

Crime-Avoiding Routing Navigation

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Abstract: *Extensive prior work has provided methods for the optimization of routing based on the criteria of travel time and/or on the cost of travel and/or the distance traveled. A typical method of routing involves building a graph comprised of street segments, assigning a normalized weighted value to each segment, and then applying the weighted-shortest path algorithm to the graph in order to find the best route. Some users desire that the routing suggestion include consideration pertaining to the reduction of risk of encountering violent crime. For example, a user desires a leisure walk via a safe route from her hotel in an unknown city. Here we present a method to quantify such user preferences and the risks of encountering crime and to augment the standard routing methods by giving weight to safety considerations. The proposed method's advantages, in comparison to other crime-avoidance routing algorithms, include weighing crime types with respect to their potential detrimental value to the user, with temporal qualification and quantification of crime and its statistical aggregation at the geographic resolution down to a city block.*

Index Terms: Crime-avoidance, Crime classification, Crime data, Crime impact weighting, Multi-parametric routing, Navigation, Routing, Spatiotemporal analysis of crime

1. INTRODUCTION

Previous research [1-9] has developed methods for the optimization of routing based on the criteria of travel time and/or on the cost of

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travel and/or the distance traveled. Routing can be in various modalities, such as by car, on foot, by bicycle, via public transit, or by boat. A typical method of routing involves building a graph comprised of street segments, assigning a normalized weighted value to each segment, and then applying the weighted-shortest path algorithm to the graph in order to find the best route.

Routing can take into account preference parameters in addition to time and distance. For example, routing suggestions can include consideration pertaining to the reduction of the risk of encountering violent crime. For example, a user desires a leisure walk via a safe route from her hotel in an unknown city. Here we present a method to quantify such user preferences and the risks of encountering crime and to augment the standard routing methods by giving weight to said safety considerations.

Galburn *et al.*^[4] have utilized crime data to optimize the safety aspect of navigation within a city. Their case study involved urban crime data from Illinois and Pennsylvania. Their proposed risk model for the street network within a city facilitated estimating probabilities of criminal incidents that the traveler may encounter on any road segment. In their approach, the same importance is assigned to the path traversal time and the crime incident risk. Their method solves a dual-objective shortest-path problem.

Here we presented an improved method to co-optimize crime avoidance with other criteria. The proposed method's advantages, in comparison to other crime-avoidance routing algorithms, include weighing crime types with respect to their potential detrimental value to the user, with temporal qualification and quantification of crime and its statistical aggregation at the geographic resolution down to a city block.

The following figure shows traditional routing optimizing the time and/or distance.

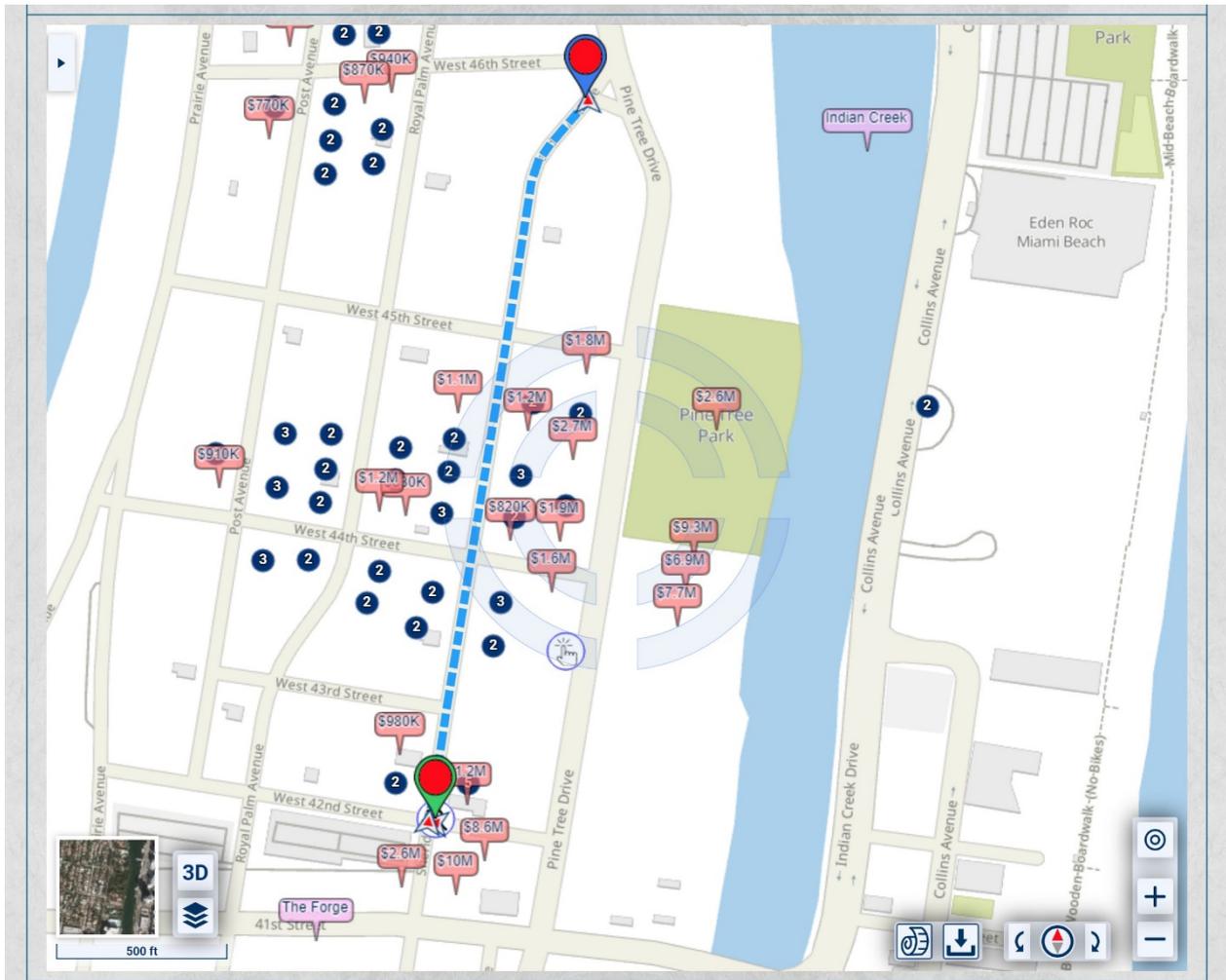


Figure 1: Routing that optimizes time and/or distance

Here we present an improved method to co-optimize crime avoidance with other criteria. The proposed method's advantages, in comparison to Galburn [4] and the other crime-avoidance routing algorithms, include:

- (1) weighing crime types with respect to their potential detrimental value to the user,
- (2) with temporal qualification,
- (3) quantification of crime and its statistical aggregation at the geographic resolution down to a city block, and
- (4) evaluation of the crime detriment to the user in each segment by considering the needs, exposure, and preferences of the user rather than merely considering the general crime incidence statistics. For example, violent crime committed outdoors have a higher impact, and severe violence, such as homicide in the street, have the highest impact. Crimes without a direct unrelated victim, such as code violations or embezzlement, have no impact on travelers. Pick-pockets have an impact on travelers in walking mode but minimal impact on travelers by

car. Non-statutory rape may be of high concern to a woman walking alone. For each type of traveler and travel modality, the present method provides default formulas for the evaluation of crime detriment in each segment. Additionally, the user may modify the formula by assigning greater or lesser importance to various types of crimes.

2. METHODOLOGY

In order to quantify crime risks for each street segment, we count police reports that occurred close to that segment during a set period of time, e.g., a particular year of reference, counting only violent and property crimes of the type that would directly affect the traveler (e.g., exclude domestic violence, exclude insider trading, exclude code violations, exclude statutory rape) and can further assign weights to various crime crimes based on the impact it may have in the traveler. The following is an example of a query to a crime database for an area in mid-Miami Beach.

Criteria Description offense=**BATTERY**, Date and time≥2018-01-01, Date and time≤2018-12-31

Selection Criteria: Try also: Or fill in &

Description of offense: **=Battery** [any](#) [null](#) [non-null](#) [Accident](#) [Administrative](#) [Aggravated](#) [Alarm](#) [All](#) [Arm](#) [Aoa](#) [Assault](#) [Atm](#) [Au](#) [Audible](#) [Battery](#) [Burglary](#) [Buy Card Cml](#) [Code Con](#) [Credit](#) [Criminal](#) [Death](#) [Del](#) [Detail](#) [Directed](#) [Dispute](#) [Distrib](#) [Disturbance](#) [Domestic](#) [Drug](#) [Equipment](#) [Events](#) [F](#) [False](#) [Florida](#) [Found](#) [Fraud](#) [From](#) [Hang](#) [Illegal](#) [Impersonation](#) [Import](#) [Incident](#) [Information](#) [Intimidation](#) [Larceny](#) [Lost](#) [Manuf](#) [Mnr](#) [Motor](#) [Narcotic](#) [Natural](#) [Non](#) [Offenses](#) [Open](#) [Or](#) [Order](#) [Other](#) [Others](#) [Over](#) [Person](#) [Poss](#) [Pret](#) [Property](#) [Rape](#) [Recovery](#) [Residence](#) [Residential](#) [Robbery](#) [Rsd](#) [Run](#) [S](#) [Sell](#) [Service](#) [Shoplifting](#) [Simple](#) [Stolen](#) [Stop](#) [Structure](#) [Susp](#) [Suspicious](#) [Swindle](#) [Theft](#) [To](#) [Traffic](#) [Trespassing](#) [Under](#) [Up](#) [Vandalism](#) [Veh](#) [Vehicle](#) [Viol](#) [Violations](#) [Warrant](#) [Watch](#) [Weapons](#)

Date and time the incident occurred: **≥2018-01-01** [any](#) [null](#) [non-null](#) [≥2021-06-01](#) [≥2021-12-01](#) [≥2022-01-01](#) [≥2022-06-01](#)

≤2018-12-31

Keywords in: **= any**

Figure 2: A sample query to a crime database

The above query may result in a set of incidents shown in the following map.

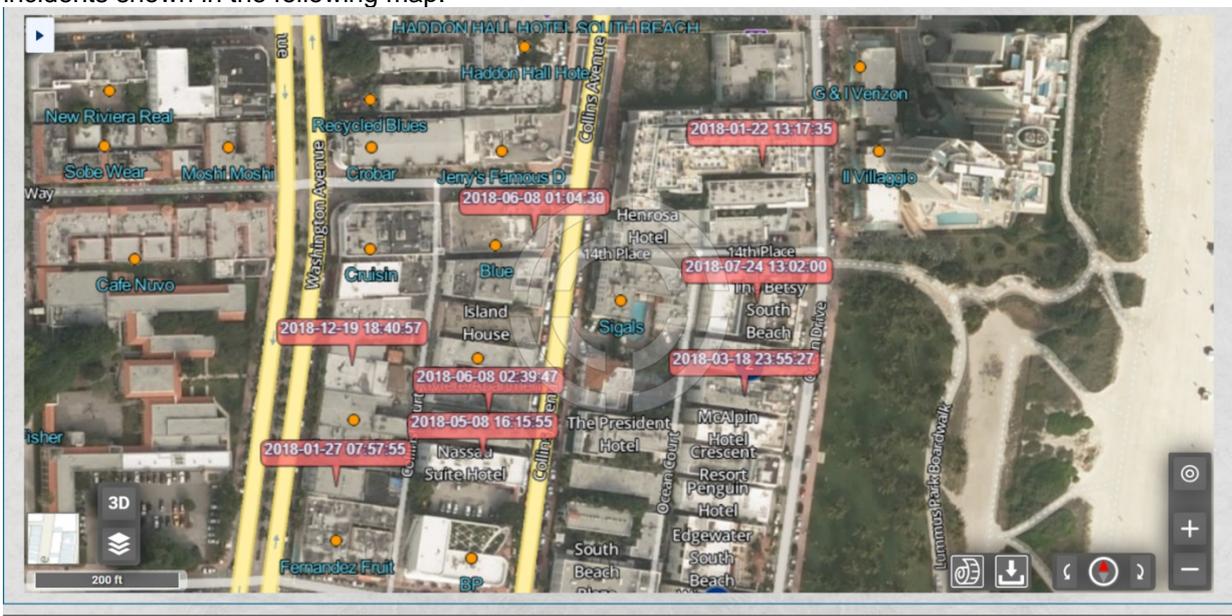


Figure 3: Map of incidents

The following is a tabular output of the query:

Case number	Description of offense	Date and time the incident occurred	Reported	Address where the incident occurred	Police district	Clearance code description as reported by Officer	Business name involved in incident	Signal code description	Victim type description	Victim name(s)	Suspect name(s)	Arrestee name
MBc2018-00120592	Assault Or Battery OF LAW ENFORCEMENT OFFICERS, FIREFIGHTERS, EMERGENCY MEDICAL CARE PROVIDERS, PUBLIC TRANSIT EMPLOYEES Or AGENTS, Or Other SPECIFIED OFFICERS; RECLAMATION OF OFFENSES; MINIMUM SENTENCES	≤2018-12-19 18:40:57≥		1425 WASHINGTON AVE		APPROVED						
MBc2018-00054670	BATTERY-FELONY Battery	≤2018-05-18 06:48:59≥		600 ESPANOLA WAY		Closed						
MBc2018-00010991	BATTERY-FELONY Battery	≤2018-01-27 07:57:55≥		1409 WASHINGTON AVE		Closed No SOLVABILITY						
MBc2018-00061490	BATTERY-FELONY Battery	≤2018-06-08 02:39:47≥		1420 COLLINS AVE		1 - Closed N- A						

Figure 4: Report of incidents

The mid-Miami Beach area of the previous example did not have homicide reports during the sampling period. To see homicide reports, which

should be considered with a higher weight than battery, we need to query an area further west:

Criteria Description offense=homicide, Date and time≥2018-01-01, Date and time≤2018-12-31

Selection Criteria: Try also: Or fill in & ⚙

Description of offense =homicide any null non-null Accident Administrative Aggravated Alarm All Alrm Aoa Assault Atm Au Audible Battery Burglary Buy Card Cml Code Con Credit Criminal Death Del Detail Directed Dispute Distrb Disturbance Domestic Drug Equipment Events F False Florida Found Fraud From Hang Illegal Impersonation Import Incident Information Intimidation Larceny Lost Manuf Mnr Motor Narcotic Natural Non Offenses Open Or Order Other Others Over Person Poss Pret Property Rape Recovery Residence Residential Robbery Rsd Run S Sell Service Shoplifting Simple Stolen Stop Structure Susp Suspicious Swindle Theft To Traffic Trespassing Under Up Vandalism Veh Vehicle Violations Warrant Watch Weapons

Date and time the incident occurred ≥2018-01-01 ≤2018-12-31

≥ 2018-01-01

≤ 2018-12-31

Figure 5: Homicide query

The results are shown in the following map and table.

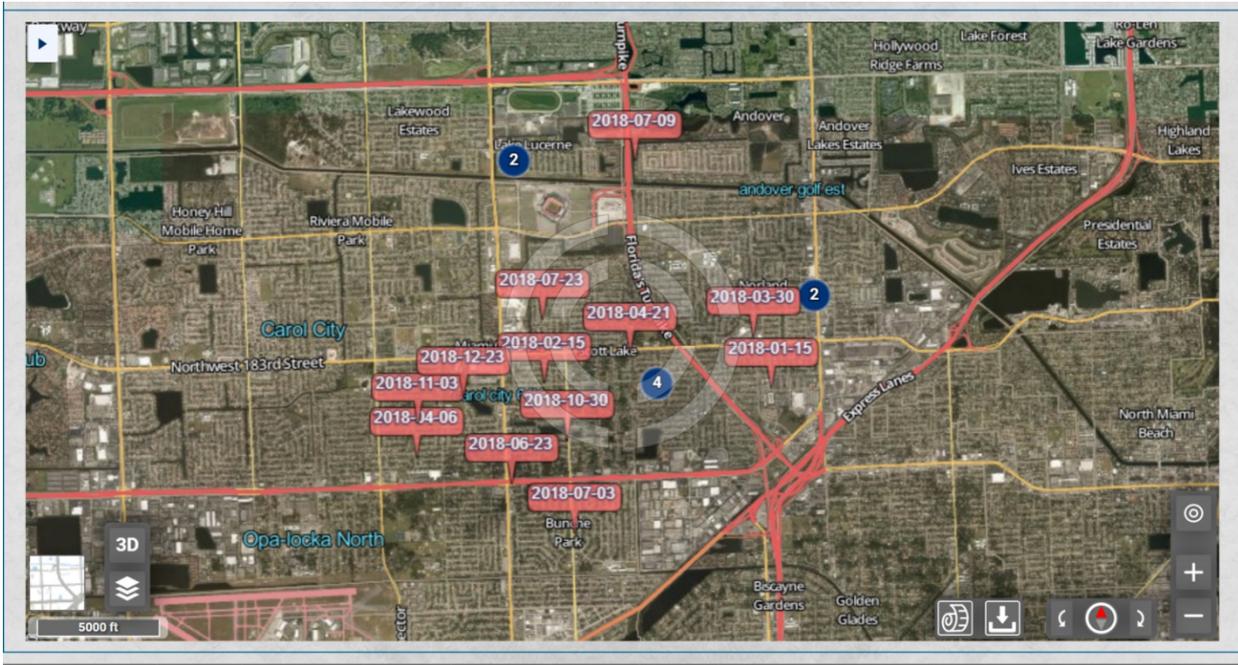


Figure 6: Map of homicide incidents

links to locations & details	Case number	Description of offense	Date and time the incident occurred	Reported	Address where the incident occurred	Police district	Clearance code description as reported by Officer	Business name involved in incident	Signal code description	Victim type description	Victim name(s)
1: 0.2±0.31 miles	MGc20-18007-150	Information - Accident Traffic HOMICIDE	≤2018-04-21≥		18249 NW 17TH AVE NW 183RD ST	Zone 11					
2: 2107'	MGc20-18009-665	Information - Accident Traffic HOMICIDE	≤2018-05-28≥		1621 NW 179TH ST	Zone 11					
3: 2883'	MGc20-18016-121	HOMICIDE-MURDER	≤2018-09-03≥		1300 NW 180TH TER	Zone 11					
4: 2890'	MGc20-18020-205	HOMICIDE-MURDER	≤2018-11-02≥		17701 NW 15TH CT	Zone 11					
5: 3137'	MGc20-18008-225	HOMICIDE-ATTEMPTED MURDER	≤2018-05-07≥		17730 NW 13TH CT	Zone 11					
6: 3383'	MGc20-18013-358	HOMICIDE-MURDER	≤2018-07-23≥		18700 NW 23RD AVE	Zone 31					
7: 2241'	MGc20-18003-150	HOMICIDE-MURDER	≤2018-03-15≥		2335 NW 22ND ST	Zone 22					

Figure 7: Table of homicide incidents

The importance of querying for only specific types of crime (and weighting them) is demonstrated by the following query, whose

results are mostly crimes that have no bearing on the prospective traveler.

Criteria Date and time \geq 2018-01-01, Date and time \leq 2018-12-31

Selection Criteria: Try also: Or fill in & \geq 2018-01-01

Date and time the incident occurred \geq 2018-01-01 [any null non-null](#) [>2021-06-01](#) [>2021-12-01](#) [>2022-01-01](#) \leq 2018-12-31 [>2022-06-01](#) \leq 2018-12-31

Figure 8: Query not restricting crime types



Figure 9: Map of the output of a query not restricting crime types

Case number	Description of offense	Date and time the incident occurred	Reported	Address where the incident occurred	Police district	Clearance code description as reported by Officer	Business name involved in incident	Signal code description	Victim type description	Victim name(s)	Suspect name(s)
MBc2018-00119260	PROHIBITED ACTS; PENALTIES	≤2018-12-15 01:13:19≥		200 30TH ST		Pending					
MBc2018-00116267	Larceny Under \$50.00 (+ ATT.)	≤2018-12-05 01:09:38≥		200 30TH ST		1 - Closed N- A					
MBc2018-00079230	Larceny Under \$50.00 (+ ATT.)	≤2018-08-01 10:52:39≥		200 30TH ST		Closed No SOLVA-BILITY					
MBc2018-00064680	FRAUD-ILLEG USE Credit CARDS	≤2018-06-18 10:56:58≥		2940 COLLINS AVE		Closed					
MBc2018-00115181	Larceny \$50 To \$200	≤2018-12-01 08:53:53≥		2940 COLLINS AVE		Closed No SOLVA-BILITY					
MBc2018-00109397	MUNICIPAL ORDINANCE Viol	≤2018-11-10 12:32:44≥		2940 COLLINS AVE		Closed No SOLVA-BILITY					
MBc2018-00102292	FORCIBLE Rape COMMITTED	≤2018-10-18 14:46:55≥		2940 COLLINS AVE		APPROVED					
MBc2018-00118987	Assault AGG	≤2018-12-14 02:29:59≥		2940 COLLINS AVE		REVIEW					
MBc2018-00038646	Criminal MISCHIEF; PENALTIES; PENALTY FOR MINOR	≤2018-04-04 11:20:39≥		220 30TH ST		Closed					

Figure 10: Tabular output of a query that does not restrict crime types, including crimes irrelevant for the traveler, e.g., credit card fraud

Turning back to routing, the following is a route optimizing travel time, which traverses segments

where relevant crimes have occurred during the sampling period:

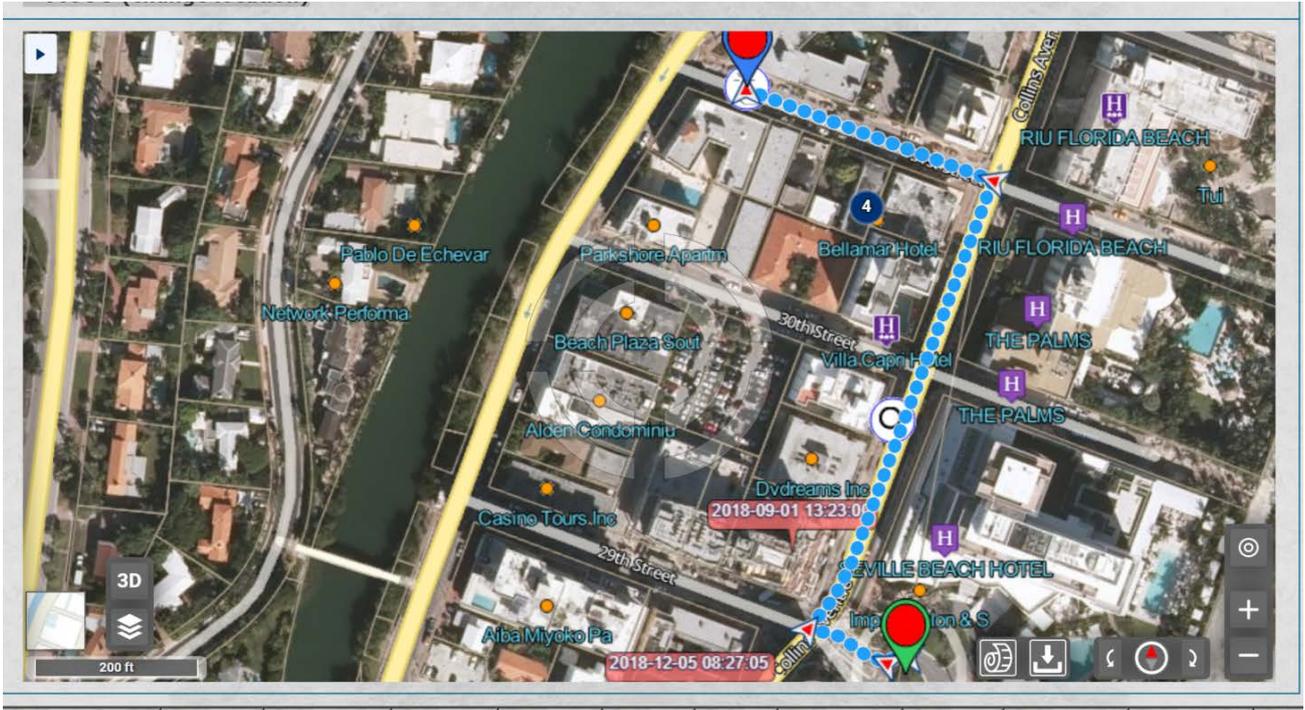


Figure 11: Time-optimized routing path, going through segments with higher crime potential

By co-optimizing the walk duration and crime encounter probability reduction, we get a slightly different route:

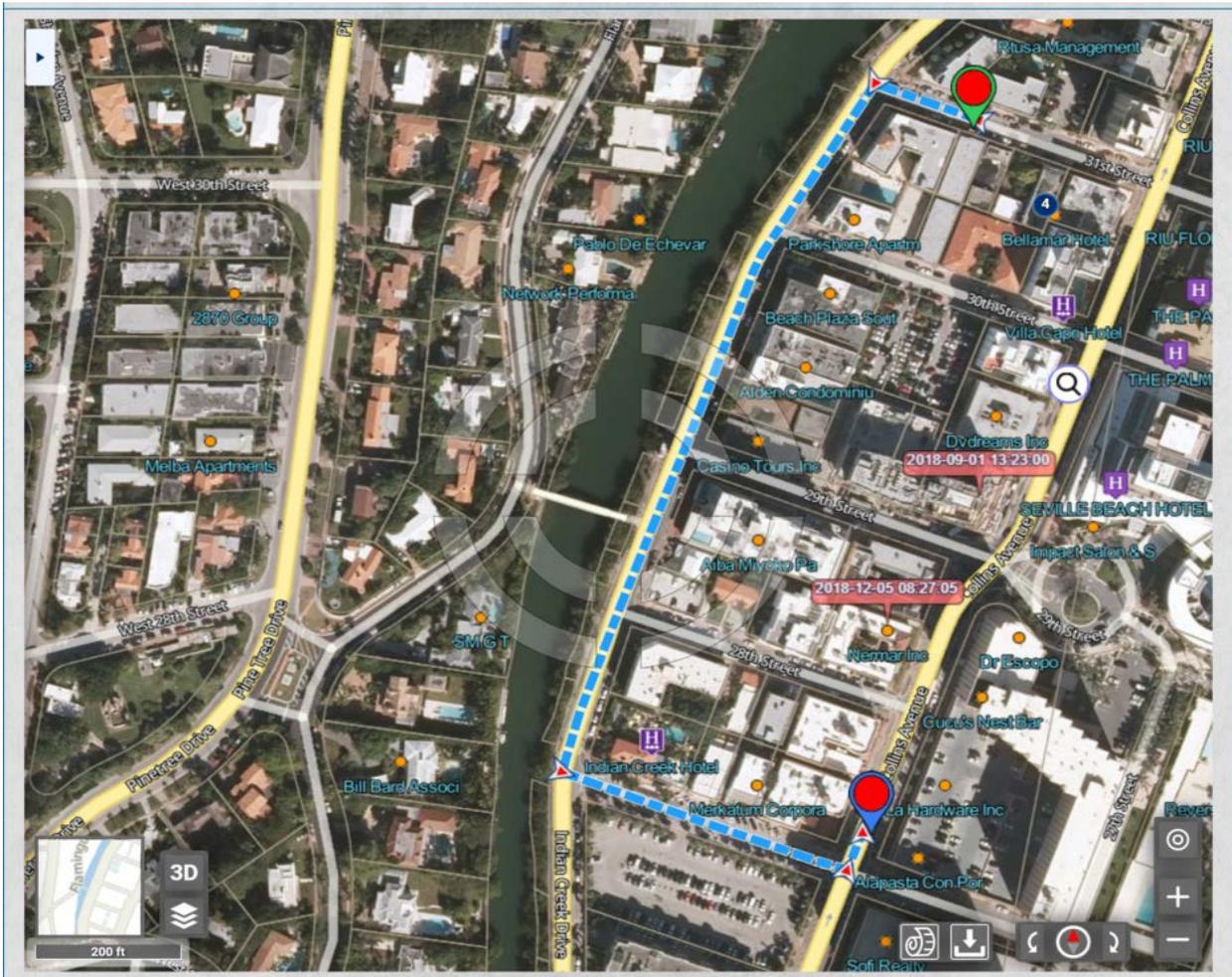


Figure 12: Routing co-optimizing time and crime avoidance

The relative importance of time, cost of travel, and crime avoidance can be determined by the user utilizing a prior-art technology of weight selection triangle: a touchable triangle allows the user to assign importance weights to three interrelated decision optimization objectives using a single gesture [Oliver Ullrich, Naphtali Rishe, Daniel Luckerath. U.S. Patent US10061501B2 "User Interface for Co-Optimizing Weight Factors" issued on: August 28, 2018]:

1

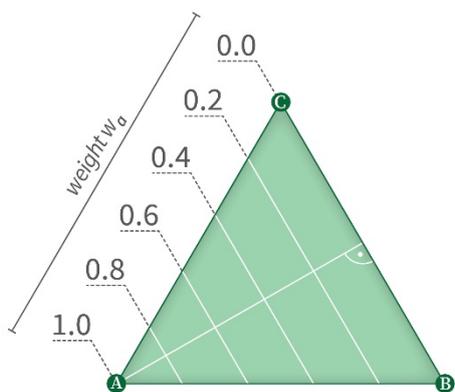


Figure 14: A weighting triangle with values along one side

2

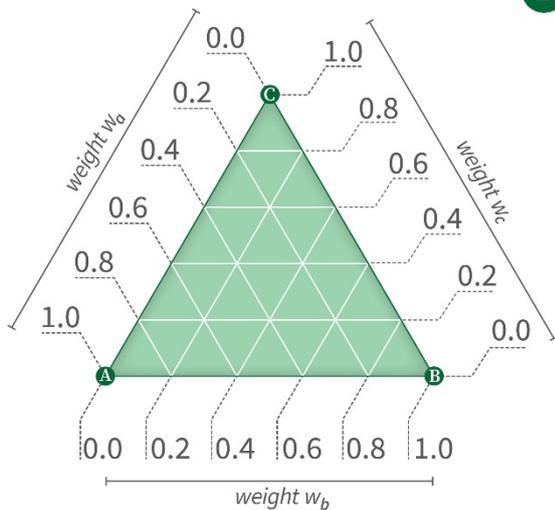


Figure 15: A weighting triangle with weighting values along all three sides

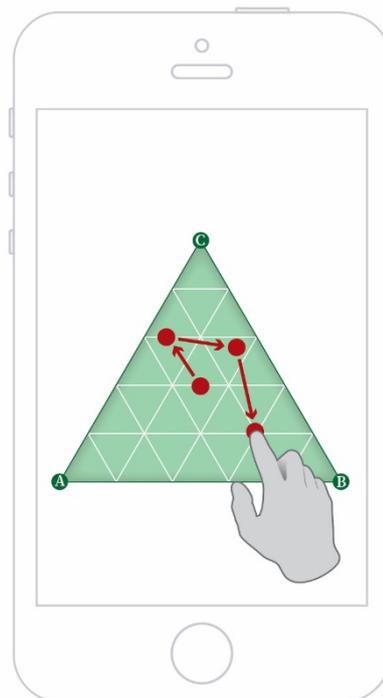


Figure 16: A smart device with the weighting triangle displayed thereon, showing a user selecting different weighting points

Applying said prior-art method to the herein proposed weighting selection problem, three objectives ($A=$ time, $B=$ cost of travel, and $C=$ crime avoidance) are presented in a triangular fashion on a touch screen. Sub-figure 1 shows the underlying principle of the establishment of a single weight w_A for Objective A; Sub-figure 2 combines three objectives into a single triangle, allowing for the establishment of a tri-variable weight function (w_A, w_B, w_C). By applying a finger gesture, the user moves an indicator freely inside the triangle (see Sub-figure 3). The position of the indicator establishes a tri-variable weight function, which in further steps, is then used as input for a co-optimization algorithm. When the user is satisfied with the established weights, she indicates this, e.g., by pressing a touch screen button labeled "Go."

AVAILABILITY OF DATA AND MATERIALS

The data used in this work is available at <http://terrafly.com>. The geospatial data sets used in case studies to illustrate the method proposed herein can be provided by the corresponding author with appropriate arrangements.

COMPETING INTERESTS

The authors declare that they have no competing interests.

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AUTHORS' CONTRIBUTIONS

Conceptualization: Rishe; Methodology: Rishe and Adjouadi; Investigation: Rishe, Sadjadi, and Adjouadi; Writing: Rishe and Sadjadi; Funding acquisition: Rishe, Sadjadi, and Adjouadi. All the authors of this paper concur with its content and consent to its publication.

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REFERENCES

- [1] E. Kanoulas, Yang Du, Tian Xia, and Donghui Zhang (2006). Finding Fastest Paths on A Road Network with Speed Patterns. In: 22nd International Conference on Data Engineering (ICDE'06), pp. 10-10, doi: 10.1109/ICDE.2006.71.
- [2] Y.-J. Joo, S.-H. Kim (2011). A new route guidance method considering the pedestrian level of service using a multi-criteria decision-making technique. Journal of Korea Spatial Information Society, 19, pp. 83–91.
- [3] Michael Shekelyan, Gregor Jossé, Matthias Schuber, Hans-Peter Kriegel (2014). Linear Path Skyline Computation in Bicriteria Networks. International Conference on Database Systems for Advanced Applications (DASFAA 2014). Lecture Notes in Computer Science, volume 8421, Springer, pp. 173-187.
- [4] Esther Galbrun, Konstantinos Pelechrinis, Evimaria Terzi (2016). Urban navigation beyond shortest route: The case of safe paths. Information Systems, Volume 57, pp. 160-171.
- [5] Hochmair, H. H. (2010). Spatial association of geotagged photos with scenic locations. In A. Car, G. Griesebner, & J. Strobl (Eds.), Geospatial Crossroads@GI_Forum '10: Proceedings of the geoinformatics forum Salzburg (pp. 91–100). Heidelberg: Wichmann.
- [6] Lu, X., Wang, C., Yang, J. M., Pang, Y., & Zhang, L. (2010). Photo2Trip: Generating travel routes from geotagged photos for trip planning. In Proceedings of the international conference on Multimedia (pp. 143–152). New York City: ACM.
- [7] Sun, Y., Fan, H., Bakillah, M., & Zipf, A. (2013). Road-based travel recommendation using geo-tagged images. Computers, Environment and Urban Systems.
- [8] Alivand, M., Hochmair, H. and Srinivasan, S. (2015), "Analyzing how travelers choose scenic routes using route choice models," Computers, Environment and Urban Systems, Vol. 50, pp. 41–52.
- [9] Mišković, S. and Stanimirović, Z. (2017), "Variable Neighborhood Search Based Heuristics for the Hard Capacitated k -facility Location Problem," IPSI Bgd Trans. Internet Res., pp. 1–8.
- [10] Oliver Ullrich, Naphtali Rishe, Daniel Luckerath. U.S. Patent US10061501B2 "User Interface for Co-Optimizing Weight Factors" issued on: August 28, 2018.

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