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## A BEHAVIORAL PRINCIPLE FOR TRAFFIC NETWORKS WITH DYNAMIC ASSIGNMENT

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# A BEHAVIORAL PRINCIPLE FOR **TRAFFIC NETWORKS WITH DYNAMIC ASSIGNMENT**

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### ABSTRACT

**L** behave according to the travel budget theory of Yacov Zahavi. It differs from an the Yacov Zahavi. It differs from an The latter is of critical importance in earlier detailed network formulation in that understanding and predicting network perfor-<br>the variation of travel behavior during the understandi esiner detailed hetwork formulation in that<br>the variation of travel behavior during the mance. The subtle issue is that static<br>course of a day is represented explicitly.

Yacov Zahavi observed (1979) that in average traveler spends between 1.0 and 1.5 the static network version of Zahavi's model.<br>hours every day in the transportation system Section 3 presents a new dynamic version of hours every day in the transportation system. Section 3 presents a new dynamic version of the new dynamic version of the work. Those who own cars spend about 11% of their income on travel, and those who do not spend about 4X. A wide variety of cities and coun- 2. Static **Assignment**

Based on these observations, he deve-<br>loped the UMOT (Unified Mechanism of statements can be found in the references. Travel) model for predicting travel behavior. Some definitions are repeated, suitably modi-He concluded that travelers have two **budgets:** fied, in the section on dynamic networks.<br>one for time and one for money. Travelers have a maximum amount of time and money that 2.1 Travel Budgets<br>they are willing to spend each day for transportation, and they attempt to obtain the Each traveler is assumed to have a time greatest possible benefits within those con-<br>straints.<br>straints.

vities to which people must travel. If they have more time and money in their budgets,<br>they are willing to travel further to work include residence location and other attri-(i.e., to choose a residence location butes that affect how much they travel; all

Zahavi used these ideas to develop a certain number of cars: they live in a cer-<br>theory of urban transportation behavior and tain neighborhood, and they have other simito help transportation planners. His origi- lar attributes, as defined by the modeler. nal model did not include a detailed network representation. This was provided by Ger-<br>shwin, Orlicki, and Zahavi (1981) and Ger- hudgets and  $\mathbb{R}^n$  he the population of class

shwin. Orlicki and Platzman (1984a. b). The this paper presents a model of a trans-<br>portation network in which travelers allow for the variation of traffic behavior<br>habove according to the travel budget during the course of a day.

> causes may have dynamic effects. For example, Stephenson and Teply (1981) have shown i. Introduction experimentally that reducing the capacity of a roadway can stretch out a rush hour period.

> > In Section 2 of this paper, we review<br>the static network version of Zahavi's model.

tries at very different times have displayed<br>this pattern.<br>next pattern.<br>The purpose of this section is to pre-<br>riant a very brief summary of the time-inva-<br>riant network analysis. Terms and concepts

assumed to vary randomly from person to person and for each person, from day to day. The benefits are in the form of work, However, travelers are grouped into socio-<br>shopping, school, recreation, and other acti- economic classes and there is a distribution economic classes and there is a distribution<br>function that characterizes each class.

further from work location), or go further travelers of the same class have a certain<br>from home to shop, and so forth. range of income, a certain range of travel<br>time budgets, a certain household size, a

budgets and  $D^a$  be the population of class

$$
U = \{(u,n) | u \ge t, n \ge m\}
$$
 (2.1) i to be

er the hemself of these oney budgets greater and all those up to journey k(a). That is<br>system with time and money budgets greater it is the set of travelers whose budgets fall<br>that t and m, respectively. That is, this is the number of class a travelers who can af- in set ford a daily journey with time and money<br>costs t and m.

A journey is a connected sequence of links and nodes in the traffic network. Because it represents a day's travel, it starts and ends at the same node.

money costs and also by <u>utility</u>. Uti- to show how travel that is the desirability of a jour- on journey flows. lity represents the desirability of a journey, and it is a measure of how many attrac-<br>tive potential destinations can be found along it. Journeys with many desirable workplaces, stores, theaters, scenic views, have greater utility than those with fewer. Utility is in the eye of the beholder; journeys with expensive stores are more attractive to the rich than to the poor, and *vice versa*. Then if  $f_{\ell}$  is the flow rate on link  $\ell$ ,

**Assume** that there are k(a) journeys available to class a, and that they are indexed in order of increasing utility. Our basic assumption is:

Travelers choose the journey with the **highest** utility whose costs fall within their travel time and money budgets.

Let  $X_{k(a)}^a$  be the number of travelers of class a that can afford, and and the travel costs on a journey are simply<br>thus travel on, journey k(a). Then the sums of the travel costs on the links

$$
X_{k(a)} = Da \int_{U_{k(a)}} fa(u,n) du dn
$$
 (2.3)

$$
U_{k(a)}^a = \{(u,n) \mid u \ge t_{k(a)}^a, n \ge m_{k(a)}^a\}.
$$
 (2.4)

Let  $X_i^2$  be the number of travelers 3. Dynamic Assignment of class a that can afford journey i or better. The number of travelers that can In this section we translate the time-

$$
x_1^2 - X_1^2 - X_{i+1}^2 \tag{2.5}
$$

a. Let Define the set of budgets that are<br>greater than or equal to the costs of journey<br>II = ((un) | u > t n > m) (2.1) it obe

Then 
$$
R_i^a = ((u,n) | u \ge t_i^a, n \ge m_i^a)
$$
. (2.6)

 $D^2$   $\int_H f^2(u,n)$  du dn (2.2) The set of people who can take journey i or better are those whose budgets exceed the is the number of class a travelers in the costs of journey i and those of journey i+1,<br>eustom with time and money budgets greater and all those up to journey k(a). That is,

costs t and m. Ul = **<sup>U</sup>**Ra (2.7) -i j....k(a)

2.3 Assignment Principle where the union is performed over all journeys j whose utility is greater than or equal<br>to that of i. Then

$$
X_i^a - D^a \int_{U_i^a} f^a(u,n) \ du \ dn.
$$
 (2.8)

Journeys are characterized by time and To complete the picture, it is necessary<br>y costs and also by utility. Uti- to show how travel costs  $(t_1^a$  and  $m_1^a$  depend

Let  $A^a$  be the link-journey incidence<br>matrix for class a. That is,

$$
A_{i\ell}^{a} = \begin{cases} 1 & \text{if link } \ell \text{ is in journey } i \\ 0 & \text{otherwise.} \end{cases}
$$
 (2.9)

$$
f_{\ell} = \sum_{a,j} A_{j\ell}^a x_j^a. \tag{2.10}
$$

The travel costs on each link are func-<br>tions of the flow on each link:

$$
\left\{ \begin{array}{l} \boldsymbol{\ell} = \tau_{\boldsymbol{\ell}}(\mathbf{f}_{\boldsymbol{\ell}}) \\ \boldsymbol{\ell} = \mu_{\boldsymbol{\ell}}(\mathbf{f}_{\boldsymbol{\ell}}), \end{array} \right\} \tag{2.11}
$$

the sums of the travel costs on the links that the journey traverses:

where 
$$
\begin{array}{rcl}\n\mathbf{u}_{k(a)} & \mathbf{u}_{k(a)} &
$$

This completes the statement of the<br>static assignment. The journey flows depend in which  $t_{k(a)}^a$  and  $m_{k(a)}^a$  are the costs of static assignment. The journey flows depend<br>to the lot and the the set of hudsets that on the journey costs in  $(2.3)-(2.8)$ ; and the journey k(a) and U<sub>k(a)</sub> is the set of budgets that on the journey costs in (2.3)–(2.8); and the journey costs depend on the journey flows in<br>are greater than the costs of the journey. (2.10)–(2.12).

afford journey i but cannot afford any better invariant assignment into one that can vary<br>journey is during the course of a day. To simplify during the course of a day. To simplify notation, and concepts, we only allow for a single class of travelers in the system. This means that all travelers have the same distributions of time and money to spend on traveling. It also means that they either live at the same location in the network or where  $\phi$  and  $\gamma$  are functions of the roadway<br>that they all may be allowed to change their<br>and the arrival rate of travelers at the origins *(i.e.*, their residences) equal- and the arrival<br>ly freely.

links L. A <u>location</u> is an element  $\lambda$  that the traveler reaches the link, but not of the set of the traffic conditions on the link.

$$
\mathcal{L} \equiv N \cup \{(\ell, z) \mid \ell \in L; 0 < z < d_{\ell}\}\tag{3.1}
$$

where  $d_{\ell}$  is the length of link  $\ell$ . journey p. These quantities are all position is either a node (n  $\epsilon$  N) or zero and are given by That is, a location is either a node ( $n \in N$ ) or a point along a link  $(\ell, z)$ . A journey p is a function from  $\boldsymbol{\mathcal{T}}$  (time) to  $\overline{\mathcal{L}}$ : that is, it is a sequence of locations  $\lambda(s)$  where  $s \in \mathcal{T}$ . It must be continuous  $\lambda(s_{\ell})$ =( $\ell$ ,O and consistent with the network topology, so that after leaving a node, it continuously traverses one of the links emanating from that node and then enters another node. In addition,  $m(r)$ 

$$
\lambda(T) = \lambda(0) \qquad \qquad \lambda(s_{\ell}) = (\ell, 0)
$$

where T is the length of one day. Thus, a Let  $\ell_1$  and  $\ell_2$  be two links journey is a continuous path in the network such that  $\ell_2$  follows the node that

### 3.2 Assignment

An assignment is a probability consistent, the delay satisfies distribution on *N* indexed by time s. For every time s, if  $\lambda$  is a node, A( $\lambda$ Is) is the *\_.* probability of finding a traveler at location  $\lambda$ . If  $\lambda$  is a point on a link  $(\ell, z)$ , 3.4 Assignment Principle  $A(\lambda|s)$ dz is the probability of finding a<br>traveler between  $(\ell, z)$  and  $(\ell, z+dz)$ .

is the number of travelers at  $\lambda$  if  $\lambda$  is a  $\bullet$  Let  $f(\cdot,\cdot)$  be the density function

lay on link  $\ell$  be given by  $\tau_{\ell}(s_{\ell}).$  Let the money cost of link  $\ell$  be  $\mu_{\ell}(s_{\ell})$ . These costs are incurred by travelers that a r rive at link **l** at time s<sub>e</sub>. They are functions of the distribution of travelers on that link and further downstream in Let p<sup>\*</sup> be the journey with the highest<br>the network.

One representation of these costs is

$$
\tau_{\ell}(s_{\ell}) = \varphi(\ell, DA((\ell, 0)|s_{\ell}))
$$
\n
$$
\mu_{\ell}(s_{\ell}) = \gamma(\ell, DA((\ell, 0)|s_{\ell}))
$$
\n(3.4)

(number of lanes, repair condition, tolls),<br>and the arrival rate of travelers at the

Let  $w_{\ell}$  (s $_{\ell}$ ) be the <u>utility</u> 3.1 Network Description of traveling on link t when a traveler Let network  $\mathcal N$  consist of nodes N and  $s_{\ell}$ . It is a function of the time of day<br>links L. A <u>location</u> is an element  $\lambda$  that the traveler reaches the link, but not of the traffic conditions on the link.

> Travel time (t(p)), cost (m(p)), and utility (w(p)) of a journey are the sums of the corresponding quantities for each link of<br>journey p. These quantities are all positive

$$
t(p) = \sum_{\lambda(s_{\ell})=(\ell,0)} \tau_{\ell}(s_{\ell})
$$
  
\n
$$
m(p) = \sum_{\lambda(s_{\ell})=(\ell,0)} \mu_{\ell}(s_{\ell})
$$
  
\n
$$
w(p) = \sum_{\lambda(s_{\ell})=(\ell,0)} w_{\ell}(s_{\ell})
$$
\n(3.5)

starting and ending at the same point.<br>*L<sub>i</sub>*enters. If  $\lambda(s)$  is a journey that  $\lambda(s)$ .arrives at  $t_1$  at  $s_{t_1}$  and at  $t_2$ at *s*<sub> $\ell$ </sub>, then for the journey to be

$$
\tau_{\ell_1}(\mathbf{s}_{\ell_1}) - \mathbf{s}_{\ell_2} - \mathbf{s}_{\ell_1} \tag{3.6}
$$

Each traveler in the network is assumed to have a pair of budgets. He is not Let D be the total population of allowed to take a journey whose travel time<br>travelers in the network. Then exceeds his travel time budget or whose whose exceeds his travel time budget or whose whose money cost exceeds his money budget. Trave-D A( $\lambda$ |s) (3.3) lers differ in having different pairs of budgets.

node; otherwise it is the density of trave-<br>
is the number of travelens, Df(t,m)dtdm<br>
is the number of travelers whose time hudgets. is the number of travelers whose time budgets are between t and t+dt and whose money bud-3.3 Costs **and** Utility gets are between m and m+dm.

Assume that journey p reaches the begin-<br>ning of link  $\ell$  at time s<sub> $\ell$ </sub>. Let the <u>de-</u> travelers behave according to the following travelers behave according to the following<br>principle:



utility. The number of travelers that take<br>p<sup>\*</sup> is

 $-3-$ 

$$
X(p^*) = D \int_{R_{p^*}} f(u,n) \ du \ dn \tag{3.7}
$$

is the set of budgets that are greater than the costs of journey  $p^*$ .

Define  $R_p$  as the set of budgets that

$$
R_p \equiv ((u,n) | u \ge t(p), n \ge m(p))
$$
 (3.9)

The set of budgets of travelers who can **REFERENCES** afford journey p or better is given by

$$
U_p \equiv \bigcup_{w(p') \ge w(p)} R_p. \tag{3.10}
$$

where the union is performed over all journeys p' whose utility is greater than or<br>equal to that of p.

$$
X(p) = D \int_{U_p} f(u,n) \ du \ dn.
$$
 (3.11)

$$
dX(p) = \frac{dX}{dw} dw(p)
$$
 (3.12)

All that remains is to evaluate the Zahavi, Y. (1979) "The UMOT Project," U.S.<br>costs of each journey. The costs depend on **Department of Transportation Report DOT-TSC**costs of each journey. The costs depend on  $\overline{D}$  perartment of Transportation Report DOT-TSC-<br>DA( $\lambda$ |s), as defined above.  $\overline{D}$  RSPA-79-3. August, 1979.

Let  $I(p, \lambda, s)$  be an indicator function which tells if a journey has passed through a given point at a given time.

$$
I(p,\lambda,s) = \begin{cases} 1 & \text{if journey p passes through} \\ 0 & \text{of the twice.} \\ 0 & \text{of the twice.} \end{cases}
$$
 (3.13)

The number of travelers that pass through location  $\lambda$  at time s is given by

D A(\lambda|s) = D 
$$
\int_{0}^{w(p^*)} I(p,\lambda,s) dX(p) + D I(p^*,\lambda,s) X(p^*)
$$

so that

$$
A(\lambda|s) = \int_0^{w(p^*)} I(p,\lambda,s) dX(p) + I(p^*,\lambda,s) X(p^*) \qquad (3.14)
$$

Equation (3.14), finally, completes the assignment principle. The assignment A determines the costs and utilities through (3.4) and (3.5); the costs and utilities determine the distribution of travelers on journeys through (3.7)-(3.11): and the distribution of travelers defines the assignment through (3.12)-(3.14).

### 4 Conclusion

where **Considerable** work remains before this principle can be used to help transportation planners. The dynamic formulation must be  $R_{p^*} \equiv ((u,n) \mid u \ge t(p^*), n \ge m(p^*))$  (3.8) prairiers. The dynamic formulation must be velers. A computational algorithm must be<br>developed to deal with the great complexity and data requirements of this model. Numerical experiments must be performed to show<br>that the formulation behaves according to exceed the costs of journey p: intuition. Most important, the model must be compared with the behavior of an actual transportation system.

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