a$ 's, while all  $c_a^k(\cdot)$  are increasing: uniqueness is not automatically ensured. (It contrasts with the monoclass case).

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Challenge: Find necessary and/or sufficient conditions ensuring uniqueness.

# Uniqueness property

G = undirected graph,  $\mathcal{L}$  = collection of *o*-*d* pairs.

 $(G, \mathcal{L})$  has the uniqueness property (UP) if for any classes, demands  $(b^{od,k})$ , and increasing costs  $(c_a^k(\cdot))$ , the equilibrium is unique.

(on the digraph where each edge has been replaced by two opposite arcs)

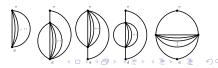
#### Theorem (Milchtaich, 2007)

There is only one o-d pair:

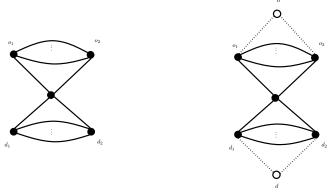
 $(G, \{(o, d)\})$  has the UP  $\iff$  G is "nearly-parallel".

"Nearly-parallel" =

combination in series of



# Uniqueness for general graphs using Milchtaich's theorem



- Add a fictitious origin vertex connected to every origin.
- Add a fictitious destination vertex connected to every destination.

Augmented graph has uniqueness property  $\Rightarrow$  Original graph has uniqueness property.

# Uniqueness for general graphs using Milchtaich's theorem



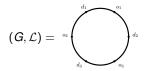
- Add a fictitious origin vertex connected to every origin.
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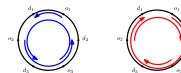
Augmented graph has not the uniqueness property  $\Rightarrow$  ????

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## Uniqueness property on a cycle

 $d_2$ 



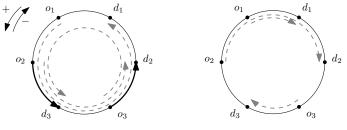


#### Theorem

Assume that G is a cycle and let  $\mathcal{L}$  be any collection of o-d pairs.

 $(G, \mathcal{L})$  has the UP  $\iff$  Each arc belongs to at most two o-d paths.

#### Example not having the uniqueness property



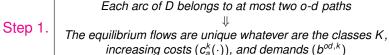
The positive paths.

The negative paths.

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The arcs  $o_2 d_3$  and  $o_3 d_2$  are contained in three *o*-*d* paths.

# **Proof strategy**



# Step 2.There is an arc of D belonging to at least three o-d paths $\Downarrow$ $\Downarrow$ There exist classes K, increasing costs $(c_a^k(\cdot))$ , and demands<br/> $(b^{od,k})$ leading to two equilibria with distinct flows

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Proof by an explicit construction of costs and demands.

# Step 1:

Each arc of D belongs to at most two o-d paths

The equilibrium flows are unique whatever are the classes, costs, and demands

- Let **x** and  $\hat{\mathbf{x}}$  be two equilibria. Define  $\Delta_{od} = x_{P^+}^{od} \hat{x}_{P^+}^{od}$ .
- Suppose  $\Delta_{o_0 d_0} \neq 0$  for some  $o_0 \cdot d_0$ . There exists an  $o_1 \cdot d_1$ s.t.  $\Delta_{o_0 d_0} \Delta_{o_1 d_1} < 0$  and  $\Delta_{o_0 d_0} + \Delta_{o_1 d_1} < 0$ .
- We repeat this argument and get an infinite sequence  $|\Delta_{o_0 d_0}| < |\Delta_{o_1 d_1}| < \cdots < |\Delta_{o_j d_j}| < \cdots$ .

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• Contradiction with finiteness.

# Step 2:

There is an arc of D belonging to at least three o-d paths  $\psi$ There exist classes K, increasing costs  $(c_a^k(\cdot))$ , and demands  $(b^{od,k})$  leading to two equilibria with distinct flows

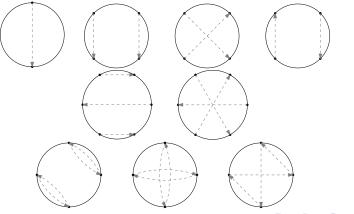
An arc in 3 *o*-*d* paths: explicitly building of cost functions and demands leading to two equilibria with distinct flows.

Some features:

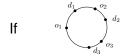
- Three classes.
- Affine cost functions.
- Explicit construction of two equilibria.
- These equilibria are strict and "single-path".

### Structural characterization

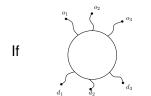
Each arc in at most two *o*-*d* paths  $\Leftrightarrow$  (*G*,  $\mathcal{L}$ ) homeomorphic to a minor of one of



#### Corollary for general graphs: examples



is in  $(G, \mathcal{L})$ , G does not have the UP.



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## Having a minor without the uniqueness property

A subgraph of  $(G, \mathcal{L})$  does not have the UP  $\Longrightarrow$   $(G, \mathcal{L})$  does not have the UP.

A minor of  $(G, \mathcal{L})$  does not have the UP:

- If the contractions involve only bridges, *G* does not have the UP.
- If the counterexamples are obtained via "single-path" flows, *G* does not have the UP.

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• And in general, open question.

#### Strong uniqueness property

*G* has the strong uniqueness property (SUP)

 $(G, \mathcal{L})$  has the UP for any collection of *o*-*d* pairs  $\mathcal{L}$ 

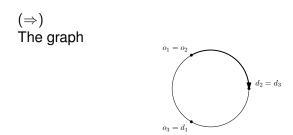
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#### Theorem

G has the SUP  $\iff$  No cycles of length 3 or more.

Graph having the SUP are thus graphs obtained from a forest by replicating some edges.

#### Proof



has one arc in three o-d paths: no UP.

 $(\Leftarrow)$  results from two easy statements:

• A graph with two vertices and parallel edges has the SUP.

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· Glueing two graphs on a vertex maintains the SUP.

### **Open questions**

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#### Generalization UP for general graphs?

#### Minor

What if a minor does not have UP?

#### Question

What if one-way edges are allowed?

## **Open questions**

#### Generalization UP for general graphs?

#### Minor

What if a minor does not have UP?

#### Question What if one-way edges are allowed?

Thank you

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