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A GENERALIZED DISTANCE' ESTIMATION PROCEDURE FOR INTRA-URBAN INTERACTION
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Prepared for:
Office of Naval Research
National Science Foundation

April 1974

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| N.S.F. (Rann) Grant No. GI-34870x; NOOO14- <br> o. projectro. 67-A-0126-0009 NR 047-021 | Center for Cybernetic Studies Research Report CS 171 |
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| This document has been approved for public release and sale; its distribution is unlimited. |  |
| -11. iupricmentant notei | Office of Naval Research (Code 434) Washington, D.C. |
| The estimation of urban and regional travel patterns has beer a necessary part of current efforts to establish land use guidelines for the Texas coastal zone [7]. Fmerging from this research are several theoretical $[4,12]$ and computational advances relating to the gravity model of spatial interaction. This paper details our computational experience with travel estimation within Corpus Christi, Texas, using a new convex programming approach of Charnes, Raike and Bettinger [4]. It is found that available estimation techniques necessarily result in non-integer solutions. A mathematical device is therefore introduced which assures integer-values estimates. Implications and extensions of the work are indicated. |  |

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# A 'GENERALIZED DISTANCE' ESTIMATION PROCEDURE FCR INTRA-URBAN INTEKACTION 

by
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April 1974
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This research was partly supported by N. S. F. (RANN) Grant No. GI-34870X
"Establishment of Environmental Guidelines for Environmental Management" and by Project No. NR 047-021, ONR Contract N00014-67-A-0126-0009 with the Center for Cybernetic Studies, The University of Texas. Reproduction in whole or in part is permitted for any purpose of the United States Government.

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## INTRODUCTION

As reported elsewhere $[3,6,11]$ a large scale modelling effort is underway for the purpose of developing land use and environmental guidelines in the Texas Coastal Zone. The land use portion of this project requires the spatial allocation of commercial, retail and residential elements of the Corpus Christi region under a series of policy constraints. As an input to this analysis it has been important to determine the character of spatial interaction for a series of activities not the least of which was the intra-urbantraffic pattern. A set of experiments have been conducted on various interaction estimation procedures and the results of one of the se experiments is reported below. The importance of this experiment lies in the demonstrated applicability of an extremal method of statistical estimation based on the statistic? information-theoretic approach outlined by Charnes, Raike and Bettinger (4). The demonstratinn rests on a new mathematical device, herein introduced for the first time. This device incorporates our desire for integer-valued estimates of the traffic flows, and in fact guarantees integer solutions. Past literature and computation has failed to come to grips explicitly with this problem. We believe this to be the first full scale application of the approach and feel that some of the issues faced may be of value to other spatial analysts concerned with interaction estimation protlems.

## I. THE ESTIMATION PROBLEM

The Texas Highway Department [13] has comfiled and $u p$-dated origin-destination ( $\mathrm{O}-\mathrm{D}$ ) data for the fifty-six traffic districts within Corpus Christi, both for vehicle trips and for passenger trips, with each trip type disaggregated by vehicle type. Summing these data yielded the aggregate trip type "TOTAL INTERNAL PERSON TRIPS-ALL MODES OF TRAVEL. " We considered our first estimation task to be the district-to-district trip distribution of this trip type.

We wished to estimate a set $\left\{t_{i j} ; i, j=1, \ldots, 56\right\}$, where $t_{i j}$ is the number of persons traveling from district $i$ to district $j$ in a day's time. The $t_{i j}$ were to satisfy a "gravity equation" of the form

$$
\begin{equation*}
t_{i j}=\frac{\tau_{i} \sigma_{j}}{g\left(K_{i j}\right)} \tag{1}
\end{equation*}
$$

where $K_{i j}$ is the "generalized distance" between districts $i$ and $j, \tau_{i}$ and $\sigma_{j}(i, j=1, \ldots, 56)$ are "gravity potentials", and $g$ is a function whose form is determined by the estimation procedure. The $\mathrm{O}-\mathrm{D}$ data and the $\mathrm{K}_{\mathrm{ij}}$ are known constants, and are inputs to the estimation procedures. In the present effort, the $K_{i j}$ 's are a function of the road distance between districts and of the speed limits on these roads; they were approximated by inspection of maps of the city.

The trip distribution estimates from this procedure will be among the inputs to the retai! location sector of the Project [7].

## II. SOILUTION METHODS CONSIDERED

D'Esopo and Lefkowitz [5] describe an iterative procedure leading to estimates of the $\tau_{i}$ and $\sigma_{j}$ of equation (1). This algorithm is not guaranteed to always converge, and hence was dismissed as unreliable.

Wilson's [6] method uses one of the best-knuwn of the "entropymaximizing" approaches to travel pattern estimation. The two principal objections to this approach were (a) its extravagant data requirements, which called for information beyond that available irom the census, and (b) the unusual and nontraditional form of the function $g$ of equation (1) that results from the algoritl: .

Charnes, Raike, and Bettinger showed (a) that the $t_{i j}$ satisfying (1) may be obtained by an extremal principle of convex programming form, and (b) that this principle is equivalent to a standard statistical estiration procedure of the information-theoretic variety [10] -- a hitherto unknown fact. The CRB procedure has none of the lirritations of Wilson's or the D'Esopo-Lefkowitz methods, and is computationa!ly practicable. ${ }^{1}$

## III. THE SOLUTION PROCEDURE

Using the Kuhn-Tucker optimality conditions Charnes, Kaike, and Bettinger [4] pro: 1 the following Theorem. Consider the convex programming problem; ninimize $\underset{i \neq j}{ }\left(t_{i j} \ln K_{i, j} t_{i j}-t_{i j}\right)$

[^0]subject to


If a travel distribution of positive $t_{i j}$ satisfies the gravity equation (1) for some set of potentials $\tau_{i}$ and $\sigma_{j}$ and for some distance function $K_{i j}$ and if these $t_{i j}$ satisfy the origin-destination requirements (3), then these $t_{i j}$ solve the convex programming problem (2), (3) optimally. Conversely, if a distribution $\left\{t_{i j}\right\}$ solves (2), (3) optimally, then potentials $\tau_{i}, \sigma_{j}$ exist such that equation (1) is satisfied with $g\left(K_{i j}\right)=K_{i j}$.

This optimization is shown to yield the trip distribution which is statistically "least distinguishable", in terms of the statistical informationtheoretic measure [4, 10], from the ease-of-travel distribution. ${ }^{2}$ An additional property of an exact optimal solution to such a convex programming problem is that a large fraction of the optimal $t_{i j}$ must be non-integer. This fact has gone unmentioned in all past literature.

Since the function (2) is convex and separable in the $t_{i j}$, it may be approximated by a piecewise linear functic $n$ of the $t_{i j}[1, p .348]$. Thus transformed, tha problem would take the form of a "capacitated distribution problem." This special structure can be solved with suitable special

[^1]computer codes two orders of magnitude faster than with general purpose linear programming codes. Facing squarely the fact that we require integer values for the estimated $t_{i j}$, we have developed a new two-piece approximation which guarantees (for extreme point solutions) that the $t_{i j}$ will be integers.

One difficulty in the capacitated distribution approach lay in the fact that most computer codes suitable for such problems will accept only integer data. Due to the logarithmic terms in the functional (2), truncating the coefficients at the decimal point would have resulted in catastrophic rounding errors. Thus it was necessary to scale all of the input data upward by a factor of $10^{5}$ and, of course, scale the resulting optimal $\mathrm{t}_{\mathrm{ij}}$ downward by the same factor.

Initially an "out-of-kilter" algorithm code was employed for solving the distribution problem. A minor complication at this stage was that the input and output formats of the out-of-kilter code were not equipped to handle integers of the magnitude of the "scaled-up" input data. Hence these formats had to be modified.

The all-in-core program was run in 422 seconds, and required all of the core memory space available for user programs on the CDC 6600 at the University of Texas. The explanation for these unusually large time and core requirements may lie in the fact that (a) all districts are available as destinations for each district of origin, and (b) the 2-piece
linear functional necessitates two links between each node (district) of the network. Thus the network is extremely connected, as well as dense, compared to that of the typical capacitated distrib.tion problem.

Because of the extraordinary time required by the out-of-kilter algorithm, the problem was run on a "primal" algorithin code of Dr. Darwin Klingman's. ${ }^{3}$ An optimal solution was reached in only nine seconds with this code. Moreover, the core requirement was reduced by three-fourths. ${ }^{4}$
IV. DERIVATION OF THE DIOPHANTINE PIECEWISE LINEAR APPROXIMATION

Recalling the nonlinear equation system (2), (3), we transform the variables $t_{i j}$ as follows:

$$
\begin{equation*}
t_{i j} \rightarrow \delta_{i j}^{1}+\delta_{i j}^{2}=\sum_{k=1}^{2} \delta_{i j}^{k} \tag{4}
\end{equation*}
$$

The origin-destination equations (3) become

and
$\sum_{\substack{j=1 \\ i \neq j}}^{n} \sum_{k=1}^{2} \phi_{j}^{k}=O_{i} \quad i=1, \ldots, n \quad$ (3a)
with all $\delta_{i j}^{k} \geq 0$.
${ }^{3}$ We wish to thank Richard Barr of the Center for Cybernetic Studies for making the out-of-kilter code available and for patiently performing the necessary alterations, and Dr. Darwin Klingman for executing the primal code calculation.
${ }^{4}$ Problems much larger than the current one may be solved by any of the many available distribution codes which are not executed wholly in-core.

The functional (2) to be minimized is

$$
\begin{equation*}
\sum_{i \neq j}\left(t_{i j} \ln k_{i j} t_{i j}-t_{i j}\right)=\sum_{i \neq j}\left(t_{i j} \ln k_{i j}+t_{i j} \ln t_{i j}-t_{i j}\right) \tag{5}
\end{equation*}
$$

The only nonlinear term on the right-hand side of (5) is of form $(t \ln t)$. Graphing the function $y=t \ln t$ (fig. 1 ):

(The function has a singularity at $t=0$; the derivative is infinite.)
Figure 1
It is this function that must be approximated by a piecewise linear function. Piecewise linearity is achieved by introducing upper bounds on the $\delta_{i j}{ }^{1}$. The optima? (extreme point) $t_{i j}$ will then be integral or nonintegral respectively as the bounds are integral or non-integral. The procedure naturally suggested by the shape of the curve, i.e., to place the "knee" of the approximation at $\left(e^{-1}, e^{-1}\right)$ and to bound the $\delta_{i j}{ }^{1}$ at $e^{-1}$, is therefore useless for the problem at hand, because the resulting optimal $t_{i j}$ will not be integers.

Bearing in mind that only integer resultis are competitive, we can modify the functional over the domain of its non-integral values. We introduce the modification shown in Figure 2. It guarantees integrality and an appropriate functional behavior over integer values.


Figure 2

Here, the slope of the linear function is $-\varepsilon$ for $0 \leq t<1$, and $R$ for $1<t$, where $0<\varepsilon \ll 1$ and $R=\min \left\{\underset{i}{\max } O_{i}, \max _{j} D_{j}\right\}$.

Thus, if we observe the condition $0 \leq \delta^{1} \leq 1$, then $-\varepsilon \delta^{1}+R \delta^{2} \approx t \ln t$, where $t=8^{1}+8^{2}$. Therefore the functional (5) equals, under the transformation (4),
$\left.\sum_{i \neq j} I\left(\delta_{i j}{ }^{1}+\delta_{i j}{ }^{2}\right) \ln K_{i j}+\left(\delta_{i j}{ }^{1}+\delta_{i j}{ }^{2}\right) \ln \left(\delta_{i j}{ }^{1}+\delta_{i j}{ }^{2}\right)-\left(\delta_{i j}{ }^{1}+\delta_{i j}{ }^{2}\right)\right]$
$\approx \sum_{i \neq j}\left[\left(\delta_{i j}{ }^{1}+\delta_{i j}{ }^{2}\right) \ln K_{i j}+\left(-\varepsilon \delta_{i j}{ }^{1}+R \delta_{i j}{ }^{2}\right)-\left(\delta_{i j}{ }^{1}+\delta_{i j}{ }^{2}\right)\right]$,
which is clearly linear in the $\delta_{i j}{ }^{k}$. It, remains to minimize the right-hand side of equation (6) subject to the conditions (3a) and the further condition $0 \leq q_{i j}^{l} \leq 1$ for all $i$, $j$.
V. RESULTS AND INTERPRETATIONS

It will be recalled that the first run was for the trip type "total internal person trips, all modes of travel" (Figure 3). We anticipate further applications of the method developed, including (a) other trip types of less aggregated character. and (b) inclusion of the major traffic


FIGURE 3
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arterie's ('external stations") entering and leaving the continuously urbanized area.

The travel distribution estimate obtained from the procedure outlined above had some dominating characteristics. Traffic volume was concentrated on relatively few interdistrict links. Other links were assigned token transfers many orders of magnitude less than those of the major links. Further, a pair of adjacent districts are often seen to be connected by a major link, exchanging approximately equal numbers of travelers.

A potentially important result of this study is the observation that the distance between districts (as we have measured it) apparently exerted strong influence on the distribution estimate, despite the fact that in equation (1), $g\left(\mathrm{~K}_{\mathrm{ij}}\right)=\mathrm{K}_{\mathrm{ij}}$. Recall that in many previous studies, an effort is made to represent $g\left(K_{i j}\right)$ as $K_{i j}{ }^{\alpha}$, where $\alpha>1$, giving distance a heavier weight in the estimate. This ma prove to have been a superfluous endeavor.

## VI. CONCLUSION

Furtier extension of the work of Charnes, Raike, and Bettinger [4] is in progress, including a new direct characterization of the potentials $\tau_{i}, \sigma_{j}$ through optimal solution of an unconstrained convex programming problem. Corresponding development of a new algorithm for the $\mathrm{t}_{\mathrm{ij}}$
follows. These characterizations stem from the dual cf a variant of an extended geometric programming problem put forward in another context by Charnes and Cooper [2].

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[^0]:    ${ }^{1}$ For a more detailed comparison of the latter two solution methods see [8] and [12].

[^1]:    ${ }^{2}$ Ease-of-travel is defined as the inverse of the generalized travel cost, normalized to a 0-1 interval.

