



Latitude Longitude Latitude Longitude 45°48° 55°29" N 15° 58°21" A 14°48° 8°42" N 15° 58°21" A 15°58°21" A 15°58°2

EARTHQUAKE RECONNAISSANCE USING SOCIAL MEDIA (SM) & CROWDSOURCING PLATFORMS

LEARNING FROM EARTHQUAKES (LfE): BUILDING RESILIENT COMMUNITIES THROUGH EARTHQUAKE RECONNAISSANCE, RESPONSE AND RECOVERY

Tools and methods for post-disaster reconnaissance missions

45°48' 38.08" N

15° 58' 48 26

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Damages location (Proxy indicator

The 20nd October 2021

Engineering and Physical Sciences Research Council (EPSRC) Grant no. EP/P025951



OUTLINE



- Motivation
- Background
- Methods: technical details
 - 2020 Zagreb earthquake
 - 2020 Aegean earthquake
- Results
 - 2020 Zagreb earthquake
 - 2020 Aegean earthquake
- Post-disaster recovery
- Limitations
- Future developments



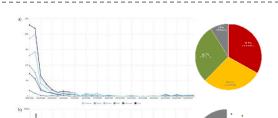


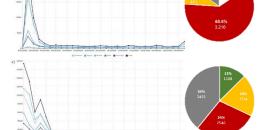














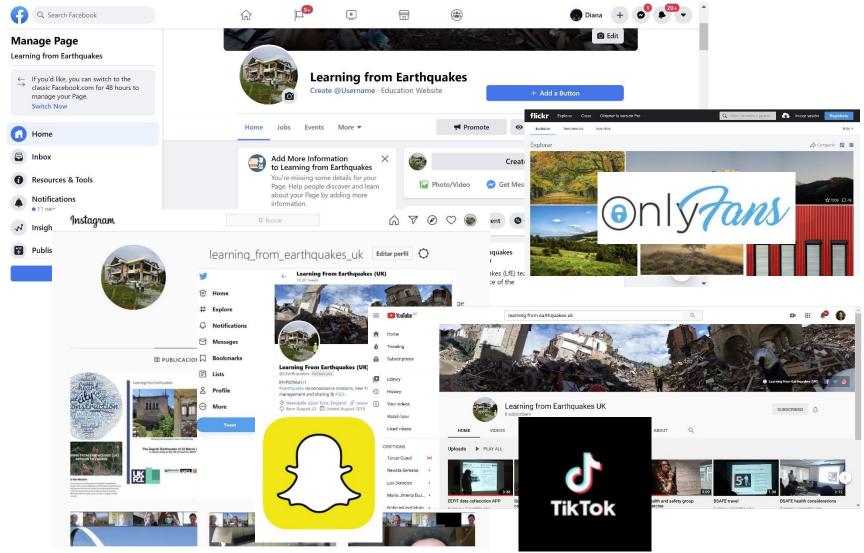


9:43 PM · Jan 14, 2020

♥ 117 ♀ 27 ⚠ Share this Tweet

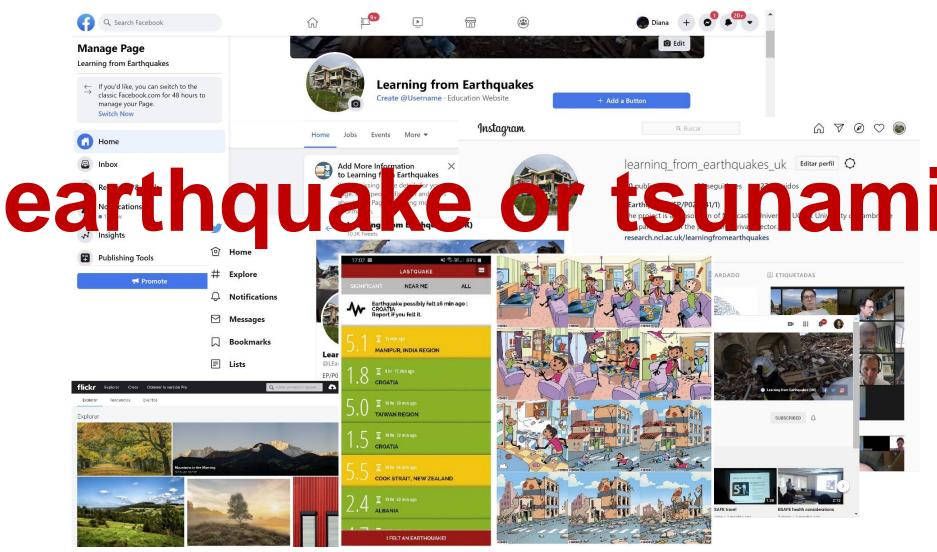






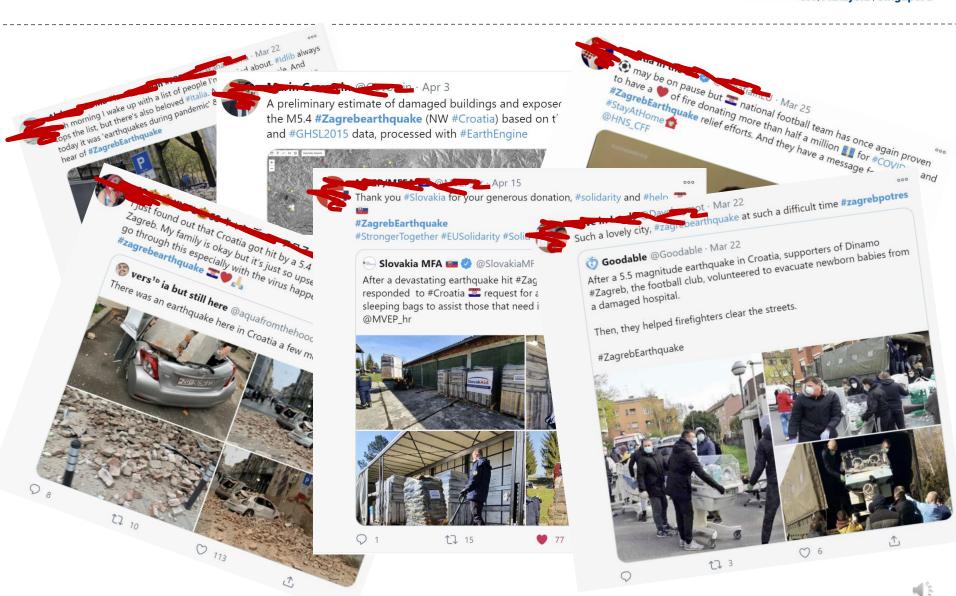
















DATA DRIVEN DECISIONS

Emergency response



Firefighters assist a person affected by the earthquake in Zagreb, Croatia https://www.bibliatodo.com/En/christian-news/strong-earthquake-shakes-croatia-amid-quarantine-we-face-two-crises/

PDNA



Temporary shelter in Bogota DC, Colombia. IDIGER

Earthquake reconnaissance



Christchurch, New Zealand

Post-disaster recovery



L'Aquila, Italy. Photo: Dr Diana Contreras

Preparedness



Search and Rescue (SAR) training. IDIGER



Background



SOCIAL MEDIA & CROWDSOURCING PLATFORMS Image

Text



The house really moved. Feel this one was the strongest since the big one. I felt very light. It was pretty violent, but it was short. It woke me up from my sleep. I was afraid it would continue. I erecte the triangle of life next to heard if it is b use of the earthquake. Everything ratued for a few seconds. The cracks in our walls are getting bigger... Yep felt that one too. Short but strong 10:34 am Kuşadası - kadinlar Sea Mah. Happened 2 times. It woke me up. It took about 7 seconds...

Background





Sentiment Analysis (SA)

Polarity

Positive



Neutral



Negative



Unrelated

Topic Analysis

Building damage
Geotechnical effects
Lifelines affected
Injuries-casualties
Emergency response
Solidarity messages
Preparedness
Seismic information
Intensity
Early recovery
Intensity



Methods: 2020 Zagreb earthquake



Hashtags Identification



Hashtag Selection



Data Collection

#Croatia #croatia

#croatiaearthquake

#CroatiaEarthquake #CroatiaFullofLife

#CroatiaQuake

#disaster

#eartquakecroatia #earthquakeinzagreb #gradzagreb #hrvatskapotres

#igerscroatia

#LoveZagreb #potres #potres2020 #potreszagreb #potresZg #PrayforZagreb

lauako

#solidarnostshrvatskom

#Terremoto

#volimhrvatsku

#Zagreb

#Zagabria #ZagrehEarthquake

#zagrebearthquake #zagrebpotres

#ZagrebQuake

#zagrebquake #ZagrebStrong #zagrebstrong #zagrebstaystrong

#Croatia #croatiaearthquake #CroatiaFullofLife #CroatiaQuake #eartquakecroatia #earthquakeinzagreb #hrvatskapotres #LoveZagreb #potres #potreszagreb #potresZg #PrayforZagreb #Zagreb #ZagrebEarthquake #zagrebearthquake #zagrebpotres #ZagrebQuake #zagrebquake #ZagrebStrong #zagrebstrong #zagrebstaystrong



Methods: 2020 Zagreb earthquake



Hashtags Identification



Hashtag Selection

#Croatia

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#potres

#potreszagreb

#potresZq

#PrayforZagreb

#Zagreb

#ZagrebEarthquake

#zagrebearthquake

#zagrebpotres

#ZagrebQuake

#zagrebquake #ZagrebStrong

#zagrebstrong

#zagrebstaystrong



Data Collection



59,246 tweets 58,501 tweets

5852 tweets 3988 Tweets



31,403 intensity reports

45 intensity resports



Data extraction

.xls., .jpg, .pdf,.doc

#Croatia #croatia

#croatiaearthquake

#CroatiaEarthquake

#CroatiaFullofLife #CroatiaQuake

#disaster

#eartquakecroatia #earthquakeinzagreb #gradzagreb #hrvatskapotres #igerscroatia

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#potresZg #PrayforZagreb

#solidarnostshrvatskom

#Terremote

#volimhrvatsku

#Zagreb

#Zagabria

#7agrobEarthquako #zagrebearthquake #zagrebpotres

#ZaarebQuake

#zagrebquake #ZagrebStrong #zagrebstrong #zagrebstaystrong

Data processing

Translation to English Eliminate Twitter handles, emoticons and hyperlinks



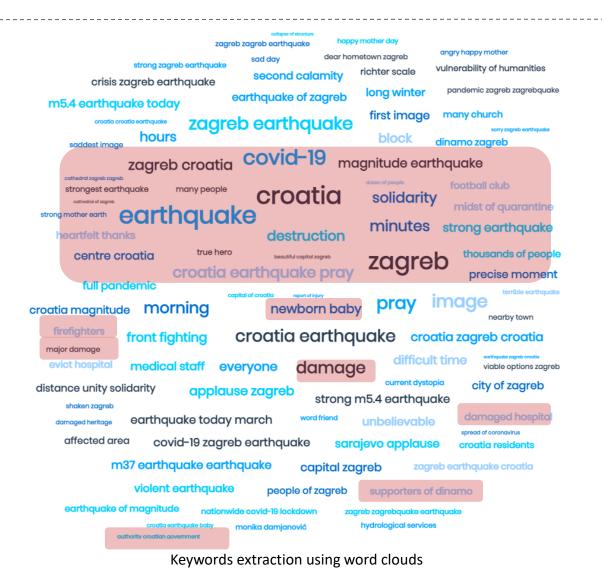
Keywords extraction



Wordclouds





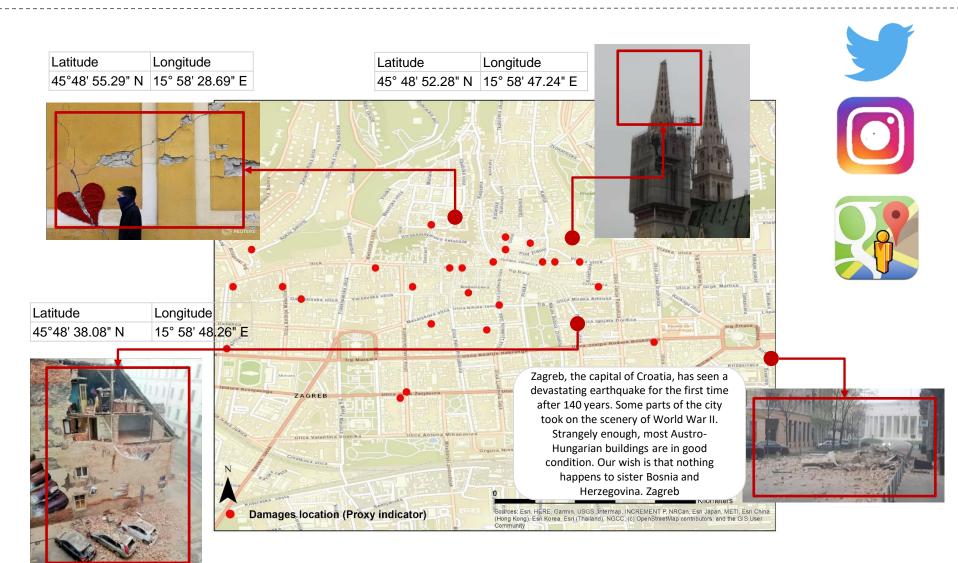


word	count	relevance
earthquake	1609	0.677
croatia	1479	1
zagreb	1281	0.695
covid-19	561	0.113
image	282	0.158
pray	281	0.08
zagreb earthquake	269	0.258
croatia earthquake	251	0.304
damage	206	0.088
morning	174	0.128
minutes	147	0.077
croatia earthquake pray	144	0.996
zagreb croatia	129	0.198
solidarity	123	0.102
destruction	108	0.099
hours	104	0.091
magnitude earthquake	85	0.387
newborn baby	84	0.387
everyone	82	0.084
front fighting	81	0.374
applause zagreb	81	0.374
block	81	0.074
croatia zagreb croatia	72	0.498
difficult time	71	0.323
strong earthquake	71	0.281
strong m5.4 earthquake	62	0.429
earthquake today march	62	0.429
m5.4 earthquake today	62	0.429
first image	62	0.286
unbelievable	62	0.11
covid-19 zagreb earthquake	61	0.422
medical staff	61	0.281
sarajevo applause	61	0.281
m37 earthquake earthquake	59	0.408
centre croatia	59	0.272
capital zagreb	58	0.198
city of zagreb	54	0.374
earthquake of zagreb	54	0.374
long winter	53	0.244
full pandemic	53	0.244

Words frequency (40/100)

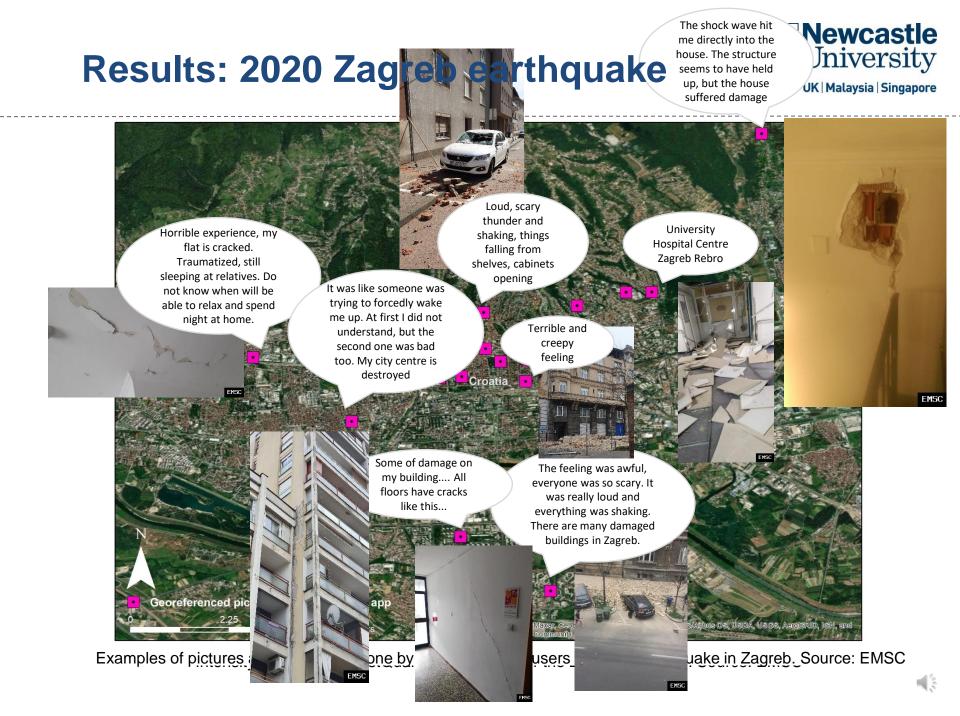




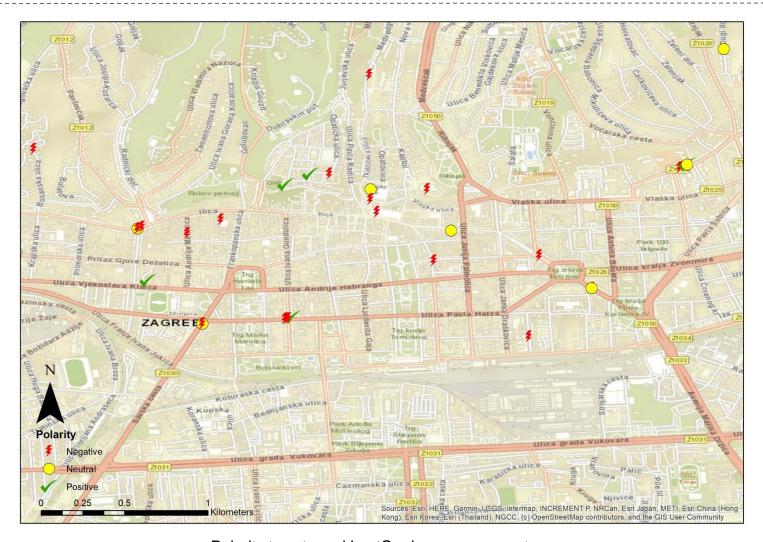
















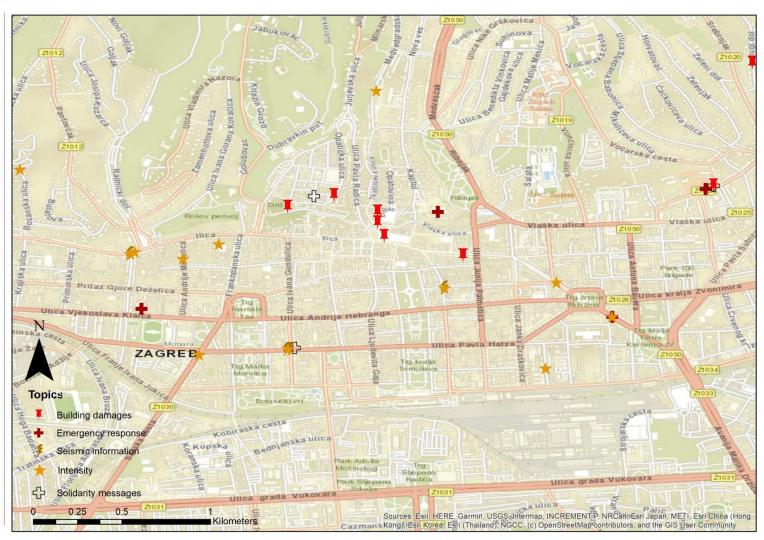


Emergency response assessment

Polarity	Twitter & Instagram	LastQuake app	Total	Percentage
Negative	511	0	511	54
Positive	320	0	320	34
Neutral	109	0	109	12
Total	940	0	940	100













DATASET

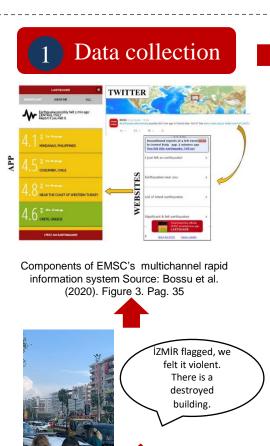
Contreras, D., Wilkinson, S., Fallou, L., Landès, M., Tomljenovich, I., Bossu, R., . . . James, P. (2021). **Supervised polarity and topic classification of LastQuake app user's pictures with comments – Zagreb 2020 earthquake**. Retrieved from:

https://data.ncl.ac.uk/articles/dataset/Supervised_polarity_and_topic_cl_assification_of_LastQuake_app_user_s_pictures_with_comments_Zag_reb_2020_earthquake/14687163

DOI: https://doi.org/10.25405/data.ncl.14687163.v1 .v1

Methods: 2020 Aegean earthquake











3 Data extraction

XLS file



4 Data process

Translation to English Correct spelling mistakes

5 Data analysis

Sentiment/topic Analysis Supervised classification



6 Database



7 Maps







Methods: 2020 Aegean earthquake



Rules

Polarity	Rules
Positive	Reports of light intensity
	 Reports of short seismic movements
	Reports of slight shakes
	 Supporting and solidarity messages
	 Emergency response messages
	 Preparedness measures
	 Reports of long seismic movements
Negative	Reports of strong shakes
	Reports of strong intensity
	Reports of aftershocks
	 Report of damages in buildings and/or lifelines
	 Reports of injuries and/or casualties
	 Reports of fear and anxiety
Neutral	 Seismic information

Rule-set for polarity classification of text data produced by LastQuake app users.





Positive

- '<u>Low</u> damage'
- 'We felt it, but it was short'
- 'Everybody should <u>respect</u> and act according to <u>scientific rules and regulations</u>.
 Otherwise, everybody will lose'

Negative

- 'Everything rattled for a few seconds. The cracks in our walls are getting bigger'
- 'Chios, Vrontados. Very <u>strong shake</u>, ground floor, <u>cracks in walls objects fell</u>.'
- 'I felt that earthquake when I was in school in Athens. The floor was moving and the walls too. <u>It was very scary</u> because it happened so suddenly!'

Neutral

- 'The epicentre is in Samos, Greece, not in Western Turkey'.
- 'Moment intensity VI'
- '<u>It is not Dodecanese islands</u>. It is North Aegean Samos island'

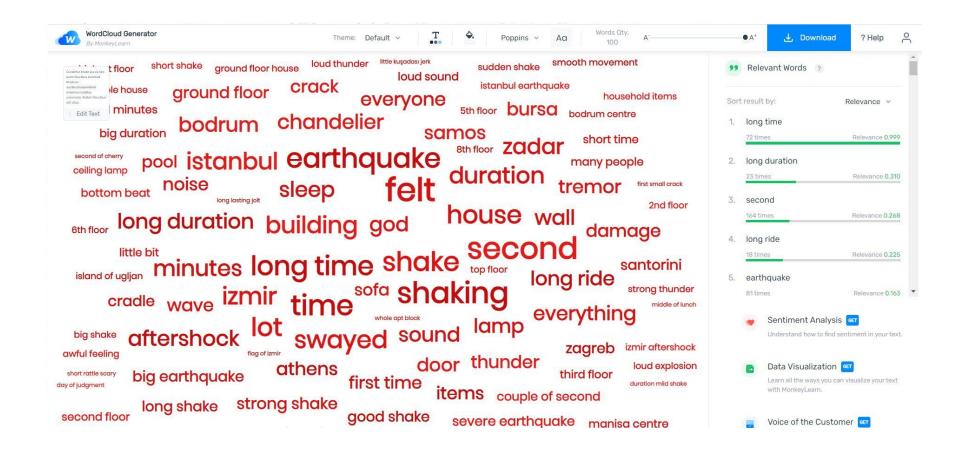




Relevance Of Soft result by: Relevance Of Sof	WordCloud Generator Theme: Default v T By MonkeyLearn Theme: Default v T Poppins v Aa Words City. 100 A	●A ⁺	Help
slight tremmor short time god short ride bed small swinging effects gacik izmir bottle of water small sound much jazz swing fethlye mugla turkey second menemen albania hope adaköy sitesi neighborhood short time better fast tank triangle of life small swinging effects gacik izmir first time izmir bottle of water light cherry house perceptible short time belt istanbul light vibration 5 times Relevance 0 Sentiment Analysis or Understand how to find sentiment in your 5th floor 5 thmes Relevance 0 Sentiment Analysis or Understand how to find sentiment in your 5th floor 6 Data Visualization or Learn all the ways you can visualize your to with Monkey Learn.	Control Flat Deviation of Little Dist Short take address and active to the Little Dist Short shake slight earthquake short hadif jolt short shake slight earthquake lamp roar opposite collar izmir nothing short shake slight sway short ride alia street bodrum jointent long duration istanbul europe slight short shake slight short short shake slight sway short ride alia street bodrum jointent long duration stanbul europe slight short shor	Sort result by: Relevant 1. slight tremor 9 times Relevant 2. second 43 times Relevant 3. short ride 7 times Relevant 4. slight shake	evance 0.994 evance 0.696 evance 0.663
short time god short ride bed small swinging effects gacik izmir shake of chair first time izmir bottle of water light cherry house perceptible short time belt istanbul light vibration small sound much jazz swing fethiye mugla turkey little sway violent shaking long time second menemen albania hope adaköy sitesi neighborhood felt briefly triangle of life gacik izmir shake of chair shake of chair light vibration Sentiment Analysis of Understand how to find sentiment in your bring shake of chair Understand how to find sentiment in your standard to gacik izmir shake of chair Understand how to find sentiment in your shake of chair shake of chair Understand how to find sentiment in your standard how to find sentiment in your shake of chair sh	wall mounted ty better fast tank		vance 0.442
	short time short ride bed short ride belt istanbul light vibration buttle of water light cherry house perceptible short time belt istanbul belt vibration buttle sway 5th floor slight swing miles kitic shake floor 3rd vaslui violent shaking long time second menemen albania hope adaköy sitesi neighborhood felt briefly	Sentiment Analysis or Understand how to find sentiment Data Visualization or Learn all the ways you can visualiz	t in your text

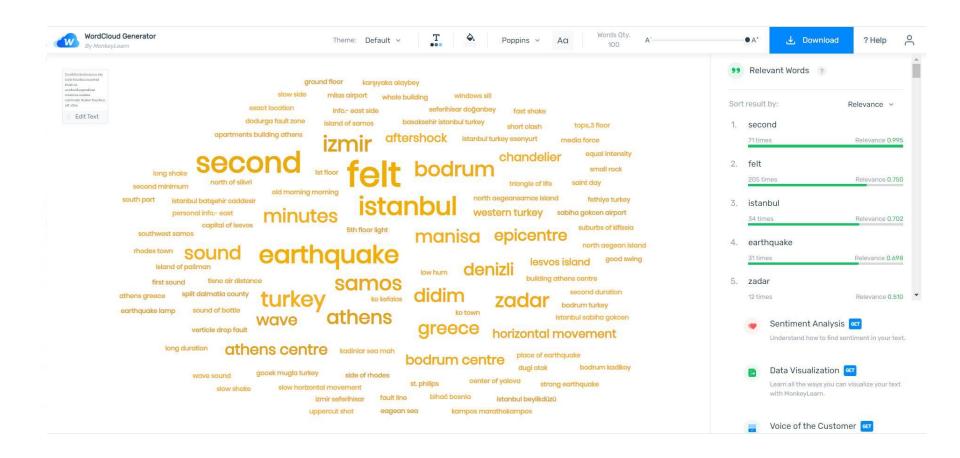
















Buildings damaged

- 'There are buildings destroyed in different districts of Izmir. We shook so violently. The items in the house were overturned. Earthquakes still continue. May God help us. Get past us all'
- We were caught in Atasehir in my 12-floor house. I said everything is over. We waited for the building to come out. All flats in the building have cracks and collapse in the plaster'

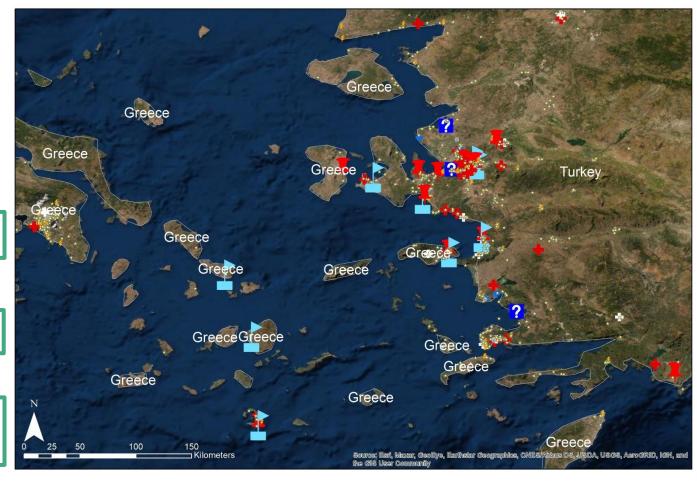
Lifelines affected

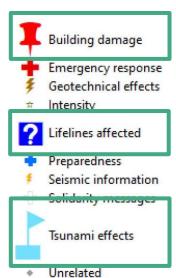
- 'It was the first time I saw the .300-ton transformers shaking like a cradle, which was shifted in Aliagada. God bless us all'.
- 'Very powerful and long lasting. All neighbours are on the street. No visible damage although telephone poles sway and a line broke. Many smaller quakes within the last 45 minutes or so'.

Tsunami

- 'The sea rises here and falls again so you can say it rises if I can estimate that by 50 cm and 2 minutes later it goes down again'
- 'I was in the tsunami, 1 meter the sea could go to the stairs of the bank.
 Car with water but started, got the hell out of there...pfff'







Data source: European Mediterranean Seismological Centre . EMSC



DATASET

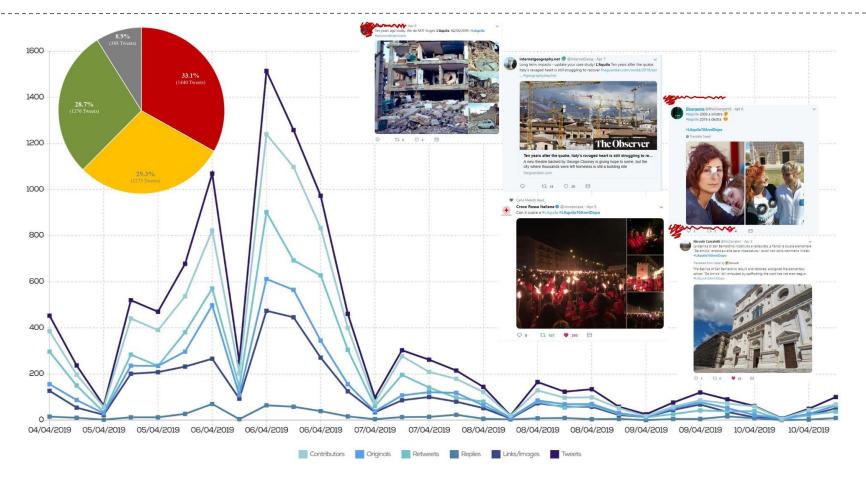
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https://data.ncl.ac.uk/articles/dataset/Polarity_and_topic_supervised_c lassification_of_LastQuake_app_user_s_comments_-Aegean_2020_earthquake/14604354

DOI: https://doi.org/10.25405/data.ncl.14604354.v3

Post-disaster recovery





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Limitations



- Lack of georeferenced data on Twitter and Instagram
- Lack of trained social media users
- Cleaning and processing data
- Classification rules and topics
- Algorithm accuracy

Future development



- Georeferenced data EMSC
- Training social media users
- Reduce time for cleaning and processing data
- Validate classification rules and topics
- Increase algorithm accuracy for unsupervised classification of data

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