

# Final Report



Evaluating the Impacts of Real-Time Information on Subway Ridership in New York City

Performing Organization: City University of New York (CUNY)



**May 2018** 



#### University Transportation Research Center - Region 2

The Region 2 University Transportation Research Center (UTRC) is one of ten original University Transportation Centers established in 1987 by the U.S. Congress. These Centers were established with the recognition that transportation plays a key role in the nation's economy and the quality of life of its citizens. University faculty members provide a critical link in resolving our national and regional transportation problems while training the professionals who address our transportation systems and their customers on a daily basis.

The UTRC was established in order to support research, education and the transfer of technology in the field of transportation. The theme of the Center is "Planning and Managing Regional Transportation Systems in a Changing World." Presently, under the direction of Dr. Camille Kamga, the UTRC represents USDOT Region II, including New York, New Jersey, Puerto Rico and the U.S. Virgin Islands. Functioning as a consortium of twelve major Universities throughout the region, UTRC is located at the CUNY Institute for Transportation Systems at The City College of New York, the lead institution of the consortium. The Center, through its consortium, an Agency-Industry Council and its Director and Staff, supports research, education, and technology transfer under its theme. UTRC's three main goals are:

#### Research

The research program objectives are (1) to develop a theme based transportation research program that is responsive to the needs of regional transportation organizations and stakeholders, and (2) to conduct that program in cooperation with the partners. The program includes both studies that are identified with research partners of projects targeted to the theme, and targeted, short-term projects. The program develops competitive proposals, which are evaluated to insure the mostresponsive UTRC team conducts the work. The research program is responsive to the UTRC theme: "Planning and Managing Regional Transportation Systems in a Changing World." The complex transportation system of transit and infrastructure, and the rapidly changing environment impacts the nation's largest city and metropolitan area. The New York/New Jersey Metropolitan has over 19 million people, 600,000 businesses and 9 million workers. The Region's intermodal and multimodal systems must serve all customers and stakeholders within the region and globally. Under the current grant, the new research projects and the ongoing research projects concentrate the program efforts on the categories of Transportation Systems Performance and Information Infrastructure to provide needed services to the New Jersey Department of Transportation, New York City Department of Transportation, New York Metropolitan Transportation Council, New York State Department of Transportation, and the New York State Energy and Research Development Authorityand others, all while enhancing the center's theme.

#### **Education and Workforce Development**

The modern professional must combine the technical skills of engineering and planning with knowledge of economics, environmental science, management, finance, and law as well as negotiation skills, psychology and sociology. And, she/he must be computer literate, wired to the web, and knowledgeable about advances in information technology. UTRC's education and training efforts provide a multidisciplinary program of course work and experiential learning to train students and provide advanced training or retraining of practitioners to plan and manage regional transportation systems. UTRC must meet the need to educate the undergraduate and graduate student with a foundation of transportation fundamentals that allows for solving complex problems in a world much more dynamic than even a decade ago. Simultaneously, the demand for continuing education is growing – either because of professional license requirements or because the workplace demands it – and provides the opportunity to combine State of Practice education with tailored ways of delivering content.

#### **Technology Transfer**

UTRC's Technology Transfer Program goes beyond what might be considered "traditional" technology transfer activities. Its main objectives are (1) to increase the awareness and level of information concerning transportation issues facing Region 2; (2) to improve the knowledge base and approach to problem solving of the region's transportation workforce, from those operating the systems to those at the most senior level of managing the system; and by doing so, to improve the overall professional capability of the transportation workforce; (3) to stimulate discussion and debate concerning the integration of new technologies into our culture, our work and our transportation systems; (4) to provide the more traditional but extremely important job of disseminating research and project reports, studies, analysis and use of tools to the education, research and practicing community both nationally and internationally; and (5) to provide unbiased information and testimony to decision-makers concerning regional transportation issues consistent with the UTRC theme.

#### Project No(s):

UTRC/RF Grant No: 49198-20-27

**Project Date:** May 2018

**Project Title:** Evaluating the Impacts of Real-Time Information on Subway Ridership in New York City

#### Project's Website:

http://www.utrc2.org/research/projects/evaluating-information-subway-ridership-nyc

# Principal Investigator(s): Candace Brakewood, Ph.D.

Assistant Professor
Department of Civil Engineering
The City College of New York
New York, NY 10031
Tel: (212) 650 5317

Tel: (212) 650-5217

Email: cbrakewood@ccny.cuny.edu

#### **Performing Organization(s):**

City University of New York (CUNY)

#### Sponsor(s):

University Transportation Research Center (UTRC)

To request a hard copy of our final reports, please send us an email at utrc@utrc2.org

#### **Mailing Address:**

University Transportation Reserch Center The City College of New York Marshak Hall, Suite 910 160 Convent Avenue New York, NY 10031 Tel: 212-650-8051

Fax: 212-650-8374 Web: www.utrc2.org

#### **Board of Directors**

The UTRC Board of Directors consists of one or two members from each Consortium school (each school receives two votes regardless of the number of representatives on the board). The Center Director is an ex-officio member of the Board and The Center management team serves as staff to the Board.

#### City University of New York

Dr. Robert E. Paaswell - Director Emeritus of NY Dr. Hongmian Gong - Geography/Hunter College

#### **Clarkson University**

Dr. Kerop D. Janoyan - Civil Engineering

#### **Columbia University**

Dr. Raimondo Betti - Civil Engineering Dr. Elliott Sclar - Urban and Regional Planning

#### **Cornell University**

Dr. Huaizhu (Oliver) Gao - Civil Engineering Dr. Richard Geddess - Cornell Program in Infrastructure Policy

#### **Hofstra University**

Dr. Jean-Paul Rodrigue - Global Studies and Geography

#### **Manhattan College**

Dr. Anirban De - Civil & Environmental Engineering Dr. Matthew Volovski - Civil & Environmental Engineering

#### New Jersey Institute of Technology

Dr. Steven I-Jy Chien - Civil Engineering Dr. Joyoung Lee - Civil & Environmental Engineering

#### New York Institute of Technology

Dr. Nada Marie Anid - Engineering & Computing Sciences Dr. Marta Panero - Engineering & Computing Sciences

#### **New York University**

Dr. Mitchell L. Moss - Urban Policy and Planning Dr. Rae Zimmerman - Planning and Public Administration

#### (NYU Tandon School of Engineering)

Dr. John C. Falcocchio - Civil Engineering Dr. Kaan Ozbay - Civil Engineering Dr. Elena Prassas - Civil Engineering

#### Rensselaer Polytechnic Institute

Dr. José Holguín-Veras - Civil Engineering Dr. William "Al" Wallace - Systems Engineering

#### Rochester Institute of Technology

Dr. James Winebrake - Science, Technology and Society/Public Policy Dr. J. Scott Hawker - Software Engineering

#### **Rowan University**

Dr. Yusuf Mehta - Civil Engineering Dr. Beena Sukumaran - Civil Engineering

#### State University of New York

Michael M. Fancher - Nanoscience Dr. Catherine T. Lawson - City & Regional Planning Dr. Adel W. Sadek - Transportation Systems Engineering Dr. Shmuel Yahalom - Economics

#### Stevens Institute of Technology

Dr. Sophia Hassiotis - Civil Engineering Dr. Thomas H. Wakeman III - Civil Engineering

#### **Syracuse University**

Dr. Baris Salman - Civil Engineering Dr. O. Sam Salem - Construction Engineering and Management

#### The College of New Jersey

Dr. Thomas M. Brennan Jr - Civil Engineering

#### University of Puerto Rico - Mayagüez

Dr. Ismael Pagán-Trinidad - Civil Engineering Dr. Didier M. Valdés-Díaz - Civil Engineering

#### **UTRC Consortium Universities**

The following universities/colleges are members of the UTRC consortium under MAP-21 ACT.

City University of New York (CUNY)
Clarkson University (Clarkson)
Columbia University (Columbia)
Cornell University (Cornell)
Hofstra University (Hofstra)
Manhattan College (MC)
New Jersey Institute of Technology (NJIT)
New York Institute of Technology (NYIT)
New York University (NYU)
Rensselaer Polytechnic Institute (RPI)

Rochester Institute of Technology (RIT) Rowan University (Rowan) State University of New York (SUNY)

Stevens Institute of Technology (Stevens) Syracuse University (SU) The College of New Jersey (TCNJ)

University of Puerto Rico - Mayagüez (UPRM)

#### **UTRC Key Staff**

Dr. Camille Kamga: Director, Associate Professor of Civil Engineering

**Dr. Robert E. Paaswell:** *Director Emeritus of UTRC and Distin*guished Professor of Civil Engineering, The City College of New York

Dr. Ellen Thorson: Senior Research Fellow

Penny Eickemeyer: Associate Director for Research, UTRC

**Dr. Alison Conway:** Associate Director for Education/Associate Professor of Civil Enginering

Nadia Aslam: Assistant Director for Technology Transfer

Nathalie Martinez: Research Associate/Budget Analyst

Andriy Blagay: Graphic Intern

Tierra Fisher: Office Manager

Dr. Sandeep Mudigonda, Research Associate

Dr. Rodrigue Tchamna, Research Associate

Dr. Dan Wan, Research Assistant

**Bahman Moghimi**: Research Assistant; Ph.D. Student, Transportation Program

**Sabiheh Fagigh**: Research Assistant; Ph.D. Student, Transportation Program

**Patricio Vicuna**: Research Assistant Ph.D. Candidate, Transportation Program

# **Disclaimer**

The contents of this report reflect the views of the authors, who are responsible for the facts and the accuracy of the information presented herein. The contents do not necessarily reflect the official views or policies of the UTRC or the Federal Highway Administration. This report does not constitute a standard, specification or regulation. This document is disseminated under the sponsorship of the Department of Transportation, University Transportation Centers Program, in the interest of information exchange. The U.S. Government assumes no liability for the contents or use thereof.

			TECHNICAL REPORT STA	NDARD TITLE PAGE			
1. Report No.	2.Government Accession I	No.	Recipient's Catalog No.				
49198-20-27	N/A		N/A				
4. Title and Subtitle			5. Report Date				
			May 21, 2018				
Evaluating the Impacts of Real-Time Information	on on Subway Ridership in N	ew York City	<ol><li>Performing Organization C N/A</li></ol>	code			
7. Author(s)			8. Performing Organization R	eport No.			
Candace Brakewood			N/A				
9. Performing Organization Name and Addres	S		10. Work Unit No.				
The City College of New York			N/A				
The City College of New York 137 <sup>th</sup> Street and Convent Avenue			11. Contract or Grant No.				
New York, NY 10031			49198-20-27				
12. Sponsoring Agency Name and Address			13. Type of Report and Perio	od Covered			
UTRC			Final Report				
The City College of NY 137th Street and Convent Avenue			14. Sponsoring Agency Code	e			
New York, NY 10031			N/A				
, , , , , , , , , , , , , , , , , , ,			1971				
15. Supplementary Notes							
N/A							
16. Abstract							
It is now common for transit operators to provious vehicles. The Metropolitan Transportation Autilargest urban heavy rail system in the United Subway passengers in New York City. The me RTI. The first part compiles literature for all traeight studies were reviewed, and five key pass conducted in urban heavy rail systems (six in the fitted in the five moderate of the literature review suggest that the five moderate of t	hority (MTA) in New York Citates. In light of this, the object of the control of	y has recently madective of this resear eview of prior studing passenger impacts d. The second part be applicable to the ted with providing R increased use of transl security when ri- times (three of six s at future research for	e RTI available for most of the sch is to investigate how RTI is es that assess the passenger b of RTI are found in multiple stu includes a more detailed revie e New York City Subway. The ITI to passengers pertain to (1) ansit. RTI may also be associading transit. The prior studies of tudies), decreases in overall traicus on these three areas to ever the school of	subway, which is the likely to impact penefits of providing dides. In total, twenty-w of prior studies results of the first part decreased wait times, ted with (4) increased of urban heavy rail avel times (one study),			
17. Key Words		18. Distribution St	atement				
Public transit; real-time information; wait times;	,	N/A					
19. Security Classif (of this report)	20. Security Classif. (of thi	s page)	21. No of Pages	22. Price			

18

Unclassified

Form DOT F 1700.7 (8-69)

Unclassified

N/A

# Acknowledgements

Thank you to the University Transportation Research Center (UTRC) for the opportunity to participate in the Emerging Scholars grant program, which provided the financial support for this research.

The author would like to acknowledge three former students who contributed to the research process: Almeria Senecat, Vinh Pham-Gia, and Aaron Gooze.

Last, the author would like to acknowledge Dr. Kari Watkins, an Associate Professor at Georgia Tech, who collaborated on the literature review of real-time transit information. Dr. Watkins played an important role in this project by conducting the web-based search that was the basis of the literature review, and she is a co-author on the journal publication that is a result of this project, which is:

Brakewood and Watkins (2018). A Literature Review of the Passenger Impacts of Real-Time

Transit Information. Transport Reviews. DOI: 10.1080/01441647.2018.1472147.

# Contents

Executive Summary	nmary       1         2       2         Searched       5         riteria       5         pacts of RTI on Passengers       6         the Literature Review       7         f All Studies       7         f Urban Heavy Rail Studies       10         New York Circuit Acres for Form Parallel       12
Introduction	2
Terminology	2
Methodology	5
Databases Searched	5
Inclusion Criteria	5
Primary Impacts of RTI on Passengers	6
Findings from the Literature Review	7
Summary of All Studies	7
Summary of Urban Heavy Rail Studies	10
Discussion of New York City and Areas for Future Research	12
References	14

# **List of Figures**

Figure 1: Real-time information signage in a New York City Transit station
Figure 2: MTA's "Subway Time" app home screen (left) & real-time information screen (right) 4
List of Tables
Table 1: Summary of all studies on the impacts of real-time information
Table 2: Studies on the impacts of real-time information in urban heavy rail systems 11

# **Executive Summary**

It is now common for transit operators to provide real-time information (RTI) to passengers about the location or predicted arrival times of transit vehicles. The Metropolitan Transportation Authority (MTA) in New York City has recently made RTI available for most of the subway, which is thee largest urban heavy rail system in the United States. In light of this, the objective of this research is to investigate how RTI is likely to impact subway passengers in New York City. The method is a two-part literature review of prior studies that assess the passenger benefits of providing RTI. The first part compiles literature for all transit modes to identify which passenger impacts are found in multiple studies. In total, twenty-eight studies were reviewed, and five key passenger benefits were identified. The second part includes a more detailed review of prior studies conducted specifically in urban heavy rail systems (six in total), which are most likely to be applicable to the New York City Subway.

The results of the first part of the literature review suggest that the five most common impacts associated with providing RTI to passengers pertain to (1) decreased wait times, (2) reductions in overall travel time due to changes in route choice, and (3) increased use of transit. RTI may also be associated with (4) increased satisfaction with transit service and (5) increases in the perception of personal security when riding transit. The prior studies of urban heavy rail systems reveal that the most likely passenger impacts are decreased wait times (three of six studies), decreases in overall travel times (one study), and increased transit use (three studies). Therefore, it is recommended that future research focus on these three areas to evaluate the impacts of RTI on New York City Subway passengers.

## Introduction

It has become increasingly common for transit operators to provide real-time information (RTI) to passengers about the location or predicted arrival times of transit vehicles. One example is the Metropolitan Transportation Authority (MTA) in New York; over the past decade, the MTA has made RTI available for most of the New York City Subway (MTA, 2010; MTA, 2017). As this industry practice has increased, the body of literature evaluating the passenger impacts of this new information source has also grown, which presents an opportunity to synthesize findings. Synthesizing initial trends is particularly important for transit providers who want to understand how RTI may be impacting their passengers, such as the MTA in New York City. Subsequently, this study aims to conduct a literature review of prior studies evaluating the passenger impacts of RTI, and the findings are discussed in the context of the New York City Subway to identify important areas for future research.

This report proceeds as follows. First, background information on important terminology is presented. Then, the methodology used to conduct the literature review is described. After this, the key findings from the literature review are presented, and finally, the results are discussed in the context of New York City.

# **Terminology**

This section provides background information on key terminology used in this report. Real-time information (RTI), real-time passenger information (RTPI), real-time transit information (RTTI), and advanced passenger information systems (APIS) are all commonly used acronyms in the prior literature; for this report, the term real-time information (RTI) is used.

Real-time information is the tracking of transit vehicles by automatic vehicle location systems or track circuit systems. Vehicle location information is typically sent to a central server, which can be located at the transit provider. Then, it is disseminated to riders, either directly or through application programming interfaces (API) used by third party software developers (Brakewood and Watkins, 2018).

RTI can be disseminated to riders via different types of media. RTI is frequently provided via stationary *signage* located at bus stops or in train stations. Variable message signs, such as the one shown in Figure 1, display the location of the transit vehicle or a predicted arrival time, and these are referred to as *countdown clocks* in New York City. Some transit providers, including the MTA's New York City Transit, also display this information on touchscreen kiosks (Kamga, et al., 2013).



Figure 1: Real-time information signage in a New York City Transit station

Over the last few years, RTI is increasingly provided to passengers' *personal devices*, including websites accessed on computers or mobile phones, text messages to cell phones, and smartphone applications, such as the MTA's "Subway Time" app shown in Figure 2.

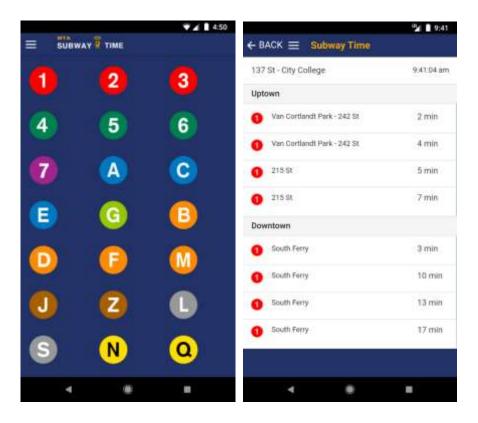


Figure 2: MTA's "Subway Time" app home screen (left) & real-time information screen (right)

Image source: Metropolitan Transportation Authority, 2018

There are a few noteworthy differences between RTI and other forms of transit information. *Schedules* refer to the predefined time and location of vehicles published by the transit operator. When vehicles are running on-time, RTI and schedule information are the same; when transit vehicles are not, RTI is a more accurate method of tracking the location of transit vehicles. Another form of transit information is *service alerts*, which provide notifications about major delays. Although service alerts are often provided to passengers in real-time as incidents occur, they can include varying levels of information (Brakewood and Watkins, 2018). This report focuses specifically on real-time information; prior studies about schedules or service alerts are not considered in the following literature review.

# Methodology

This section describes the methodology for conducting the literature review, including the databases that were searched and the inclusion criteria. Then, a framework for categorizing the passenger impacts of RTI is presented.

#### **Databases Searched**

Two scholarly databases were used in the search process. The first database was the Transport Research International Documentation, known as *TRID*. TRID is maintained by the Transportation Research Board (TRB) of the US National Academies and covers all transportation disciplines. This database was selected because it contains nearly 1.2 million records of published research and is considered to be "the world's largest and most comprehensive bibliographic resource on transportation research information" (National Academics of Science, Engineering, and Medicine, 2018). The second database that was searched is *Google Scholar*, which "provides a simple way to broadly search for scholarly literature" (Google, 2018). Google Scholar was used to broaden the scope beyond transportation-specific databases. More details on the search process can be found in Brakewood and Watkins (2018).

#### **Inclusion Criteria**

To be included in this literature review, RTI studies needed to meet four criteria. First, only studies published in English were included. Second, only studies published since 1995 were included because RTI has only become widely available in the transit industry in the last two decades. Third, the research results must be published in peer-reviewed journals or conference proceedings; technical reports for which peer review status was unknown were excluded from

this review. Last, only studies specifically evaluating the passenger benefits of RTI were considered (Brakewood and Watkins, 2018).

## **Primary Impacts of RTI on Passengers**

This report categorizes RTI impacts into five major categories for which multiple studies have been undertaken. Three of the five fall under behavioral outcomes associated with RTI: increased transit use, decreased travel time, and decreased wait time. RTI could impact levels of transit use by impacting a passenger's decision to make a trip or by impacting a passenger's choice to take transit versus another mode. RTI could also influence which route a passenger chooses, and this would impact their overall *travel time*, as different paths typically have different travel times. Similarly, RTI could play a role in the decision of which stop a passenger boards a transit vehicle or what time they choose to leave their point of origin, and both could impact the traveler's total travel time or their wait time. Because the prior literature often divides transit travel time into wait time and in-vehicle travel time components, the wait time component is presented separately in this review. This report also includes two factors related to passenger feelings and perceptions for which multiple studies have been conducted: increased satisfaction with transit and increases in the *perception of security*. Finally, it should be noted that a small number of studies have also identified other potential passenger impacts of RTI (such as increased transfers between modes). However, due to the limited number of studies on other impacts, they are not reviewed in here; interested readers are referred to Brakewood and Watkins (2018) for a brief summary of other impacts.

# **Findings from the Literature Review**

This section presents the key findings from the literature review. First, all studies pertaining to the passenger impacts of real-time information are summarized. Then, more detailed summaries of studies specifically pertaining to urban heavy rail systems (i.e., subway or metro systems) are presented since these findings are most likely to be applicable to the New York City Subway.

## **Summary of All Studies**

In total, twenty-eight studies were identified that pertain to the five primary passenger impacts of RTI, and these studies are summarized in Table 1. The first column of Table 1 shows the authors' names and the year of publication; the second column displays the location where the study was conducted; and the third column identifies the transit modes evaluated. The five rightmost columns in Table 1 summarize the results of the five primary passenger impacts of RTI. A filled circle represents a positive finding; a half-filled circle signifies a finding that is sometimes positive; an empty circle implies that the study investigated the passenger impact but the results were null, negative, or not statistically significant; and a dash means that the study did not investigate that impact (Brakewood and Watkins, 2018).

Of the twenty-eight studies, thirteen examined the wait time implications of RTI, and twelve of these studies found positive results. This implies that wait times have the most supporting evidence of the five impacts. Six of the twenty-eight studies examined travel time implications from path choice. Thirteen studies evaluated the impacts of RTI on transit use, and nine of them found positive results. Six studies examined satisfaction, and of those, only three found fully positive results. Similarly, five of the twenty-eight studies examined perceived personal security, and of those, only two found fully positive results. Satisfaction and perception of security are areas where future research could address impacts more thoroughly.

Table 1: Summary of all studies on the impacts of real-time information

#	Authors (Year)	Study Location	Modes	Wait Time	Total Travel Time	Transit Use	Satisfaction	Perceived Security
1	Brakewood, Barbeau & Watkins (2014)	Tampa, USA	Bus	•	-	0	•	•
2	Brakewood, Macfarlane & Watkins (2015)	New York City, USA	Bus	-	-	•	-	-
3	Brakewood, Rojas, Zegras, Watkins & Robin (2015)	Boston, USA	Commuter Rail	•	-	-	-	-
4	Cats, Koutsopoulos, Burghout & Toledo (2011)	Stockholm, Sweden	Subway	-	•	-	-	-
5	Cats & Gkioulou (2014)	Stockholm, Sweden	Subway, Bus, Light Rail	•	-	-	-	-
6	Chow, Block-Schachter & Hickey (2014)	Boston, USA	Heavy Rail	•	-	•	0	-
7	Dziekan & Vermeulen (2006)	The Hague, Holland	Tram	•	-	-	-	0
8	Estrada, Giesen, Mauttone, Nacelle & Segura (2015)	Rivera, Uruguay	Bus	-	•	-	-	-
9	Fan, Guthrie & Levinson (2016)	Minneapolis & St. Paul, USA	Light Rail, Commuter Rail, BRT	0	-	-	-	-
10	Ferris, Watkins & Borning (2010)	Seattle, USA	Bus	•	-	•	•	•
11	Fonzone & Schmöcker (2014)	Fictitious Network	Not Specified	-	•	-	-	-
12	Fries, Dunning & Chowdhury (2011)	Clemson University, USA	Bus	•	-	0	-	-
13	Ge, Jabbari & MacKenzie (2017)	Seattle, USA	Transit (bus, streetcar), Shared Modes (car-, bike- & ride-share)	-	-	0	0	-
14	Gooze Watkins & Borning (2013)	Seattle, USA	Bus	-	-	•	•	•
	● = positive finding; <b> =</b> some	imes positive findi	ing; ○ = negative / not signif	icant fin	ding; - = did	not consid	der	
		Adapted from B	rakewood and Watkins (2018)					

Table 1 (continued): Summary of all studies on the impacts of real-time information

#	Authors (Year)	Study Location	Modes	Wait Time	Total Travel Time	Transit Use	Satisfaction	Perceived Security
15	Hickman & Wilson (1995)	Boston, USA	Bus	-	•	-	-	-
16	Ji, Zhang, Gao & Fan (2017)	Nanjing, China	Metro, BRT, Bus	•	-	-	-	-
17	Kaplan, Monteiro, Anderson, Nielsen & Santos (2016)	Recife/Natal, Brazil & Copenhagen, Denmark	Bus, BRT, LRT (Brazil) & Metro, Local/ Suburban/ Regional Trains, Buses (Denmark)	-	-	•	-	-
18	Liu, Shi & Jian (2017)	Chengde, China	Bus	•	-	-	-	-
19	Papangelis, Nelson, Sripada & Beecroft (2016)	Rural Scotland	Bus	•	-	-	-	-
20	Politis, Papaioannou, Basbas & Dimitriadis (2010)	Thessaloniki, Greece	Bus	-	-	•	-	-
21	Reed (1995)	University of Michigan, USA	Bus	•	-	-	-	-
22	Tang & Thakuriah (2007)	Chicago, USA	Bus & Train	-	-	•	-	-
23	Tang & Thakuriah (2011)	Chicago, USA	Transit	-	-	•	-	-
24	Tang & Thakuriah (2012)	Chicago, USA	Bus	-	-	•	-	-
25	Trozzi, Gentile, Kaparias & Bell (2013)	Fictitious Network	Bus	-	•	-	-	-
26	Watkins, Ferris, Borning, Rutherford & Layton (2011)	Seattle, USA	Bus	•	-	-	-	-
27	Zargayouna, Othman, Scemama & Zeddini (2015)	Toulouse, France	Bus	-	•	-	-	-
28	Zhang, Shen & Clifton (2008)	University of Maryland, USA	Shuttle Bus	-	-	0	•	•
	● = positive finding; <b>(</b> = someti	mes positive findin	g; O = negative / not signific	cant find	ling; - = did	not consid	er	

Adapted from Brakewood and Watkins (2018)

#### **Summary of Urban Heavy Rail Studies**

Of the twenty-eight studies reviewed in the previous section, only six studies evaluated the impacts of real-time information on passengers in urban heavy rail systems (i.e., subway or metro systems). These six studies were reviewed in detail, and the results are shown in Table 2, which focuses on four key dimensions.

The first dimension shown in Table 2 is the *media* through which RTI is provided to the transit rider, and this was divided into signage or personal devices, such as smartphone applications. Most of these studies (five of six) considered RTI provided via stationary signage.

The second dimension is the *method* used in the study. The methodologies were classified into a general approach, which were either surveys of individual travelers or simulation models, and then additional details about the analysis are provided. Four of the six prior studies utilized survey-based methods, and for these, the sample size of individuals participating in the survey and the statistical method utilized were noted.

The third and fourth dimensions shown in Table 2 are the passenger *impacts* that were evaluated and the key *findings*. These six studies considered a total of four passenger impacts: wait times (three studies), total travel times (one study), transit use (three studies), and satisfaction (one study). As can be seen in Table 1 and Table 2, the only study that had a negative findings (findings that were not significant) pertained to passenger satisfaction levels, which was Chow et al., 2014. The studies of wait time, total travel time, and transit use impacts all had positive results, which suggest that these are most likely to be found in other urban heavy rail systems with RTI. However, there were a limited number of studies on each impact, particularly path choice, and therefore, future research is deemed necessary.

Table 2: Studies on the impacts of real-time information in urban heavy rail systems

Tang & Thakuriah  Cats, Koutsopoulos,	Media Signage	Survey- based method (n=1,020)	Analysis  Survey of both transit riders and non-riders; Asked if availability of RTI would increase their transit use; Bivariate probit model estimated to explore simultaneous choice of transit use and RTI use relate to	Impacts  Transit use	Findings  67% of all respondents stated that they would increase their transit use if RTI became available at stops/station; This was higher among current transit
Thakuriah  Cats, Koutsopoulos,		based method	Asked if availability of RTI would increase their transit use; Bivariate probit model estimated to explore simultaneous choice of transit use and RTI use relate to	Transit use	increase their transit use if RTI became available at stops/station; This was higher among current transit
Koutsopoulos,	Signage		demographics, automobile availability, etc.		riders (70%) compared to non-riders (60%); Bivariate probit models showed some differences based on demographics, etc.
Burghout & Toledo	& Personal Devices	Simulation model	Dynamic transit model (BusMezzo) with three components: traffic dynamics, transit operations and passenger demand; Scenarios were evaluated with different levels of RTI provision and transit operations	Total travel time	Comprehensive RTI systems have the potential to lead to shifts in path choice and travel time savings
Cats & Gkioulou	Personal Devices	Simulation model	Dynamic transit model (BusMezzo) considering RTI with varying levels of reliability	Wait time	RTI users adapt their behavior to shorten their wait times
Chow, Block- Schachter & Hickey	Signage	Survey- based method (n=4,118)	Before-after passenger surveys conducted in heavy rail stations; passengers were asked to estimate how long they expected to wait for a train and to rate the overall transit system on a scale from 1 (poor) to 5 (great); Automated fare collection system data used in a fixed effects regression model; dependent variable is the log of boardings; independent variables included fare changes, station effects, line effects and seasonal effects	Wait time, transit use, satisfaction	After RTI, passengers reduced their wait time estimates by 0.85 minutes on average; after further controlling for service disruptions, wait time estimates were reduced by 1.3 minutes on average (17% of total wait times). After RTI, passengers had a higher overall rating of the transit agency (3.46 compared to 3.41), but this was not statistically significant. The fixed effects model suggests that ridership increased by 1.7%; however, the authors said this is "preliminary".
Kaplan, Monteiro, Anderson, Nielsen & Santos	Signage & Personal Devices	Survey- based methods (n=1123)	Web-based survey of university students in two regions (Brazil and Denmark); structural equation models to explain transit use	Transit use	Results show that searching for real-time information is associated with trips at night and to unfamiliar places (non-routine transit use)
Ji, Zhang, Gao & Fan	Signage	Survey- based method (n=1031)	Survey of passengers at stops/stations asking them to self-report their wait times; video footage of passengers waiting at stops/station to capture actual wait times; structural equation model of wait times	Wait time	Results of the structural equation model suggest that RTI signage decreases the perception of wait times; shorter wait times (5 minutes) decreased 15.6%; longer wait times (10 minutes) decreased 30.6%
	Cats & Gkioulou  Chow, Block-Schachter & Hickey  Kaplan, Monteiro, Anderson, Nielsen & Santos  Ji, Zhang,	Cats & Personal Devices  Chow, Block-Schachter & Hickey  Kaplan, Monteiro, Anderson, Nielsen & Santos  Ji, Zhang, Signage  Signage & Personal Devices	Cats & Personal Devices Simulation model  Chow, Block-Schachter & Hickey Signage Method (n=4,118)  Kaplan, Monteiro, Anderson, Nielsen & Santos Signage Personal Devices Signage Methods (n=1123)  Ji, Zhang, Gao & Fan Signage Survey-based method (n=1123)	Cats & Gkioulou Devices Personal Gkioulou Devices Simulation Devices Personal Gkioulou Devices Personal Devices Personal Devices Survey- Chow, Block-Schachter & Hickey Signage Hickey Signage Figure Anderson, Nielsen & Santos  Ji, Zhang, Gao & Fan  Devices Personal Devices Simulation model Devices Signage Figure Agking Gao & Fan  Personal Devices Signage Personal Devices Signage Figure Agking Gao & Fan  Personal Devices Signage Survey-based method (n=1031)  Signage Survey-based method of otage of passengers waiting at stops/station to capture actual wait times; structural equation model of wait times	Toledo Devices  Personal Gkioulou  Devices  Simulation model  Devices  Signage  Hickey  Signage  Kaplan, Monteiro, Anderson, Nielsen & Santos  Signage  Signage  Signage  Signage  Signage  Survey-based methods Santos  Signage  Signage  Signage  Survey-based methods (n=1123)  Signage  Signage  Survey-based methods (n=1123)  Signage  Survey-based methods (n=1123)  Survey-based method (n=1031)  Signage  Survey-based methods (n=1031)  Survey-based method (n=1031)  Survey of passengers at stops/stations asking them to self-report their wait times; video footage of passengers waiting at stops/station to capture actual wait times; structural

## Discussion of New York City and Areas for Future Research

This section presents a brief discussion of how the findings from the literature review may be applicable to New York City, where real-time information has been made available for most of the subway over the past decade (MTA, 2010; MTA, 2017).

The most promising benefit for subway passengers is reduced *wait times*. In the first part of the literature review, twelve of twenty-eight studies across various transit modes found reductions in passenger wait times associated with RTI, and three of these studies were conducted in urban heavy rail systems. If future research is conducted for the New York City Subway, one important difference to evaluate is actual wait times (i.e., how long a passenger waits in a station for the train) versus perceived wait times (i.e., how long a passenger thinks s/he has been waiting) for RTI users versus non-users. One of the most cited prior studies of RTI impacts on bus riders found significant decreases in both actual and perceived wait times for RTI users compared to non-users (Watkins et al., 2011); however, this difference has not been explored in the context of urban heavy rail systems. RTI provided via smartphone apps may reduce actual wait times because a subway passenger checking an RTI app at home or at work could "time" his or her arrival to the station to meet the train; however, this impact may be limited in urban heavy rail systems due to high frequencies on many subway lines. Additionally, countdown clocks that have been installed in most subway stations are likely to reduce perceived wait times since passengers may have a better understanding of how long they are waiting when RTI signage is nearby.

A second passenger benefit identified in the literature review is reductions in *total travel time* due to changes in path choice. Six of the twenty-eight studies examined in the first part of the literature review revealed travel time impacts; however, only one of these studies was

conducted for heavy rail systems. This could be a particularly promising area for future research in a dense transit network like the New York City Subway because there are often multiple paths between origin-destination pairs. For example, a passenger choosing between a "local" train arriving at the station sooner and an "express" train arriving later may ultimately select the later arriving express train to minimize overall travel time to his or her destination station when RTI is available. Future research in urban heavy rail systems could conduct rider surveys of route choice, which would be different from the prior studies that primarily utilized simulation modelling.

Nine of the twenty-eight studies found increases in *transit use* associated with RTI, and three of these were specific to urban heavy rail systems. Therefore, future research in New York City could aim to assess this impact. Finally, there were limited prior studies pertaining to increased *satisfaction* with transit and increased *perceptions of security* when riding transit associated with RTI in urban heavy rail systems. Because these impacts were measurable in other transit modes, future research may also find positive results in heavy rail systems.

In summary, five key benefits of providing real-time information to transit passengers were identified from a comprehensive literature review (Brakewood and Watkins, 2018). Of these five impacts, the two most promising impacts for New York City Subway passengers are reductions in *wait times* – particularly perceived wait times when countdown clocks are installed in stations – and reductions in *overall travel times*, which may be possible in dense transit networks like the subway where passengers often have multiple paths between origin-destination pairs. Future research is recommended to evaluate these two impacts.

# References

- Brakewood, C., Barbeau S., & Watkins K. (2014). An experiment evaluating the impacts of real-time transit information on bus riders in Tampa, Florida. *Transportation Research Part* A: Policy and Practice, 69:409-422.
- 2. Brakewood, C., Macfarlane G., & Watkins, K. (2015). The impact of real-time information on bus ridership in New York City. *Transportation Research Part C: Emerging Technologies*, 53:59-75.
- 3. Brakewood C., Rojas F., Zegras P.C., Watkins K., & Robin J. (2015). An analysis of commuter rail real-time information in Boston. *Journal of Public Transportation*, 18(1):1-20.
- 4. Brakewood and Watkins (2018). A Literature Review of the Passenger Impacts of Real-Time Transit Information. *Transport Reviews*. DOI: 10.1080/01441647.2018.1472147.
- Cats, O., Koutsopoulos, H., Burghout, W., & Toledo, T. (2011). Effect of real-time transit information on dynamic path choice of passengers. *Transportation Research Record:* Journal of the Transportation Research Board, 2217:46-54.
- 6. Cats, O. & Gkioulou, Z. (2014). Modeling the impacts of public transport reliability and travel information on passengers' waiting-time uncertainty. *EURO Journal on Transportation and Logistics*, 1-24.
- Chow, W., Block-Schachter, D., & Hickey, S. (2014). Impacts of real-time passenger information signs in rail stations at the Massachusetts Bay Transportation Authority.
   Transportation Research Record: Journal of the Transportation Research Board, 2419:1-10.
- 8. Dziekan, K. & Vermeulen, A. (2006). Psychological effects of and design preferences for real-time information displays. *Journal of Public Transportation*, 9(1):1-19.

- 9. Estrada, M., Giesen, R., Mauttone, A., Nacelle, E., & Segura, L. (2015). Experimental evaluation of real-time information services in transit systems from the perspective of users.

  Proceedings of the Conference on Advanced Systems in Public Transport (CAPST), 1-20.
- 10. Fan, Y., Guthrie, A. & Levinson, D. (2016). Waiting time perceptions at transit stops and stations: Effects of basic amenities, gender, and security, *Transportation Research Part A:*Policy and Practice, 88:251-264.
- 11. Ferris, B., Watkins K., & Borning A. (2010). OneBusAway: Results from providing real-time arrival information for public transit. Proceedings of CHI, 1807-1816.
- 12. Fonzone, A. & Schmöcker, J-D. (2014). Effects of transit real-time information usage strategies. *Transportation Research Record: Journal of the Transportation Research Board*, 2417:121-129.
- 13. Fries, R., Dunning, A. & Chowdhury, M. (2011). University traveler value of potential real-time transit information. *Journal of Public Transportation*, 14(2), 29-50.
- 14. Ge, Y., Jabbari, P., MacKenzie, D. & Tao, J. (2017). Effects of a public real-time multi-modal transportation information display on travel behavior and attitudes. *Journal of Public Transportation*, 20(2): 40-65.
- 15. Google (2018). About Google Scholar. https://scholar.google.com/intl/en/scholar/about.html. Accessed April 11, 2018.
- 16. Gooze, A., Watkins, K., & Borning, A. (2013). Benefits of real-time transit information and impacts of data accuracy on rider experience. *Transportation Research Record: Journal of the Transportation Research Board*, 2351:95-103.

- 17. Hickman, M. & Wilson, N.H.M. (1995). Passenger travel time and path choice implications of real-time transit information. *Transportation Research Part C: Emerging Technologies*, 3(4):211-226.
- 18. Ji, Y., Zhang, R., Gao, L., Fan, Y. (2017). Perception of transfer waiting time at stops and stations in Nanjing, China. Proceedings of the Annual Meeting of the Transportation Research Board, Washington, DC.
- 19. Kamga, C. Yazıcı, M. A., Singhal, A. (2013). Implementation of interactive transit information kiosks at New York City transit facilities: Analysis of user utilization and lessons learned, *Transportation Research Part C: Emerging Technologies*, 35:218-231.
- 20. Kaplan, S., Monteiro, M., Anderson, M., Nielsen, O. & Dos Santos, E. (2017). The role of information systems in non-routine transit use of university students: Evidence from Brazil and Denmark, *Transportation Research Part A: Policy and Practice*, 95:34-48.
- 21. Liu, Y., Shi, J., Jian, M. (2017). Understanding visitors' responses to intelligent transportation system in a tourist city with a mixed ranked logit model, *Journal of Advanced Transportation*, Volume 2017.
- 22. Metropolitan Transportation Authority (MTA). (2010). "Countdown Clocks" Continue to Pop Up on Subway Platforms. Press Release from June 16, 2010. Accessed on May 18, 2018. Available at: http://www.mta.info/news/2010/06/16/countdown-clocks-continue-pop-subway-platforms/
- 23. Metropolitan Transportation Authority (MTA). (2017). Real-Time Train Arrival Information Now Available for Four More Subway Lines. Press Release from November 30, 2017. Accessed on May 18, 2018. Available at: http://www.mta.info/press-release/nyc-transit/real-time-train-arrival-information-now-available-four-more-subway-lines/

- Metropolitan Transportation Authority (MTA). (2018). Subway Time. Accessed on May 18,
   Available at: http://subwaytime.mta.info/
- 25. National Academies of Sciences, Engineering, and Medicine (2018). About TRID. http://www.trb.org/InformationServices/AboutTRID.aspx. Accessed April 11, 2018.
- 26. Papangelis, K., Nelson, J. D., Sripada, S., & Beecroft, M. (2016). The effects of mobile real-time information on rural passengers. *Transportation Planning and Technology*. 39(1).
- 27. Politis, I., Papaioannou, P., Basbas, S., & Dimitriadis, N. (2010). Evaluation of a bus passenger information system from the users' point of view in the city of Thessaloniki, Greece. *Research in Transportation Economics*; 29(1):249-255.
- 28. Reed, T. (1995). Reduction in the burden of waiting for public transit due to real-time schedule information: A conjoint analysis study. IEEE; 83-89.
- 29. Tang, L. & Thakuriah, P. (2007). Relationship of attitudes towards road and transit capital investments and propensity to ride transit given traveler information. Proceedings of the Annual Meeting of the Transportation Research Board, Washington, DC.
- 30. Tang, L. & Thakuriah, P. (2011). Will psychological effects of real-time transit information systems lead to ridership gain? *Transportation Research Record: Journal of the Transportation Research Board*, 2216:67-74.
- 31. Tang, L. & Thakuriah, P. (2012). Ridership effects of real-time bus information system: A case study in the city of Chicago. *Transportation Research Part C: Emerging Technologies*, 22:146-161.
- 32. Trozzi, V., Gentile, G., Kaparias, I. & Bell, M. (2013). Route choice model and algorithm for dynamic assignment in overcrowded bus networks with real-time information at stops.

  Proceedings of the Annual Meeting of the Transportation Research Board, Washington, DC.

- 33. Watkins, K., Ferris, B., Borning, A., Rutherford, G.S., & Layton, D. (2011). Where is my bus? Impact of mobile real-time information on the perceived and actual wait time of transit riders. *Transportation Research Part A: Policy and Practice*, 45(8):839-848.
- 34. Zargayouna, M., Othman, A., Scemama, G. & Zeddini, B. (2015). Impact of travelers information level on disturbed transit networks: a multiagent simulation. Proceedings of IEEE 18<sup>th</sup> International Conference on Intelligent Transportation Systems.
- 35. Zhang, F., Shen, Q., & Clifton. (2008). Examination of traveler responses to real-time information about bus arrival using panel data. *Transportation Research Record: Journal of the Transportation Research Board*, 2082:107-115.

