



Centre for Research on Settlements and Urbanism

Journal of Settlements and Spatial Planning

Journal homepage: <http://jssp.reviste.ubbcluj.ro>



# Urban Traffic Management under Heavy Rainfalls – A Multi-Criteria Scientometric Study

**Reza MEHDIZADEH ANVIGH<sup>1</sup>, José FIGUEIREDO SILVA<sup>2</sup>, Joaquim MACEDO<sup>1</sup>**

*\* Corresponding author*

<sup>1</sup> *University of Aveiro, Department of Civil Engineering, RISCO, Aveiro, PORTUGAL*

<sup>2</sup> *University of Aveiro, Department of Environment and Planning, Aveiro, PORTUGAL*

*E-mail: mehdizadeh@ua.pt, jfs@ua.pt, jmacedo@ua.pt*

DOI: 10.24193/JSSPSI.2020.6.08

<https://doi.org/10.24193/JSSPSI.2020.6.08>

**Keywords:** *traffic management, heavy rainfall, urban traffic, scientometry, Multi-Criteria Analysis*

## ABSTRACT

The efficient management of the urban traffic, especially under heavy rainfalls, is a subject of significant environmental, economic and social impact. Hence, exploring the most efficient ways to deal with such conditions is of high importance in order to prevent crisis after heavy rainfalls. In this study, a total of 4087 published papers on urban traffic management strategies, were retrieved from Web of Science (WoS) database using a set of relevant keywords and further critically analyzed. Articles in this field have started to be published since 1955 and considerably increased in number around the beginning of the 2000s. A scientometric study was performed on the achieved results considering several parameters including contributing authors, published studies and citations received. The position of the traffic management under heavy rainfalls was also identified and critically discussed, considering the existing scientific gaps to be addressed by further studies in this field. According to results, these works demonstrate a sigmoidal trend from 1955 to 2019. Also, China and the United States were identified as the leading countries in terms of the scientific output in this area. Among the journals with more published papers, "Transportation Research Record" has received the largest number of citations for the papers published on management of urban traffic. It was also noted that traffic management under heavy rainfalls is still an understudied subject. A detailed discussion on the scientific development in this field is also provided, including the potential applications of scientometry.

## 1. INTRODUCTION

In most urban areas all over the world, "traffic congestion" is considered a growing problem that needs efficient and sustainable management tools (Shrestha and Mcdonald, 2009). In this regard, enormous efforts have been made among the scientific community in order to offer the most efficient and sustainable ways to deal with traffic congestion. Traffic management is especially very important when dealing with critical conditions such as flooding by stormwater resulting in intense traffic congestion. The term 'stormwater' refers

to that part of the rainfall that runs off directly from the land surface and may include all types of pollutants collected by this water flow (Jefferies and Doménech, 2015). As stated by the European Environment Agency (2010), flooding by stormwater is among the most common and disastrous natural phenomena in Europe during rainy seasons. However, the stormwater consequences on urban activities have not yet been thoroughly studied and managed in terms of traffic management. The resulting pavement flooding may bring plenty of problems for both road users and road owners namely blockage and traffic congestion, leading

to issues such as increase in the emission of air pollutants and also noise pollution. It is clear that the risk of fatal accidents during rainy weather is higher than under normal weather circumstances regardless of whether the performance evaluation of road traffic control systems is satisfied or not (Jung et al., 2010).

Traffic management, especially when considering heavy rainfalls, can play an important role in any metropolitan city. The lack of efficient traffic management may cause serious problems such as safety issues caused by probable accidents. In this situation, a multi-criteria scientometric study can considerably help in identifying the current situation of the scientific literature in this field, pointing to the progress made and the opportunities for improvements in urban traffic management issues (Davarazar et al., 2019; Davarazar et al., 2020; Zandi et al., 2019).

A scientometric analysis refers to a study that tends to illustrate the current stage of a specific scientific field and the trends over a certain period of time, based on related literature (Mingers and Leydesdorff, 2015). Such an analysis is highly welcome so as to evaluate the development level of research. scientometric studies have been widely used in many scientific areas such as sustainability (Kamali, 2020; Olawumi and Chan, 2018), wastewater treatment (Davarazar et al., 2020; Zandi et al., 2019), gas and energy storage ((Davarazar et al., 2019), green buildings (Darko et al., 2019), among others, by analyzing the research findings using mathematical formulae and visualization approaches (Ahmad and Thaheem, 2017). In this regard, this study aims to perform a scientometric analysis on the published studies in the scientific literature on the management of urban traffic in general, and the progress made in the management of urban traffic under heavy rainfall conditions, using a multi-criteria approach. The results can be further used by researchers who tend to direct their research on the mentioned scientific area by providing a summary of science and recommendations for future studies. It is worthy to state that, to our best knowledge, there is no “scientometric analysis” on the traffic management issues in general and especially on the traffic management under heavy rainfall conditions. The results of the present study provide recommendations for efficient management of the traffic issues, especially under heavy rainfalls and to direct the future research in this regard.

This manuscript has been structured as follows: first, methodology and criteria adopted to carry out the scientometric analysis are presented, followed by results and discussions regarding the scientometric data of the areas related to traffic management, in general, and the share of traffic management studies under heavy rainfall among all the studies performed on this topic. Suggestions for future studies were also provided.

## 2. METHODOLOGY

In the present study, Thomson ISI Web of Science (WoS) database was selected among the available databases such as Elsevier, Wiley Online Library, Taylor & Francis, Springer Link, ASCE Library, Emerald, ProQuest, EBSCO, IEEE Explore in order to extract the published studies on urban traffic management, in general, and on the measures adopted to control the urban traffic under heavy rainfalls, in particular.

WoS is the most comprehensive database that has been hosting high-quality reports ensuring a high degree of scientific robustness (Olawumi and Chan, 2018). In this regard, WoS database was used to identify the published studies on the traffic management under rainfall conditions, by searching the literature using a combination of keywords including (ti=(traffic + urban) or ti=(traffic + city) or ti=(traffic + rural) or ti=(traffic + citi\*)) (ti:title) and a combination of this set with (ts=(rainfall or rain\* or drain\* or \*storm\* or runoff or \*flood\* or precipitation)) (ts:subject). The fuzzy search performed using “\*” was to cover all possible combinations for the given terms. All scientific articles retrieved were carefully screened to ensure the accuracy of the research performed.

The CiteSpace software (5.3.R4) was utilized to analyze the data obtained by searching the WoS database. Results were saved in WoS as “Marked List” and then downloaded to be processed using CiteSpace software. Various scientometric criteria were considered for the analysis in this study, including publication type, publication year, contributing countries, keywords, authors, cited authors, cited journals, scientific categories, and cited studies.

The following scientific terms were also used to interpret the scientometric results obtained by the search.

The definitions for each term are as follows:

*a). Betweenness Centrality (BC).* Betweenness Centrality qualifies the centrality of a node by indicating the extent to which it is located in the shortest line between others (Freeman, 1997). This parameter is represented as  $BC(k)$  when  $k$  refers to the node  $k$  (Eq. 1).

$$BC(k) = \sum_{i \neq j \neq k} \frac{\Delta_{ij}(k)}{\Delta_{ij}} \quad (1)$$

where:

- $\Delta_{ij}$  also refers to the number of shortest links between ending nodes  $i$  and  $j$ ;
- $\Delta_{ij}(k)$  represents the number of shortest links crossing the node  $k$ .

In case a node contains a high BC, it can be stated that it is located on a significant fraction of the shortest links, meaning that it contains lots of connections with other nodes (Sunil Kumar, Balakrishnan, and Jathavedan, 2014).

b). *Citation Burst (CB)*. According to Chen (2014) and Kleinberg (2003), “citation burst” identifies the most active area (including certain references, authors, etc.) in a specific scientific field. If there are  $n$  batches of published studies; the  $t$ th batch contains  $r_t$  relevant studies out of a total of  $d_t$ , then burst defined as:

$$CB(i, r_t, d_t) = -\ln \left[ \binom{n}{k} P_i^{r_t} (1 - P_i)^{d_t - r_t} \right] \quad (2)$$

c). *Sigma*. Sigma integrates the strength of the structural and temporal properties of a node in graphs representing the scientometric data (Chen, 2014). Sigma combines the betweenness centrality and the citation burst in order to measure the scientific novelty of a reference (Eq. 3) (Chen, 2011);

$$\text{Sigma} = (\text{BC} + 1)^{CB} \quad (3)$$

d). *Citation Counts (CC)*. Citation count indicator measures the number of citations received by a certain publication over a certain period of time. CC can be defined either for the authors, for an individual article, or for a particular journal (Leimu and Koricheva, 2005; Lindner et al., 2010).

e). *Citation Frequency (CF)*. CF is defined as the total number of citations received by a publication over a certain period of time, divided by the citation period (years) (United States Environmental Protection Agency, 2004).

f). *Clustering*. “Clustering” is utilized when the group under analysis is divided into some sub-categories with certain similarities. The strength of a cluster is rated as “#x”. Here, x may assume integer values (0, 1, 2, ... etc.), based on the similarity of data. In this regard, when data are very similar, it results in a robust cluster. The strongest cluster is identified as “cluster#0”; clusters #1, #2, ... (Aldenderfer and Blashfield, 2007).

### 3. RESULTS AND DISCUSSION

#### 3.1. Published studies analysis

The advanced search in WoS database, using the identified set of keywords, resulted in retrieving a total of 4738 studies published since the 1920s on the topic of traffic management problems. Figure 1 (a) represents the number of articles published per year and the contribution of various types of studies. As can be observed in Figure 1, the number of studies has increased considerably, especially after 2000. However, their annual number follows a sigmoidal trend indicating that there is a decreasing trend in this increasing number of published studies. It can be due to this fact that the state of the art contributions in this

regard is becoming, to some extent, more difficult. Such a trend can also be observed in some other scientific areas namely underground carbon dioxide storage, membrane bioreactors for wastewater treatment, biochar for soil amendment, etc. (Davarazar et al., 2019; Davarazar, et al., 2020; Zandi et al., 2019).

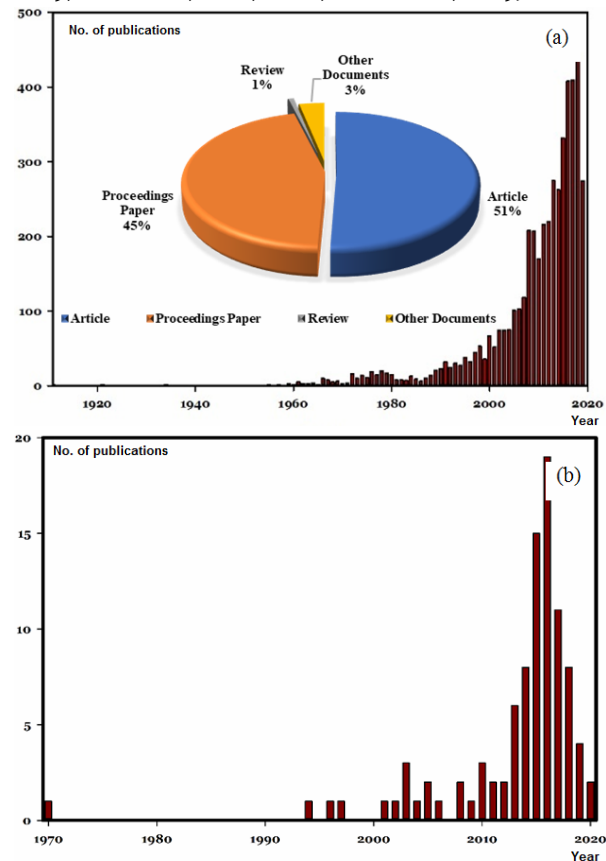


Fig. 1. The number of published studies on urban traffic management and their contribution (a), and the number of studies published on urban traffic management under heavy rainfalls (b).

In addition, Fig. 1 (a) demonstrates that among the studies published in this field, articles have the highest share, corresponding to 51% of all the published works over the studied period of time, followed by proceedings papers with 45%, demonstrating the high tendency of the researchers to present their findings in indexed scientific conferences. Despite the importance of the management of traffic under heavy rainfall conditions, the number of academic papers published in the literature on this subject using the mentioned keywords is not considerable, as illustrated in Fig. 1(b). According to data, a total of 96 published studies were selected after refining the set of identified studies based on the applied set of keywords.

#### 3.2. Keyword analysis

CiteSpace was employed to analyze the co-occurring of keywords appearing in the studies

published on urban traffic management aspects. The results are presented in Fig. 2 and Table 1. As can be observed, keywords including “model”, “air pollution”, “system”, “flow” and “network” appeared more frequently (313, 191, 179, 177, and 137 respectively) among all the keywords that represent the papers published in this scientific area. The font size in Figure 2 represents the relative importance of the nodes.

Figure 3 also demonstrates the trend of the keywords appearance in the literature on urban traffic management. As it is indicated in this figure, air pollution and relevant keywords have been the first set of keywords appeared in the literature. The figure can

also demonstrate the current trends in the scientific community, which is now focused on subjects such as deep learning, built environment, and machine learning. However, the keywords of current issues, such as management of urban traffic under heavy rainfall conditions, were not highlighted in the relevant literature. This is probably due to the fact that the number of articles on traffic management under heavy rainfall has not reached a maximum threshold; therefore relevant keywords mentioned in the related scientific studies have not had yet the opportunity to appear among the main keywords used to describe the trends in the traffic management area.

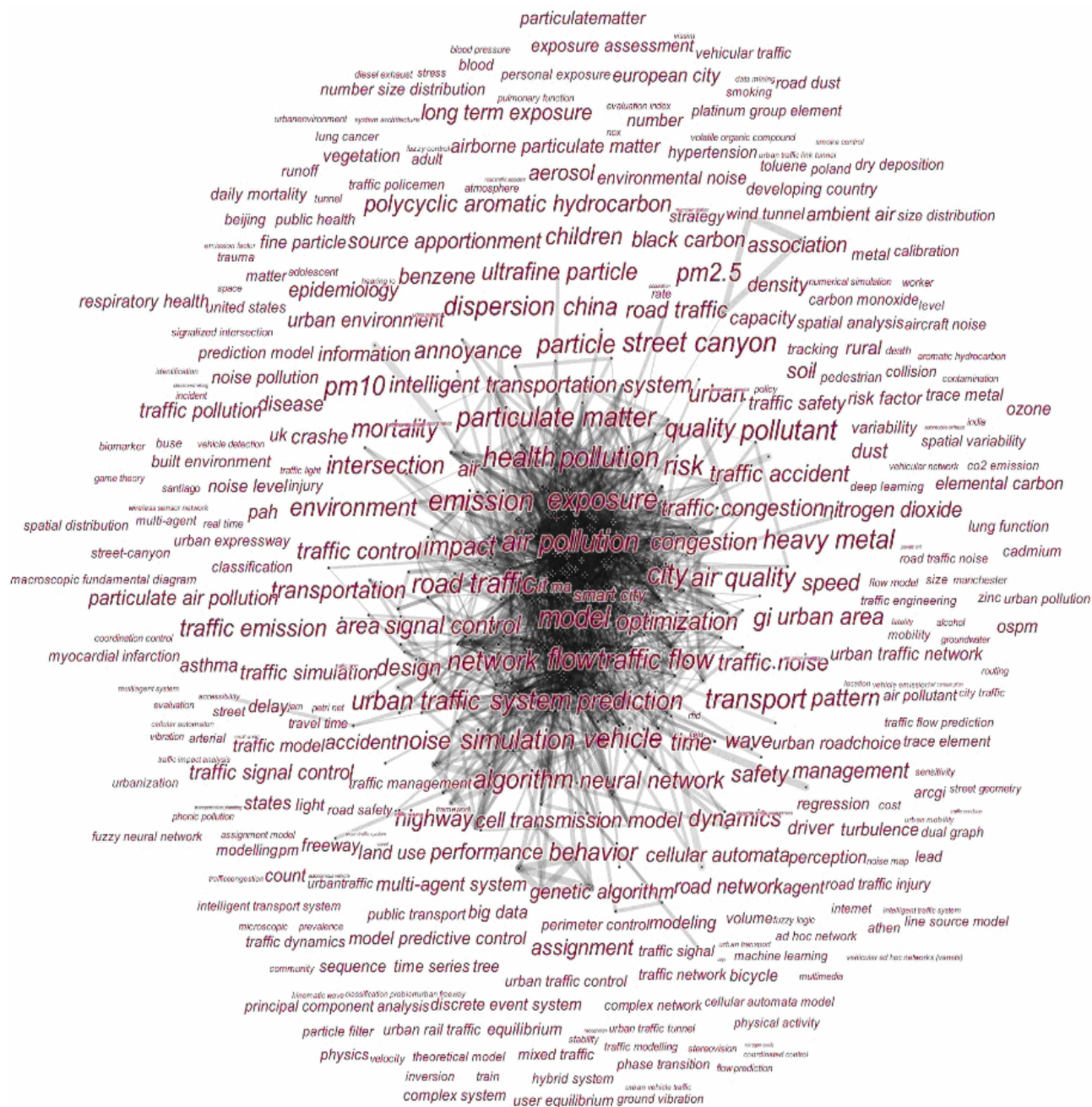


Fig. 2. A schematic representation of co-occurring analysis of the keywords appeared in scientific studies published on urban traffic management. In this figure, the centrality was neglected to represent a clearer illustration.

# Urban Traffic Management under Heavy Rainfalls – A Multi-Criteria Scientometric Study

Journal of Settlements and Spatial Planning, Special Issue, no. 6 (2020) 71-85

Multi-Criteria Spatial Decision Support Systems for Sustainable Development

Table 1. The output of keywords co-occurring analysis and respective parameters of scientometric analysis. These keywords are the most widely used to represent the scientific studies published so far on urban traffic management aspects.

Rank	Keyword	Sigma	Centrality	Burst	Frequency
1	Model	1.03	0.07	0.48	313
2	Air Pollution	1.49	0.08	0.5	191
3	System	1.28	0.08	3.37	179
4	Flow	1.12	0.11	1.05	177
5	Network	2.16	0.07	11.83	137
6	Traffic	1.38	0.06	1.87	133
7	Exposure	1.23	0.05	4.57	131
8	Simulation	1.05	0.07	0.74	129
9	Urban Traffic	1.08	0.05	1.64	109
10	Pollution	1.21	0.07	2.63	105
11	Traffic Flow	1.15	0.08	1.93	97
12	Emission	1.31	0.09	3.11	89
13	Particulate Matter	1.06	0.03	1.82	87
14	Prediction	1.56	0.08	5.91	87
15	Optimization	1.15	0.04	3.8	84
16	Algorithm	1.14	0.03	4.08	83
17	Smart City	1.05	0.00	20.52	78
18	City	1.07	0.08	0.87	67
19	Vehicle	1.04	0.07	0.63	64
20	Traffic Congestion	1.13	0.03	4.03	61
21	Congestion	1.11	0.02	4.36	61
22	Impact	1.33	0.03	9.29	61
23	Health	1.39	0.07	4.98	58
24	Road	1.18	0.06	2.63	55
25	Neural Network	1.06	0.02	2.42	52

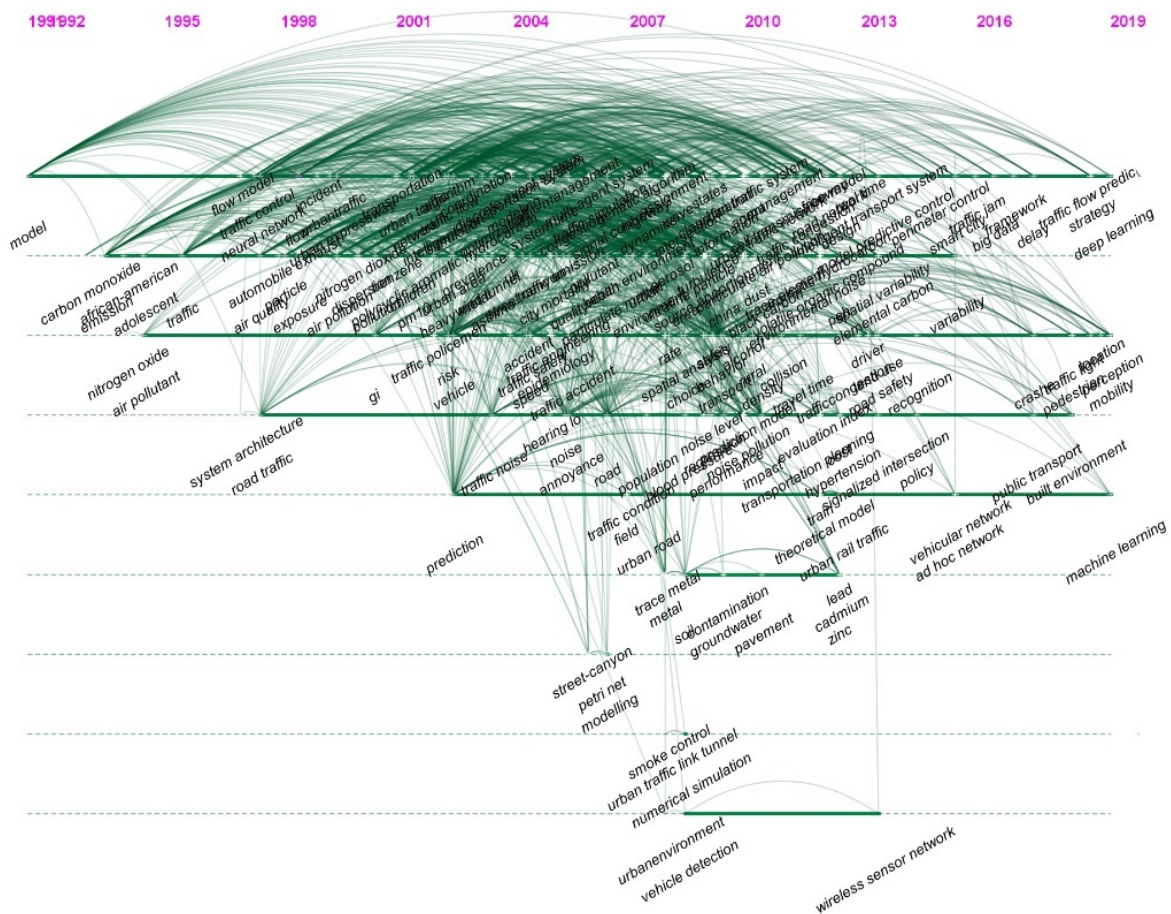


Fig. 3. The appearance of the time-line of keywords applied to represent the scientific studies published on urban traffic management.

### 3.3. Contributions

#### 3.3.1. Countries

WoS database was also used to identify the main contributing countries for the publication of scientific articles on urban traffic management. As illustrated in Fig. 4, **China** (with 1337 studies) is the most important contributing country, followed by the

**USA** (638) and England (241). The first two mentioned countries were identified as being the most important contributing countries in several scientific fields. China is a particular case that can demonstrate the success of development plans such as “special economic zones of the People's Republic of China”, and “economic and technological development zones” (Crane et al., 2018; Zhao et al., 2008).

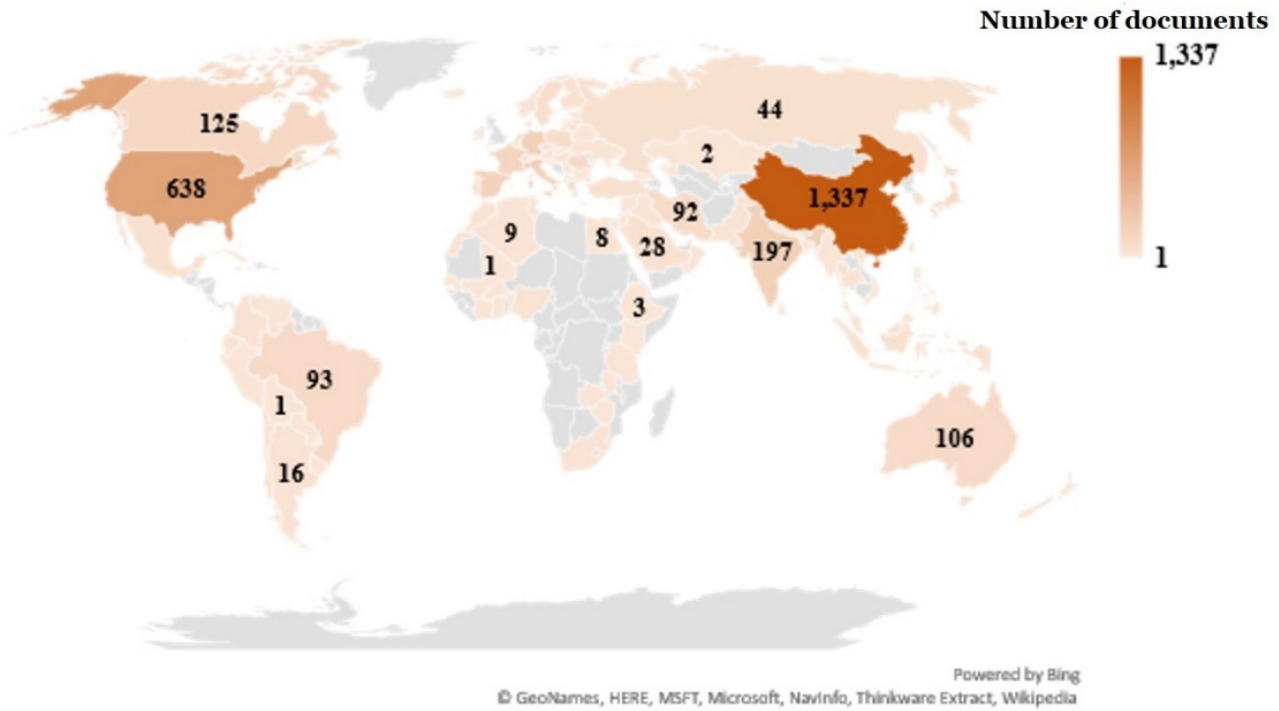


Fig. 4. Contribution of various countries worldwide in the production of studies published on urban traffic management.

#### 3.3.2. Author analysis

The contribution of authors of the published studies on urban traffic management is presented in Fig. 5 and Table 2.

Table 2. The list of contributing authors in the publication of scientific articles on urban traffic management, including the detailed information and their respective countries.

Rating	Author	Count (no.)	Contribution (%)
1	Xi YG	26	0.55
2	Zhang Y	26	0.55
3	Papageorgiou M	22	0.46
4	De Schutter B	21	0.44
5	Li Y	21	0.44
6	Lin S	20	0.42
7	Geroliminis N	19	0.40
8	Anonymous	18	0.38
9	Jia LM	18	0.38
10	Liu Y	18	0.38

The nodes in Figure 5 stand for contributing authors, while the links are to represent their

cooperation. In addition, the font size of the author's names visualizes the author's extent of contributions.

As can be observed in Fig. 5, “**Xi YG**”, and, “**Zhang Y**” both with 26 published studies, and “**Papageorgiou M**” with 22 published studies contributed as the leading authors in the publication of scientific articles on urban traffic issues. In terms of citations received by authors, scientometric parameters including CC, CB, centrality, sigma, and clustering were considered. Regarding the CC analysis, the first author is **Daganzo CF (2002)** in Cluster #3, with a citation count of 221. The second is **Papageorgiou M (2002)** in Cluster #3, with a citation count of 168, and the third is **Nagel K (1997)** in Cluster #2, with a citation count of 156. These are considered as the highlighted authors. With regard to CB analysis, author **Krajewicz D (2012)** in Cluster #3, with a burst of 15.53, author **Ma XL (2017)** in Cluster #1, with a burst of 14.92, and author **Li L (2006)** in Cluster #3, with bursts of 14.31 are identified as the highest-ranked authors. For the centrality, author **Krajewicz D (2012)** in Cluster #3, with the centrality of 0.00, author **Ma XL (2017)** in

Cluster #1, with the centrality of 0.00, and author **Li L (2006)** in Cluster #3, with the centrality of 0.00 have received the highest values. Finally, concerning sigma analysis, author **Krajzewicz D (2012)** in Cluster #3,

with a sigma of 1.00, author **Ma XL (2017)** in Cluster #1, with a sigma of 1.00, and author **Li L (2006)** in Cluster #3, with a sigma of 1.00 registered the highest values among others.

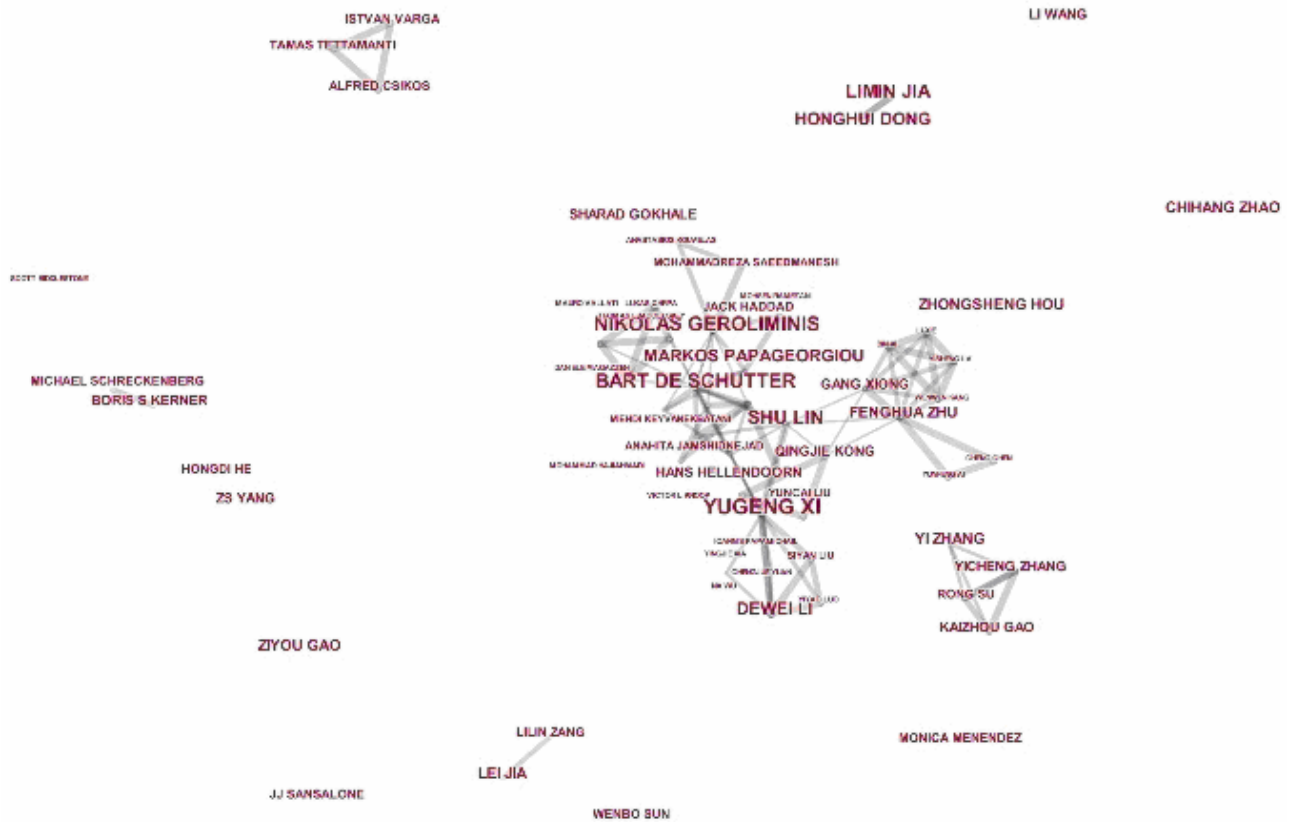


Fig. 5. A schematic to illustrate the contributing authors in the scientific literature on the traffic management issues. This figure is produced with minimum overlaps. This analysis was performed considering all the authorship team members.

Table 3. List of the most cited authors on urban traffic management and respective parameters of scientometric analysis. The parameter “year” in this table indicates the specific year in which the citation burst was initiated.

Rating	Author	Sigma	Centrality	Burst	Frequency
1	Daganzo CF	1	0	0.86	221
2	Papageorgiou M	1	0	1.51	168
3	Nagel K	1	0	3.28	156
4	Helbing D	1	0	0.78	131
5	Geroliminis N	1	0	12.72	119
6	Kerner BS	1	0	3.84	112
7	Gartner NH	1	0	0.52	106
8	Aboudolas K	1	0	9.66	97
9	Robertson DI	1	0	0.89	93
10	Lin S	1	0	13.48	92
11	Smith BL	1	0	2.61	82
12	WHO	1	0	1.57	80
13	Diakaki C	1	0	4.68	79
14	Vlahogianni EI	1	0	9.93	78
15	Lighthill MJ	1	0	4.49	68
16	Wang Y	1	0	11.92	65
17	Krajzewicz D	1	0	15.53	63
18	Yang H	1	0	1.7	62
19	Webster FV	1	0	1.29	61
20	Treiber M	1	0	7.28	59

Figure 6 and Table 3 show the corresponding data as an output of CiteSpace. In Figure 6, the size of the font represents the importance of each node. For

instance, author Daganzo CF (2002), who registered the highest CC, was indicated in Figure 6 at a larger size compared to other authors. Also, this image illustrates

all of the authors who have published scientific studies

together. In this case, authors are connected by lines.

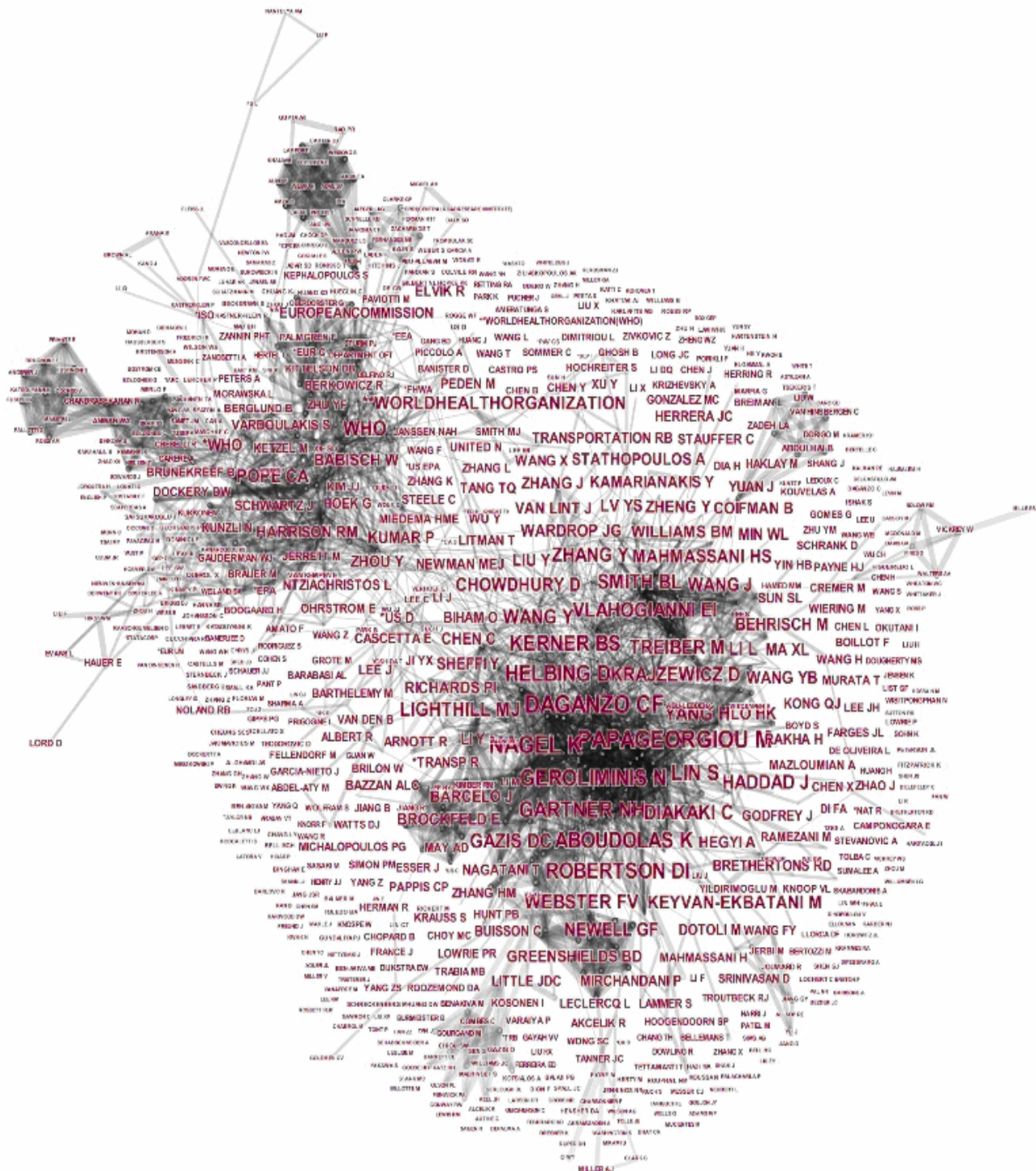


Fig. 6. A schematic illustration demonstrating the most cited authors publishing scientific studies on urban traffic management. The graph is with minimized overlaps.

### 3.3.3. Journal analysis

Citations received by journals for the publication of scientific studies on urban traffic management issues were used for the scientometric analysis. In this regard, the top-ranked item, by citation counts are: **Transport Research Record (Transport RESREC) (1995)** in Cluster #0, with a citation count of 804; **Transport Research (Transport RESC) (1998)** in Cluster #0,

with a citation count of 770; **IEEE Transactions on Information Theory (IEEE TIT) (2005)** in Cluster #0, with a citation count of 636. In terms of CB, the following can be highlighted: **Transport RESREC (1995)** in Cluster #0, with a centrality of 0.15; **Atmos E (1993)** in Cluster #1, with a centrality of 0.14; **NATURE (2000)** in Cluster #2, with a centrality of 0.13. Considering the sigma of the journals, the top-ranked are: **NATURE (2000)** in Cluster #2, with a



# Urban Traffic Management under Heavy Rainfalls – A Multi-Criteria Scientometric Study

Journal of Settlements and Spatial Planning, Special Issue, no. 6 (2020) 71-85

Multi-Criteria Spatial Decision Support Systems for Sustainable Development

sigma of 3.39; **Atmos E (1993)** in Cluster #1, with a sigma of 2.54; **THESIS (1998)** in Cluster #0, with a sigma of 2.53.

Figure 7 and Table 4 reveal the results achieved using CiteSpace. In Figure 7, the size of the nodes illustrates the importance of the item (journals).



Fig. 7. The cited journals analysis with minimum overlap obtained from CiteSpace. The analysis is based on the number of citations these journals received by publishing the studies on urban traffic management, gathered and analyzed.

Table 4. The detailed information about the journals that recorded citations by publishing the studies collected for the present scientometric study on urban traffic management.

Rating	Journal	Sigma	Centrality	Burst	Frequency
1	Transportation Research Record	1.09	0.15	0.62	804
2	Transportation Research Part C: Emerging Technologies	1	0.09		770
3	IEEE Transactions on Intelligent Transportation Systems	1.08	0.09	0.87	636
4	Transportation Research Part B Methodological	1.24	0.13	1.79	630
5	Atmospheric Environment	2.54	0.14	2.25	518
6	Science of the Total Environment	1.12	0.06	1.93	448
7	Transportation Research Part A: Policy and Practice	1.08	0.08	1	428
8	THESIS	2.53	0.03	33.6	307
9	Transportation Research Part D: Transport and Environment	1.13	0.05	2.52	285
10	Accident Analysis & Prevention	1.04	0.08	0.52	277
11	Physical Review E	1.85	0.1	1.99	263
12	Environmental Science & Technology	1.01	0.02	0.8	258
13	PHYSICA A	1.16	0.05	2.9	245
14	Journal of Transportation Engineering	1	0.05		239
15	IEEE Transactions on Vehicular Technology	1.56	0.11	4.3	235
16	Environmental Health Perspectives	1.12	0.07	1.68	229
17	Traffic Engineering and Control	1.93	0.07	0.78	227
18	Transportation Science	1.02	0.03	0.61	205
19	Lecture Notes in Computer Science	1	0.05		202
20	Environment International	1	0	0.72	187

3.3.4. Categories

“Categories” were defined to classify scientific studies published on the topic of urban traffic management using WoS database. The most important

categories were identified as “Engineering” (1839 published studies), “Transportation” (1329 published studies) and “Computer Science” (1113 published studies) (Fig. 8).



Fig. 8. Contribution of categories in the production of scientific articles on urban traffic management.

Table 5. Information regarding the categories of published studies obtained from WoS.

Rank	Categories	Burst	Frequency
1	Engineering		1839
2	Transportation	24.45	1329
3	Computer Science	3.2	1113
4	Transportation Science & Technology	5.17	1050
5	Electrical & Electronic Engineering	0.49	823
6	Environmental Sciences & Ecology	2.65	732
7	Environmental Sciences	0.64	603
8	Civil Engineering	1.74	547
9	Artificial Intelligence Computer Science	4.44	507
10	Automation & Control Systems	2.73	337
11	Theory & Methods Computer Science	2.5	323
12	Information Systems Computer Science	8.23	308
13	Environmental & Occupational Health Public	6.24	275
14	Telecommunications	0.7	261
15	Interdisciplinary Applications Computer Science	10.31	254
16	Business & Economics	1.96	181
17	Operations Research & Management Science	0.75	166
18	Environmental Engineering	3.83	165
19	Environmental Studies	2.51	151
20	Mechanical Engineering	2.77	145

**3.3.5. Cited published studies**

The most cited published studies on urban traffic management are listed in Table 6. Although several studies have been published on urban traffic management, the topic of management of urban traffic

after heavy rainfall has not yet been investigated deeply. Tables 7 and 8 reveal the most contributing countries and the most essential keywords highlighted in the literature on the management of urban traffic under heavy rainfall conditions.

Table 6. The list of the most cited studies in this field obtained from WoS.

Rating	Title	Year	Journal	Citation (No.)	Ref.
1	A regression-based method for mapping traffic-related air pollution: application and testing in four contrasting urban environments	2000	Science of the total environment	270	(Briggs et al., 2000 )
2	An analytical approximation for the macroscopic fundamental diagram of urban traffic	2008	Transportation research part b-methodological	257	(Daganzo and Geroliminis, 2008)
3	A multivariate state space approach for urban traffic flow modeling and prediction	2003	Transportation research part c-emerging technologies	257	(Stathopoulos and Karlaftis, 2003)
4	Optimizing traffic lights in a cellular automaton model for city traffic	2001	Physical review e	253	(Brockfeld et al., 2001)
5	Urban traffic flow prediction using a fuzzy-neural approach	2002	Transportation research part c-emerging technologies	234	(Yin et al.,2002)
6	A Review of Computer Vision Techniques for the Analysis of Urban Traffic	2011	Ieee transactions on intelligent transportation systems	233	(Buch et al.,2011)
7	Traffic contribution of polycyclic aromatic hydrocarbons in the center of a large city	1996	Atmospheric environment	230	(Nielsen, 1996)
8	Robust techniques for background subtraction in urban traffic video	2004	Visual communications and image processing 2004, pts 1 and 2 book series: proceedings of the society of photo-optical instrumentation engineers (spie)	225	(Cheung and Kamath, 2004)
9	VANET Routing on City Roads Using Real-Time Vehicular Traffic Information	2009	Ieee transactions on vehicular technology	219	(Nzouonta et al.,2009)
10	Urban traffic and pollutant exposure related to respiratory outcomes and atrophy in a large sample of children	2003	European respiratory journal	205	(Brogger et al., 2004)

Table 7. Contributing countries in the studies on urban traffic management under heavy rainfall conditions.

Rating	Country	Count (No.)	Contribution (%)	Rating	Country	Count (No.)	Contribution (%)
1	China	34	35.42	11	Brazil	2	2.08
2	USA	18	18.75	12	India	2	2.08
3	Canada	8	8.33	13	Iran	2	2.08
4	England	7	7.29	14	Japan	2	2.08
5	Australia	6	6.25	15	Norway	2	2.08
6	France	5	5.21	16	Pakistan	2	2.08
7	Germany	4	4.17	17	Saudi Arabia	2	2.08
8	Greece	4	4.17	18	Singapore	2	2.08
9	South Korea	4	4.17	19	Austria	1	1.04
10	New Zealand	3	3.13	20	Belgium	1	1.04

Table 8. The output of keywords co-occurring analysis and respective parameters of scientometric analysis. These keywords are the most widely used to represent scientific studies published so far on urban traffic management under heavy rainfall conditions.

Rank	Keyword	Sigma	Centrality	Burst	Frequency
1	Model	1.02	0.02	1.28	11
2	Weather	1	0	1.94	8
3	Accident	1	0	1.47	6
4	Air Pollution	1	0.01	0	6
5	Impact	1	0	1.28	4
6	Volume	1	0	1.4	4
7	Runoff	1	0	1.8	3
8	Risk	1	0	1.52	3
9	Heavy Metal	1	0	1.8	3
10	Design	1	0	1.2	2
11	Neural Network	1	0	1.35	2
12	System	1	0	1.2	2
13	Montreal	1	0	1	2
14	Road	1	0	1	2
15	Freeway	1	0	1.1	2
16	Prediction	1	0	1.1	2
17	Network	1	0	1.1	2
18	Mortality	1	0	1	2
19	Vehicle	1	0	1.35	2
20	Safety	1	0	1.1	2

Table 9. A summary of the main findings and remarks of the papers published in the literature on urban traffic and management under heavy rainfalls.

Title	Main relevant remarks	Ref.
Is city traffic damaged by torrential rain?	Two quantitative indicators of traffic percolation were used in the city traffic and according to the results: a) The traffic percolation threshold is stable against weather perturbation, and b) Some roads are seriously affected and forming local clusters under torrential rain.	(Guo et al., 2018)
Assessing the Impact of Rainfall on Traffic Operation of Urban Road Network	Rainfall had significant negative effects on traffic operation of the network. Rainy conditions produced maximum production, critical accumulation and weighted speed-at-capacity, weighted jam density and weighted free-flow speed reduction of 9.9%, 4.9%, 4%, 9.6% and 1.5%, respectively.	(Xu et al., 2013)
Impacts of high-intensity storms on urban transportation: applying traffic flow control methodologies for quantifying the effects	The analyses revealed that the prevailing weather conditions, the intensity of rainfall and the resultant flooding on February the 22nd had a significant impact on the performance of the Athens transportation network.	(Mitsakis et al., 2014)
Traffic accident severity analysis with rain-related factors using structural equation modeling – A case study of Seoul City	The results show that the level of accident severity is mutually correlated with the road factor; traffic, environment, and human factor; and rain and water depth factor on the road, in this sequence.	(Lee et al., 2018)
Evidence of traffic-related pollutant control in soil-based Sustainable Urban Drainage Systems (SUDS)	Passing through a swale or detention basin prior to entering a pond is required for the highway runoff.	(Napier et al., 2009)
Incorporating real-time traffic and weather data to explore road accident likelihood and severity in urban arterials Athanasios	The study added to the current knowledge by incorporating real-time traffic and weather data from urban arterials to investigate accident occurrence and accident severity mechanisms.	(Theofilatos, 2017)
Traffic indicators, accidents and rain: some relationships calibrated on a French urban motorway network	Significant relationship between the rain and accident and injury was discovered by extraction of the data from a one year traffic database covering 150 kilometers of two or three lanes urban motorways near the city of Marseille, in the south of France.	(Aron et al., 2015)

During heavy rainfalls, drivers prefer to keep a low speed and drive more cautiously to reduce the risk of accidents (Hussain, 2018). When the capacity of

street decreases as a result of heavy rain, it may lead to a long queue. Furthermore, the insufficiency of the existing drainage system may cause the water to be

accumulated in the depression areas and flood the pavement. This situation will increase travel time and may decrease street capacity. The inundation of roads sometimes lasts for several hours and may be prolonged to a few days if ponding water is not drained using some appropriate facilities for enhancing the drainage capacity, etc. (Youn et al., 2012).

The adoption of the most suitable way to deal with the emergencies created under heavy rainfalls is a complicated task that needs various parameters to be considered in order to reach sustainable management of the urban traffic under such conditions.

Therefore, the main concern is to identify and prioritize some measures to prevent flooding in heavy rain conditions, which would help design an effective urban management system and decrease the possible negative impact. Multi-criteria decision-making models (MCDM) are efficient methods for the identification and prioritization of such factors involved in a complicated context (Hsu, Lee, and Kreng, 2010; Jahanshahi, Kamali, Khalaj, and Khodaparast, 2019; M. Kamali et al., 2017; Kamali et al., 2015). However, there is no report in the literature on the application of these methods to deal with emergency conditions caused by heavy rainfalls. Table 9 presents a summary of the main findings and remarks of the papers published in the literature on urban traffic and management under heavy rainfalls.

#### 4. CONCLUSION

The present study is an effort to employ scientometric analysis of the published studies on the management of urban traffic in general and under heavy rainfall conditions, in particular. The study has analyzed a total of 4738 published studies, mainly articles in scientific journals (51%) to identify the crucial bibliographic information in this regard. China and the United States were identified to be the leading countries with the highest number of published studies. The results of this study indicated that the number of studies published on urban traffic management under heavy rainfall is yet small, and the related keywords do not cover the relevant scientific area of urban traffic management.

The results of the present study may not only be used in the academia, but also by the decision-makers interested in exploring the appropriate technologies for efficient urban traffic management especially under extreme conditions caused by heavy rainfalls.

#### REFERENCES

**Ahmad T., Thaheem M. J.** (2017), Developing a residential building-related social sustainability assessment framework and its implications for BIM.

Sustainable Cities and Society, 28, 1-15. DOI: <https://doi.org/10.1016/j.scs.2016.08.002>

**Aron M., Billot R., Faouzi N. E. L., Seidowsky R.** (2015), Traffic indicators, accidents and rain: some relationships calibrated on a French urban motorway network. *Transportation Research Procedia*, 10(July), 31-40. DOI: <https://doi.org/10.1016/j.trpro.2015.09.053>

**Baena-Cagnani C. E., Patiño C. M., Cuello M. N., Minervini M. C., Fernández A. M., Garip E. A., Salvucci K. D., Sancho M. L., Gómez R. M.** (1999), Prevalence and severity of asthma and wheezing in an adolescent population. *International Archives of Allergy and Immunology*, 118(2-4), 245-246. <https://doi.org/10.1159/000024087>

**Briggs D. J., Hoogh C. De, Gulliver J., Wills J., Elliott P., Kingham S., Smallbone K.** (2000), A regression-based method for mapping traffic-related air pollution: application and testing in four contrasting urban environments. *The Science of the Total Environment*, 151, 151-167.

**Brockfeld E., Barlovic R., Schadschneider A., Schreckenberg M.** (2001), Optimizing traffic lights in a cellular automaton model for city traffic. *Physical Review E - Statistical Physics, Plasmas, Fluids, and Related Interdisciplinary Topics*, 64(5), 12. DOI: <https://doi.org/10.1103/PhysRevE.64.056132>

**Brogger J., Eagan T., Eide G. E., Bakke P., Gulsvik A.** (2004), Bias in retrospective studies on trends in asthma incidence. *European Respiratory Journal*, 23(2), 281-286. DOI: <https://doi.org/10.1183/09031936.03.00041103>

**Buch N., Velastin S. A., Orwell J.** (2011), A review of computer vision techniques for the analysis of urban traffic. *IEEE Transactions on Intelligent Transportation Systems*, 12(3), 920-939. DOI: <https://doi.org/10.1109/TITS.2011.2119372>

**Chen C.** (2014), The citeSpace manual version 1.01. In *College of Computing and Informatics* (pp. 1-84).

**Chen C., Ibekwe-sanjuan F., Hou J.** (2011), The structure and dynamics of co-citation clusters: a multiple perspective co-citation analysis. *Journal of the American Society for Information Science and Technology*, 61(7), 1386-1409. DOI: <https://doi.org/10.1002/asi.21309>

**Cheung S. S., Kamath C.** (2004), Robust techniques for background subtraction in urban traffic video. *Visual Communications and Image Processing 2004*, 5308, 881. DOI: <https://doi.org/10.1117/12.526886>

**Aldenderfer M. S., Blashfield R. K.** (2007), Cluster Analysis. DOI: <https://doi.org/10.4135/9781412983648>

**Crane B., Albrecht C., Duffin K. M., Albrecht C.** (2018), China's special economic zones: An analysis of policy to reduce regional disparities. *Regional Studies, Regional Science*, 5, 98-107. DOI: <https://doi.org/10.1080/21681376.2018.1430612>

**Daganzo C. F., Geroliminis N.** (2008), An analytical approximation for the macroscopic

fundamental diagram of urban traffic. *Transportation Research Part B: Methodological*, 42(9), 771–781. DOI: <https://doi.org/10.1016/j.trb.2008.06.008>

**Darko A., Chan A. P. C., Huo X., Owusu-Manu D. G.** (2019), A scientometric analysis and visualization of global green building research. *Building and Environment*, 149(December 2018), 501–511. DOI: <https://doi.org/10.1016/j.buildenv.2018.12.059>

**Davarazar M., Jahanianfard D., Sheikhnejad Y., Nemati B., Mostafaie A., Zandi S., Khalaj M., Kamali M., Aminabhavi T. M.** (2019), Underground carbon dioxide sequestration for climate change mitigation – A scientometric study. *Journal of CO2 Utilization*, 33(May), 179–188. DOI: <https://doi.org/10.1016/j.jcou.2019.05.022>

**Davarazar M., Mostafaie A., Jahanianfard D., Davarazar P., Aminabhavi T. M.** (2020), Treatment technologies for pharmaceutical effluents-A scientometric study. *Journal of Environmental Management*, 254, 109800. DOI: <https://doi.org/10.1016/j.jenvman.2019.109800>

**Davarazar M., Mostafaie A., Jahanianfard D., Davarazar P., Ghiasi S. A. B., Gorchich M., Nemati M., Kamali M., Aminabhavi T. M.** (2020), Treatment technologies for pharmaceutical effluents-A scientometric study. *Journal of Environmental Management*, 254 (January), 109800. DOI: <https://doi.org/10.1016/j.jenvman.2019.109800>

**European Environment Agency** (2010), Mapping the impacts of natural hazards and technological accidents in Europe An overview of the last decade. <https://doi.org/10.2800/62638>

**Freeman L. C.** (1977), A Set of Measures of Centrality Based on Betweenness. *Sociometry*, 40(1), 35–41. DOI: <https://doi.org/10.2307/3033543>

**Guo S., Wu R., Tong Q., Zeng G., Yang J., Chen L., Zhu T., Lv W., Li D.** (2018), Is city traffic damaged by torrential rain? *Physica A: Statistical Mechanics and Its Applications*, 503(August 2017), 1073–1080. DOI: <https://doi.org/10.1016/j.physa.2018.08.044>

**Hsu Y. L., Lee C. H., Kreng V. B.** (2010), The application of Fuzzy Delphi Method and Fuzzy AHP in lubricant regenerative technology selection. *Expert Systems with Applications*, 37(1), 419–425. DOI: <https://doi.org/10.1016/j.eswa.2009.05.068>

**Hussain E.** (2018), Modeling the effects of rainfall on vehicular traffic. *Journal of Modern Transportation*, 26(2), 133–146. DOI: <https://doi.org/10.1007/s40534-018-0155-0>

**Jahanshahi A., Kamali M., Khalaj M., Khodaparast Z.** (2019), Delphi-based prioritization of economic criteria for development of wave and tidal energy technologies. *Energy*, 167, 819–827. DOI: <https://doi.org/10.1016/j.energy.2018.11.040>

**Jefferies C., Doménech I. A.** (2015), Report on Stormwater Management. Retrieved from <https://www.iiama.upv.es/iiama/src/elementos/Proyectos/e2storme>

[d/D.3B.01 Report on stormwater management.pdf](https://www.iiama.upv.es/iiama/src/elementos/Proyectos/e2storme)

**Jung S., Qin X., Noyce D. A.** (2010), Rainfall effect on single-vehicle crash severities using polychotomous response models. *Accident Analysis and Prevention*, 42(1), 213–224. DOI: <https://doi.org/10.1016/j.aap.2009.07.020>

**Kamali M., Alesheikh A. A., Alavi Borazjani S. A., Jahanshahi A., Khodaparast Z., Khalaj M.** (2017), Delphi-AHP and weighted index Overlay-GIS approaches for industrial site selection case study: Large extractive industrial units in Iran. *Journal of Settlements and Spatial Planning*, 8(2). DOI: <https://doi.org/10.24193/JSSP.2017.2.03>

**Kamali, M.** (2020), Guest editorial: an opinion on multi-criteria decision-making analysis for sustainability-based spatial planning practices. Time to improve? *Journal of Settlements and Spatial Planning*, In press, 1–3. DOI: <https://doi.org/https://doi.org/10.24193/JSSPSI.2020.6.01K>

**Kamali M., Alesheikh A. A., Khodaparast Z., Hosseiniakani S. M. S., Alavi Borazjani S. A.** (2015), Application of Delphi-AHP and Fuzzy-GIS approaches for site selection of large extractive industrial units in Iran. *Journal of Settlements and Spatial Planning*, 6, 1–7. DOI: <https://doi.org/10.24193/JSSP.2017.2.03>

**Kleinberg, J. O. N.** (2003), Bursty and Hierarchical Structure in Streams. *Proceedings of the 8th ACM SIGKDD International Conference on Knowledge Discovery and Data Mining*, 373–397. DOI: <https://doi.org/https://doi.org/10.1023/A:1024940629314>

**Lee J., Chae J., Yoon T., Yang H.** (2018), Traffic accident severity analysis with rain-related factors using structural equation modeling – A case study of Seoul City. *Accident Analysis and Prevention*, 112(December 2017), 1–10. DOI: <https://doi.org/10.1016/j.aap.2017.12.013>

**Leimu R., Koricheva J.** (2005), What determines the citation frequency of ecological papers? *Trends in Ecology and Evolution*, 20(1), 28–32. DOI: <https://doi.org/10.1016/j.tree.2004.10.010>

**Lindner N. M., Hawkins C. B., Joy-gaba J., Tenney E. R.** (2010), Cumulative and career-stage impact of social-personality psychology programs and their members. *Personality and Social Psychology Bulletin*, (36), 1283–1300. DOI: [10.1177/0146167210378111](https://doi.org/10.1177/0146167210378111)

**Mingers J., Leydesdorff L.** (2015), A review of theory and practice in scientometrics. *European Journal of Operational Research*, 246, 1–19. DOI: <https://doi.org/10.1016/j.ejor.2015.04.002>

**Mitsakis E., Stamos I., Diakakis M., Salanova Grau J. M.** (2014), Impacts of high-intensity storms on urban transportation: applying traffic flow control methodologies for quantifying the effects. *International Journal of Environmental Science and Technology*,

11(8), 2145–2154. DOI: <https://doi.org/10.1007/s13762-014-0573-4>

**Napier F., Jefferies C., Heal K. V., Fogg P., Arcy B. J. D., Clarke R.** (2009), Evidence of traffic-related pollutant control in soil-based Sustainable Urban Drainage Systems (SUDS). *Water Science and Technology*, 60(1), 221–230. DOI: <https://doi.org/10.2166/wst.2009.326>

**Nielsen T.** (1996), Traffic contribution of polycyclic aromatic hydrocarbons in the center of a large city. *Atmospheric Environment*, 30(20), 3481–3490. DOI: [https://doi.org/10.1016/1352-2310\(96\)00096-9](https://doi.org/10.1016/1352-2310(96)00096-9)

**Nzouonta J., Rajgure N., Wang G., Borcea C.** (2009), VANET routing on city roads using real-time vehicular traffic information. *IEEE Transactions on Vehicular Technology*, 58(7), 3609–3626. DOI: <https://doi.org/10.1109/TVT.2009.2014455>

**Olawumi T. O., Chan D. W. M.** (2018), A scientometric review of global research on sustainability and sustainable development. *Journal of Cleaner Production*, 183, 231–250. DOI: <https://doi.org/10.1016/j.jclepro.2018.02.162>

**Sunil Kumar R., Balakrishnan K., Jathavedan M.** (2014), Betweenness Centrality in Some Classes of Graphs. arXiv:1403.4701 [math.CO].

**Hounsell N. B., Shrestha B. P., Piao J., McDonald M.** (2009), Review of urban traffic management and the impacts of new vehicle technologies. *IET Intell. Transp. Syst.*, Vol. 3, 419–428. DOI: <https://doi.org/10.1049/iet-its.2009.0046>

**Stathopoulos A., Karlaftis M. G.** (2003), A multivariate state space approach for urban traffic flow modeling and prediction. *Transportation Research Part C: Emerging Technologies*, 11(2), 121–135. [https://doi.org/10.1016/S0968-090X\(03\)00004-4](https://doi.org/10.1016/S0968-090X(03)00004-4)

**Theofilatos A.** (2017), Incorporating real-time traffic and weather data to explore road accident likelihood and severity in urban arterials. *Journal of Safety Research*, 61, 9–21. DOI: <https://doi.org/10.1016/j.jsr.2017.02.003>

**United States Environmental Protection Agency** (2004), *Bibliometrics Analysis for TSE Grant Publications*.

**Xu F., He Z., Sha Z., Zhuang L., Sun W.** (2013), Assessing the Impact of Rainfall on Traffic Operation of Urban Road Network. *Procedia - Social and Behavioral Sciences*, 96(Cictp), 82–89. DOI: <https://doi.org/10.1016/j.sbspro.2013.08.012>

**Yin H., Wong S. C., Xu J., Wong C. K.** (2002), Urban traffic flow prediction using a fuzzy-neural approach. *Transportation Research Part C: Emerging Technologies*, 10(2), 85–98. [https://doi.org/10.1016/S0968-090X\(01\)00004-3](https://doi.org/10.1016/S0968-090X(01)00004-3)

**Youn S., Chung E., Gu W., Hyun J.** (2012), Resources, Conservation and Recycling Probabilistic estimation of the storage capacity of a rainwater harvesting system considering climate change. “Resources, Conservation & Recycling,” 65, 136–144. DOI: <https://doi.org/10.1016/j.resconrec.2012.05.005>

**Zandi S., Nemati B., Jahanianfard D., Davarazar M., Sheikhejad Y., Mostafaie A., Kamali M., Aminabhavi T. M.** (2019), Industrial biowastes treatment using membrane bioreactors (MBRs) -a scientometric study. *Journal of Environmental Management*, 247, 462–473. DOI: <https://doi.org/10.1016/j.jenvman.2019.06.066>

**Zhao Y., Shang J., Chen C.** (2008), Simulation and evaluation on the eco-industrial system of Changchun economic and technological development zone , China. *Environ Monit Assess*, 139, 339–349. DOI: <https://doi.org/10.1007/s10661-007-9840-x>