

Building a government-owned open data platform for connected and autonomous vehicles

Handuo Deng, Qi Hu, ChengHe Guan*, Yi Samuel Chen, Monica Menendez

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About me

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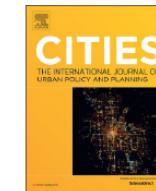
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Building a government-owned open data platform for connected and autonomous vehicles



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ABSTRACT

The growing recognition of the societal implications stemming from technological advancements highlights the need for innovative governance approaches, particularly in urban environments. Focused on connected and autonomous vehicles (CAVs), this study proposes an integrated analytical framework for a dedicated open data platform (ODP). By integrating thematic analysis with process landscape and stakeholder analysis methods, we present a holistic CAV-ODP model positioned to optimize benefits across industries, public sectors, and society as a whole. We argue that multiple stakeholders can enhance both supply and demand aspects of the CAV-ODP, catalyzing activities such as data access, management, transformation, incubation, coordination, education, and application. Importantly, it advocates for government-led integration of interests spanning private and public domains, fostering a collaborative social network for data application and innovation. This inquiry not only reveals the social benefits generated by open CAV data but also underlines the significance of the CAV-ODP platform as an innovative governance arrangement, serving as a catalyst for a culture of sharing, bolstering collaborative governance, and preserving public value amid disruptive technological changes. Overall, the concept of government leadership is universally applicable, with the tangible power dynamics among the government, private sectors, and society influencing the expeditious materialization of the proposed framework.

Key concepts

- connected and autonomous vehicles (CAVs)
- CAV open data
- open data platform (ODP)

connected and autonomous vehicles - CAVs

CAVs refer to intelligent vehicles that are both connected and autonomous.

An **autonomous vehicle (AV)** is a vehicle capable of driving itself. Automation levels range from 0 (lowest) to 5 (highest) (SAE International, 2019), with fully autonomous vehicles belonging to level 5.

A **connected vehicle (CV)** is a vehicle with technology that enables it to communicate and exchange information wirelessly with other vehicles, infrastructure, devices, and external networks (Scharring, Nash, & Wong, 2017).

emerging driving technology + infrastructure network (physical and soft)

CAV open data

the idea that
some vehicle
and mobility
data generated
by CAVs should
be freely
available for
everyone to use

Appendix C: CAV-related open datasets.

Table C1. CAV-related open data resources at present around the world
 (Source: Authors. Based on all the websites mentioned in the table.)

Dataset	Intellectual Property	Description	Websites
Waymo Open Dataset	Waymo	The data set isn't for commercial use, but its definition of "research" is fairly broad, and includes researchers at other companies as well as academics.	https://waymo.com/open/
Lyft dataset	Lyft	A dataset of level 5 autonomous vehicles. All data are collected by a fleet of Ford Fusion vehicles.	https://level5.lyft.com/dataset/#explore
Oxford Robotcar Dataset	Oxford Robotics Institute	The Oxford RobotCar Dataset contains over 100 repetitions of a consistent route through Oxford, UK, captured over a period of over a year. The dataset captures many different combinations of weather, traffic and pedestrians, along with longer term changes such as construction and roadworks.	https://robotcar-dataset.robots.ox.ac.uk/
The H3D Dataset	Honda Research Institute USA, Inc.	The H3D is a large scale full-surround 3D multi-object detection and tracking dataset. It is gathered from HDD dataset, a large-scale naturalistic driving dataset collected in San Francisco Bay Area.	https://usa.honda-ri.com/h3d
The nuScenes Dataset	nuScenes	The nuScenes dataset is a large-scale autonomous driving dataset. Two diverse cities: Boston and Singapore Free to use for non-commercial use	https://www.nuscenes.org/
ApolloCar3D	Apollo	The first large-scale database suitable for 3D car instance understanding.	ApolloCar3D: A Large 3D Car Instance Understanding Benchmark for Autonomous Driving arXiv:1811.12222 [cs.CV]
KITTI Vision Benchmark Suite	Andreas Geiger	Our datasets are captured by driving around the mid-size city of Karlsruhe, in rural areas and on highways. Our goal is to reduce this bias and complement existing benchmarks by providing real-world benchmarks with novel difficulties to the community.	http://www.cvlibs.net/datasets/kitti/raw_data.php
The Cityscapes Dataset	Cityscapes Team	The Cityscapes Dataset focuses on semantic understanding of urban street scenes. In the following, we give an overview on the design choices that were made to target the dataset's focus.	https://www.cityscapes-dataset.com/dataset-overview/
Mapillary Vistas Dataset	Mapillary AB	A diverse street-level imagery dataset with pixel-accurate and instance-specific human annotations for understanding street scenes around the world.	https://www.mapillary.com/data-set/vistas?pKey=xyW6a0ZmrJtjLw2iJ71Oqg&lat=20&lng=0&z=1.5

Supplementary data online <https://doi.org/10.1016/j.cities.2024.104918>

Lidar

- Two roof-mounted VLP-32C lidar sensors (64 beams total)
- Overlapping 40° vertical field of view
- Range of 200 m
- On average, our lidar sensors produce a point cloud with ~ 107,000 points at 10 Hz

Localization

We use a city-specific coordinate system for vehicle localization. We include 6-DOF localization for each timestamp, from a combination of GPS-based and sensor-based localization methods.

Cameras

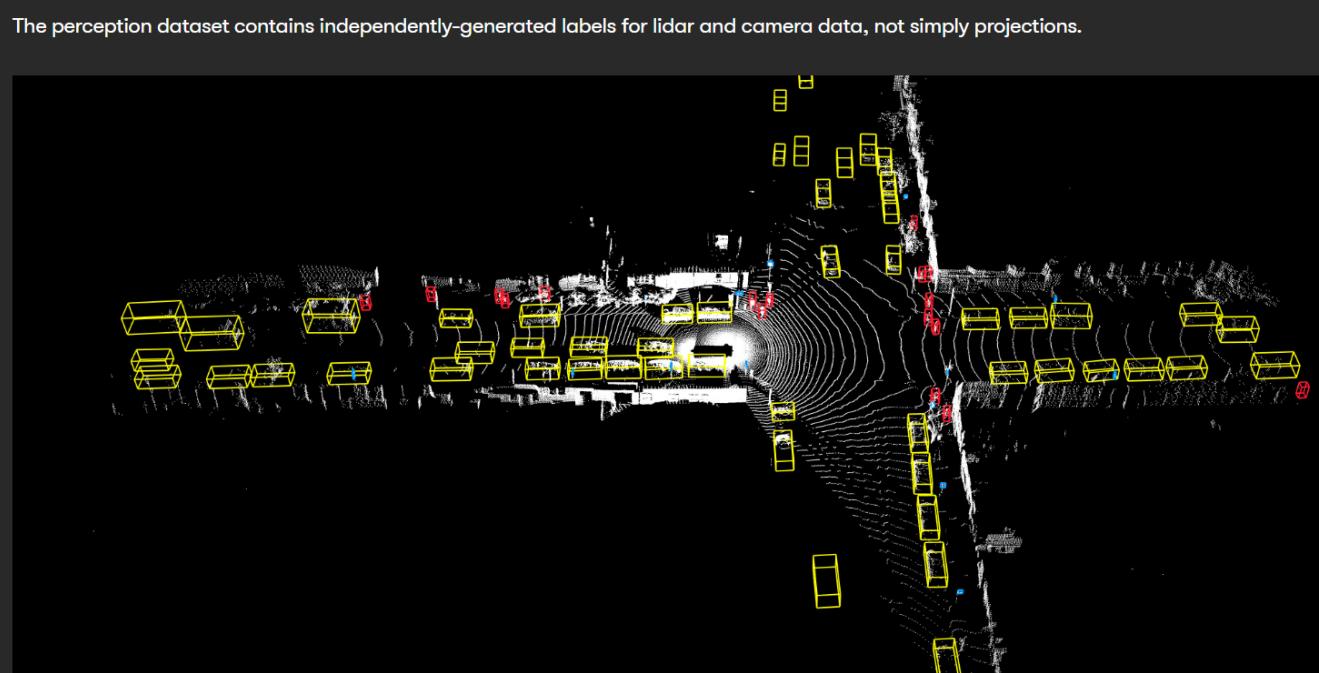
- Seven high-resolution ring cameras (2048 width x 1550 height) recording at 20 Hz with a combined 360° field of view. Unlike Argoverse 1, the camera and lidar are *synchronized*. The camera images are captured as one of the two lidars sweep past its field of view. The front center camera is portrait aspect ratio (1550 width x 2048 height) to improve the vertical field of view.
- Two front-view facing stereo cameras (2048 x 1550) sampled at 20 Hz

Calibration

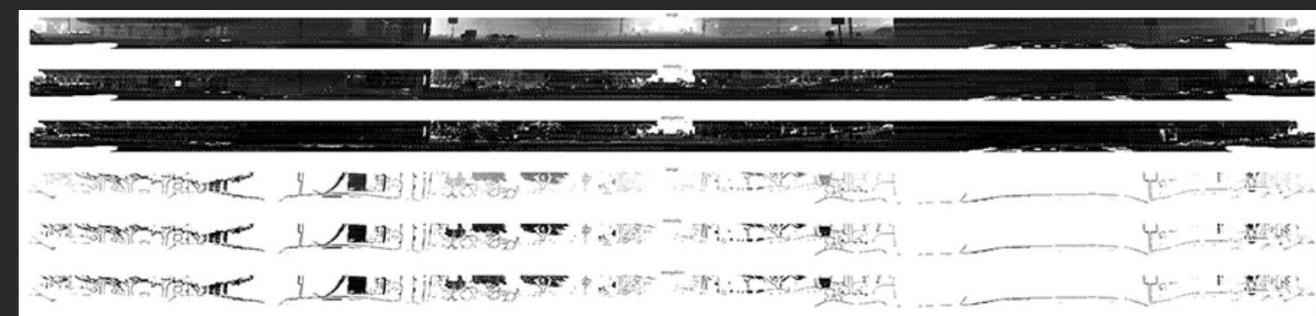
Sensor measurements for each driving session are stored in “scenarios.” For each scenario, we provide intrinsic and extrinsic calibration data for the lidar and all nine cameras.



Examples of CAV open datasets



Example range image



<https://waymo.com/open>



Classifications of CAV data

NOT All data should be open

Potential use, intellectual property, and data protection of data	Non-brand differentiated data	Data not differentiated by vehicle manufacturers and not considered IP-sensitive
	Brand differentiated data	Data differentiated by vehicle manufacturers and considered IP-sensitive
	Personal data	Data that supports services requiring user or vehicle identification, very sensitive from a privacy perspective

Table 2
Classifications of CAV generated data.

Classification Criteria	Subclassification	Examples/Definition
Machines to collect and store data	Collected data Storage data	Data generated by radar, lidar, sonar, GPS, odometry Data generated by inertial measurement units, central computer, vehicle users, third-party apps
Content of data	Technical data	Data related to vehicle operations and driving process, including speed, acceleration, fuel and consumption levels, battery status, lane change, brake activation, as well as the decision-making process of the vehicle
	Geolocation data	Location and route of a certain vehicle
	Environment data	Weather conditions, temperature, sunlight, etc.
	Urban society data	Road system, city infrastructure, traffic accidents, number of pedestrians and vehicles, human interventions,

(Source: Taeihagh & Lim, 2019; Yin & Berger, 2018; Somers & Austroads, 2018; Scharring et al., 2017; Darwish, Bakar, Kaiwartya, & Lloret, 2020; also see Table C1 in the Appendix for additional examples.)

open data platform (ODP)

A specific arrangement of using open data

existing ODPs mainly deal with open government data (OGD)

Business models of ODP: value generation

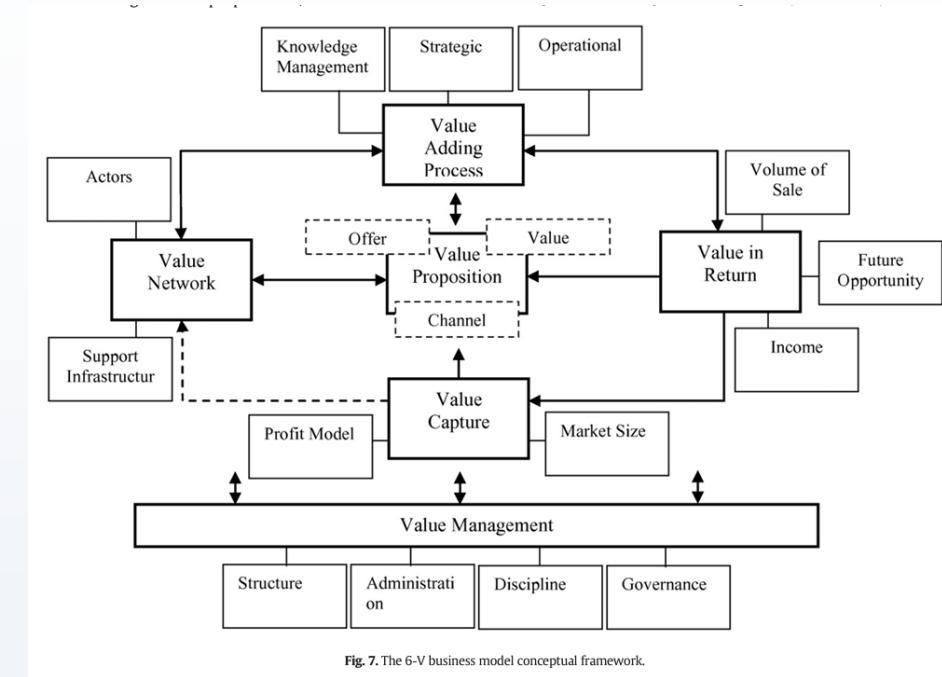
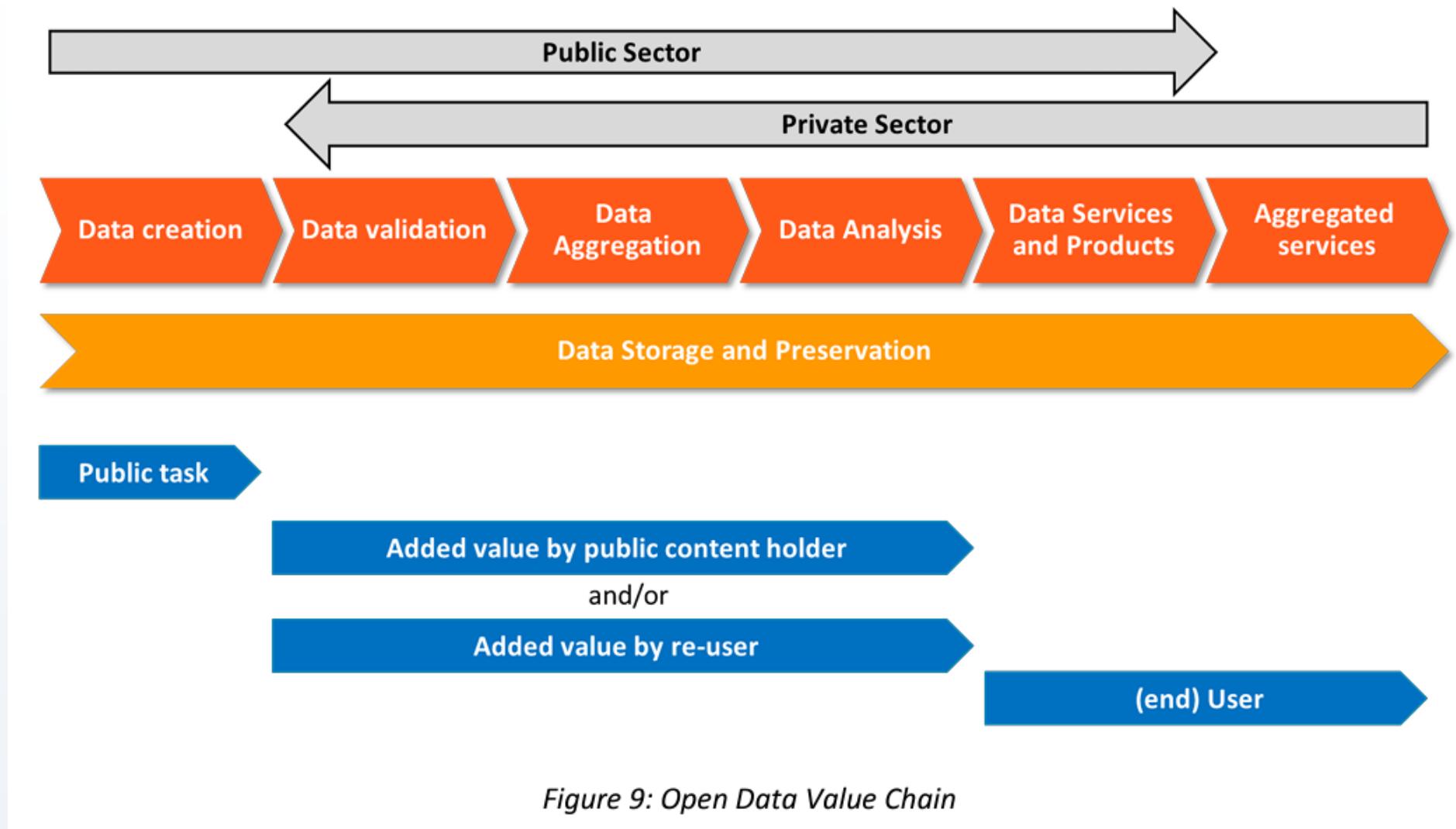


Fig. 7. The 6-V business model conceptual framework.

(Zeleti et al., 2016)



Berends J., Carrara W., Engbers W., Vollers H. (2020).

Table 1

Examples of open data platforms/projects in the transportation domain worldwide.

Open data platform	Country/Area	Platform owner	Data description	Primary roles
The Intelligent Mobility Data Hub	UK	Catapult Transport Systems (company)	Detailed mapping grids, vehicle emissions, national roadworks data, mobile network data, traffic movement patterns, haulage journeys.	Store, analyze and process large volumes of transport-related data, and provide transport solutions.
Transport for London's portal	UK	Transport for London (government)	Air quality, tube, bus, coach and river, cycling, walking, planning.	Provide transport datasets for potential service developers.
Open transport data on the European Data Portal	Europe	European Commission (government)	Over 7600 datasets related to transport (e.g., bicycle hiring systems in Switzerland and Italy, road work in Belgium, the winter traffic conditions for cars in France, and datasets about road construction in Sweden)	Publish or harvest the data from different institutions within their countries and support open data use cases, such as Saemes and Moovit.
Digital Government Strategy	USA	U.S. Department of Transportation (government)	Over 2000 datasets regarding transportation.	Publish a list of publicly available data sets, and enrich, expand, and open the data inventory.
Brazilian Open Data Portal	Brazil	The Secretariat of Information Technology, Ministry of Planning, Development and Management (government)	Publish data by government agencies regarding various topics of public administration.	Promote dialogue between actors in society and with the government to think about the best use of data, promoting positive impacts from the social and economic points of view.
UAE official Open Data Portal	UAE	UAE Federal Competitiveness and Statistics Authority (government)	Data sets in economy, education, society, technology, transportation, environment, government, health and infrastructure.	Provide enhanced open data systems for public use and enhance sustainable communities based on participation and transparency.
Transport Open Data Portal	China	Ministry of Transport of China (government)	Datasets about public transportation routes, stations, flights, and road work.	Publish and provide open datasets.
Transport Open Data Hub	Australia	Transport for New South Wales (state government)		Act as a showcase for innovation from the use of transport data and provide information about data, APIs and a community forum for app developers.
Egypt Data Portal	Egypt	Egypt Government (government)	Datasets in agriculture, education, health, transport, investment, population, etc., including census data and geolocation data.	Publish datasets in various domains and support sustainable development.

(Sources: <https://ts.catapult.org.uk/innovation-centre/imdh/>; <https://blog.tfl.gov.uk/category/open-data/>; <https://www.europeandataportal.eu/en/highlights/open-transport-data-european-data-portal>; <http://www.transportation.gov/data>; <https://dados.gov.br/>; http://data.bayanat.ae/en_GB/group; <http://www.mot.gov.cn/sj kf/>; <http://data.nsw.gov.au/data/organization/transport-for-nsw>; <https://egypt.opendataforafrica.org/>.)

Examples of open government data platforms

深圳市数据开放平台

全新 字段搜索 v1.0 上线 | 深圳市政府数据开放平台 × 深圳计算科学研究院 强强联合，发掘开放数据价值

多个关键字以空格区分，未用空格区分将视为单个词汇进行搜索

搜索 | 字段搜索

民生 税务 医疗 教育 旅游 房地产

市级部门/区 49 个 | 开放目录总量 4,013 个 | 数据项总量 35,152 项 | 数据总量 34,688,404 | 接口总量 637 | 文件下载量 799,092 次 | 接口调用量 229,069,752 次

最近更新数据

地面观测数据_深圳国家基本气象站...	2024-03-19 06:27:30
罗湖区-行政处罚信息	2024-03-19 06:21:57
市交通运输局-行政许可信息	2024-03-19 06:17:11

近七日接口调用量TOP10及最近调用时间

1 深圳范围自动站实况格点数据表	268727次	2024-03-18
2 共享单车企业每日订单表	236403次	2024-03-18
3 预报预警数据_灾害性天气预警	59800次	2024-03-18

政府网站2023年度工作报表

GData 放开广东 gddata.gd.gov.cn

重要政策举措 及实施效果

<https://opendata.sz.gov.cn/>
<https://data.gov.hk>
<https://www.data.gov.uk/>



Search data.gov.uk

Business and economy

Small businesses, industry, imports, exports and trade

Crime and justice

Courts, police, prison, offenders, borders and immigration

Defence

Armed forces, health and safety, search and rescue

Education

Students, training, qualifications and the National Curriculum

Environment

Weather, flooding, rivers, air quality, geology and agriculture

Mapping

Addresses, boundaries, land ownership, aerial photographs, seabed and land terrain

Society

Employment, benefits, household finances, poverty and population

Government

Staff numbers and pay, local councillors and department business plans

Towns and cities

Includes housing, urban planning, leisure, waste and energy consumption

Transport

Airports, roads, freight, electric vehicles, parking, buses and footpaths

Digital service performance

Cost, usage, completion rate, digital take-up, satisfaction

Government reference data

Trusted data that is referenced and shared across government departments

Can we make a ODP for CAV open data? (Conceptualization)

Intuitive concerns

Which data can be made open?

- A key premise

How to persuade the data ‘owners’ to open the data? (Who are the ‘owners’?)

- Identifying stakeholders
- A cost-benefit view

Who owns the platform?

- A critical discussion

Research questions

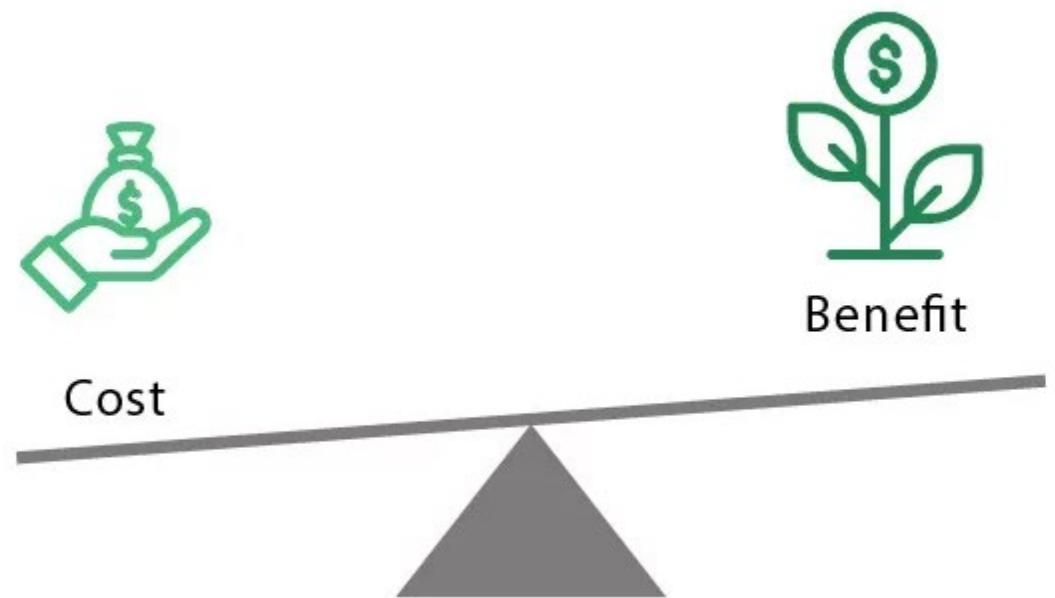
Who are the (potential) stakeholders of a CAV-ODP, delineating their purposes, interests, and roles?

What are the key processes of establishing and operating of a government-owned CAV-ODP?

What specific roles should be undertaken by the government in a CAV-ODP?

Benefits and challenges of making some CAV data open

all steps of establishing the platform...



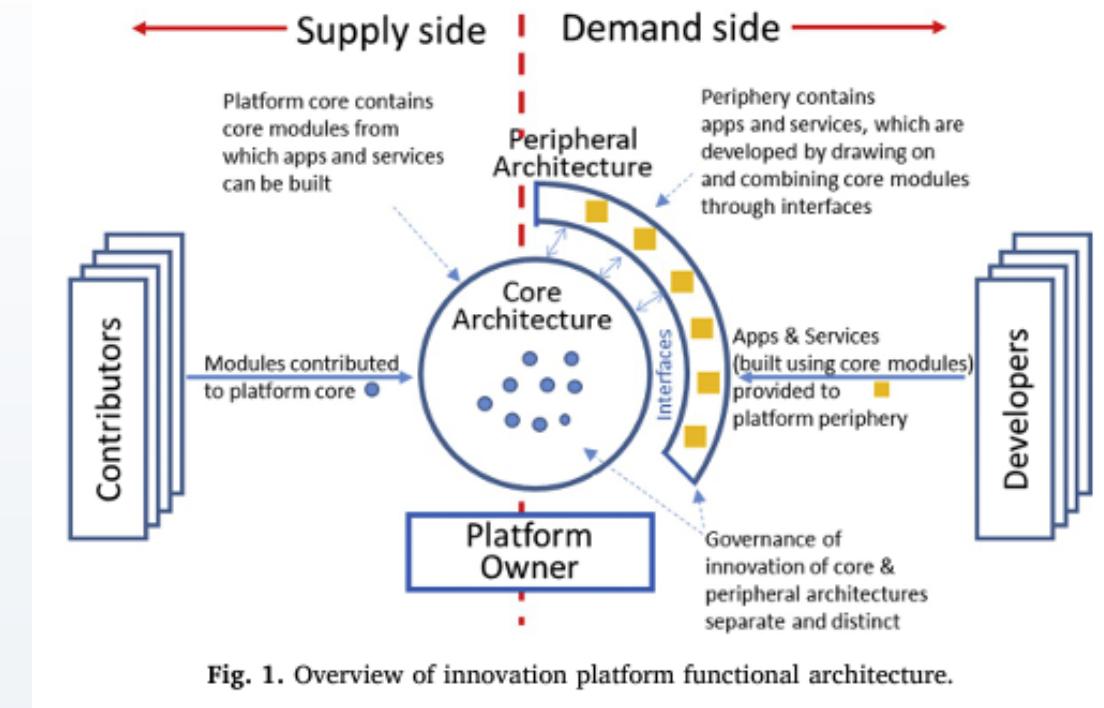
economic,
social,
ecological...

Different stakeholders (including the public)

Conceptualization

innovation platform functional architecture
(Bonina and Eaton, 2020)

A combined view of stakeholders and operational steps



(Bonina and Eaton, 2020)

CAV-ODPs: an effort to connect CAV open data and ODPs

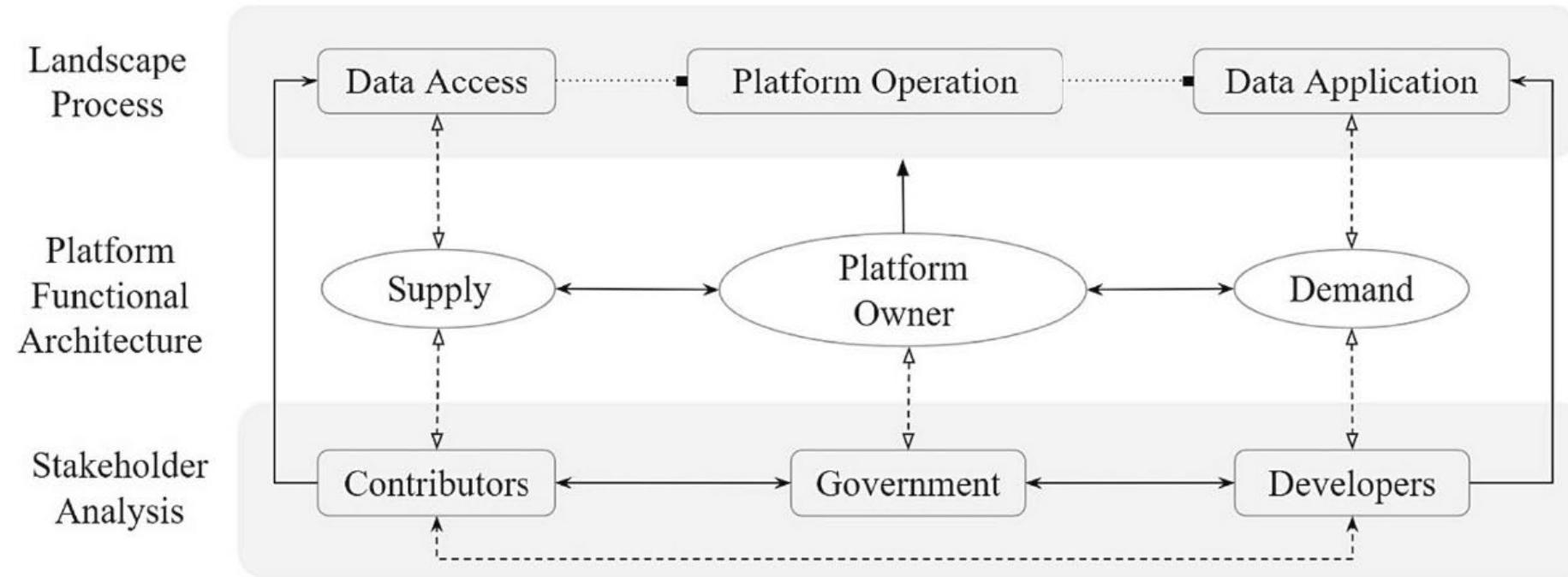


Fig. 2. Conceptual framework.

(Source: Authors. Based on [Bonina & Eaton, 2020](#).)

Data collection

Primary and secondary data sources

Table B1. Interview records
(Source: Authors. Based on sources listed in the table.)

Interviewee	Topic	Summary of the interviewee's idea
a. Director and co-leader of an investment bank	CAV open data platform investment	The question of investing in an open data platform is to find a very niche area in which people can make profits. We have been hearing about how useful or beneficial an open data can be, but few companies can really create profit from it.
b. Business Manager of a self-driving company	Advantages of CAVs and their datasets	An example of a government-led open data platform is the project of Copenhagen. After constructing an open data platform, 5 apps have been developed, for different uses all relating to transport, for buses, for taxis, for trains, for hiring bikes, for car renting on weekends. Despite bringing some benefits, the users' experience was not good. Users have to download all 5 apps in order to meet different needs, which brings inconvenience. And once there is a failure of one app, people will lose trust in them all. That might be a problem when start-ups come into being using transport open data.
c. A Researcher at a transportation laboratory	Research value of CAV data	What makes an autonomous car called autonomous rather than automated is that it can make a decision based on what it sees. For example, an automated call will approach an obstacle, and stops. An autonomous car will see it, and think about what obstacle that is and whether it is safe to continue or not.
d. A professor on transportation policies	Potential challenges of government-led CAV-ODPs	There are loads of data sets on autonomous vehicles. The vehicles generate many types of data, including visual data, telemetry data, lidar data, and location data. It's the implementation of the data that makes a difference. It is what you use them for and how you think that might be useful for your vehicle that matters. We leave that up to our end users. We develop our products using our own data sets.
		During the process of experimenting, huge amounts of data could be generated, such as experiment documents and outcome. the public have the access to these experiment data." There are not any databases, however, but they are free, open to anyone, able to be found
		on the Internet. Apart from scientific researches, commercial companies can make use of these data if they want, although there have not been so many commercial applications, indeed.
		I'm not convinced national governments are really committed to open data. I don't think they want to really put so much pressure on companies. However, I think there is more penitence and emphasis on this at the local level. For example, Oxford is very keen on having open data from the companies willing to share. All the agreements between local government and companies are voluntary, meaning to say that if the companies don't comply, there is very little what the government can do. I think that's a very problematic situation that should be changed.

Supplementary data online
<https://doi.org/10.1016/j.cities.2024.104918>

Data collection

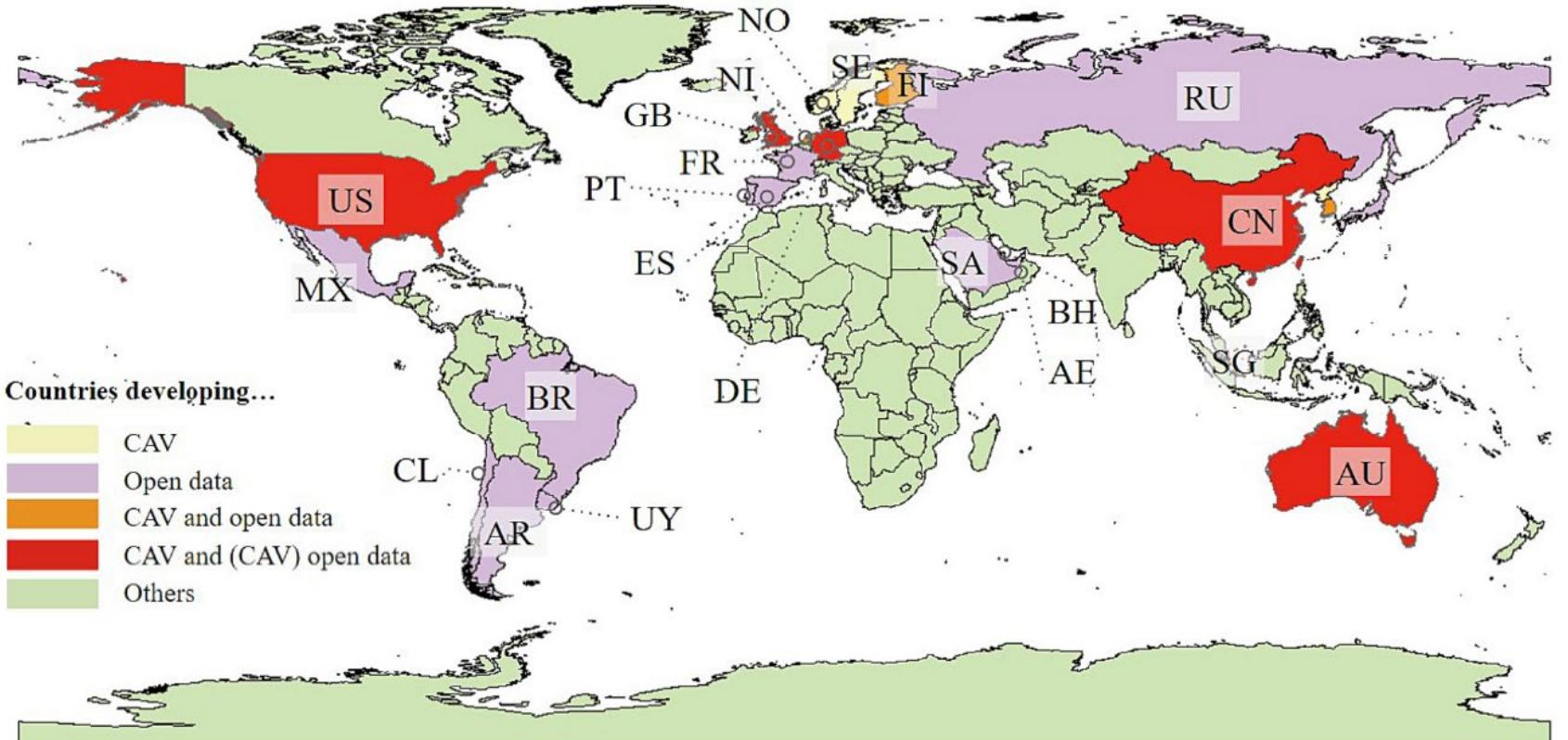
Table A1. Data sources of the process landscape and stakeholder analysis
 (Source: Authors. Based on sources listed in the table.)

Source	Type of data	Interviewee/Title/URL/Source	Content	Source	Type of data	Interviewee/Title/URL/Source	Content	Country
Interview (First-hand)	CAV open data applications and challenges	Director and co-leader of an investment bank	CAV open data platform investment	Government reports	CAV open data applications	Connected and Autonomous Vehicles in Europe: The Challenges with Using the Data They Generate	Challenges of CAV data application	Europe
		Business Manager of a self-driving company	Advantages of CAVs and their datasets			Industry characteristics and value chain analysis of open data exploitation	Establishing a open data application platform	China
		A researcher at a transportation laboratory	Research value of CAV data			Blockchain-Based Data Sharing and Trading Model for the Connected Car	CAV open data design adopting blockchain	UK, China
		A professor of transportation policies	Potential challenges of the government-led CAV-ODP			TRADING: Traffic Aware Data Offloading for Big Data Enabled Intelligent Transportation System	Transportation open data application	USA
	CAV application	Identifying and prioritizing the benefits and concerns of connected and autonomous vehicles: A comparison of individual and expert perceptions	CAV application			Freeway Traffic Speed Estimation of Mixed Traffic Using Data from Connected and Autonomous Vehicles with a Low Penetration Rate	Applications of CAV open data in transportation domains	China
		Connected and Automated Transport: Research and Innovation Capacity in Europe	CAV application			Internet of Vehicles in Big Data Era	Relationship between vehicles and data	China
		Recent advances in connected and automated vehicles	CAV development			Open data for democracy: Developing a theoretical framework for open data use	Positive effect of open data on democratic processes	Netherlands
		Reflections and recommendations on policies related to automated maps	Applications of CAV open data in enhancing safety			How to Ensure the Economic Viability of an Open Data Platform	Open data platform design & governance	France
		Governing autonomous vehicles: emerging responses for safety, liability, privacy, cybersecurity, and industry risks	Applications of CAV and CAV data			Open data platforms: Discussing alternative knowledge epistemologies	Open government data platform cases & studies	USA, Singapore, Spain, Russia, Bahrain, Saudi Arabia and United Arab Emirates, Chile, Sweden, Finland, China, German, Brazil, South Korea
		A discussion of the need for market-based applications of motor vehicle and driver data	Applications of vehicle data			The value of intelligent driving big data based on trusted computing in the insurance sector	CAV open data application in insurance	Netherlands
Literature	CAV data application	Connected automated vehicles and insurance: Analyzing future market structure from a business ecosystem perspective	CAV open data application in insurance			Connecting societal issues, users and data. Scenario-based design of open data platforms	Open data platform design under different circumstances	Europe
		A data-driven approach to characterize the impact of connected and autonomous vehicles on traffic flow	Applications of CAV open data in transportation domains			Towards European Open Science Commons: The EGI Open Data Platform and The EGI DataHub	An open data platform case	Europe
		Future urban transport technology development and innovation	CAV open data application in urban infrastructure management			Connected and Automated Vehicles (CAV): Open Data Recommendations (Austroads,2018)	Applications of CAV open data	Australia
		Identification and optimization of Xi'an city center system based on open data	CAV open data application in urban planning			Research and innovation in smart mobility and services in Europe: An assessment based on the Transport Research and Innovation Monitoring and Information System (TRIMIS)	Applications of CAV open data in transportation domains	Europe
		MapX: An open geospatial platform to manage, analyze and visualize data on natural resources and the environment	CAV open data application in natural resources management			Use of Data from Connected and Automated Vehicles for Travel Demand Modeling	Applications of CAV open data in transportation domains	USA
		Impact of intelligent transport on urban space	Positive effect of CAV open data on sharing spirits and working efficiency			Connected and Autonomous Vehicles: Transport for London, 2019	Development plans regarding CAV	UK
		Research on key technologies of data platform for automated driving	Steps involved in CAV data platform establishment			Planning for Connected and Automated Vehicles Report	CAV's impact	USA
		Research on value-added services for government open data platforms based on top-level design	Government open data platform design			ITE Statement on Connected and Automated Vehicles	CAV application	USA
		The impacts of open data initiatives on smart cities: A framework for evaluation and monitoring	Open data application in smart cities			Open data: Unlocking innovation and performance with liquid information	Open data application in general	Global (McKinsey)
		Cultivating open government data platform ecosystems through governance: Lessons from Buenos Aires, Mexico City and Montevideo	Open data platform design & governance			Smart Mobility and Open Data: A Global and Personal Perspective	Business cases using CAV open data	UK, USA
Open data platform establishment and management		World Bank Support for Open Data (2012-2017)	Waymo Open Dataset available for autonomous vehicle researchers	Industry reports	(CAV) Open data application	SMMT: Connected and Autonomous Vehicles: Position Paper	Positive effect of open data on public service efficiency	Global developing countries (World Bank)
			Classifications of CAV data by hardware					USA
			Applications of CAV and CAV data					UK, USA

Supplementary data online

<https://doi.org/10.1016/j.cities.2024.104918>

Data collection



AE-United Arab Emirates	CL-Chile	FR-France	NL-Netherlands	SG-Singapore
AR-Argentina	CN-China	CB-United Kingdom	NO-Norway	SE-Sweden
AU-Australia	DE-Germany	JP-Japan	PT-Portugal	US-United States
BH-Bahrain	ES-Spain	KR-South Korea	RU-Russia	UY-Uruguay

Results

Steps to build a CAV-ODP

1. CAV data access
2. Platform operation
3. CAV open data application

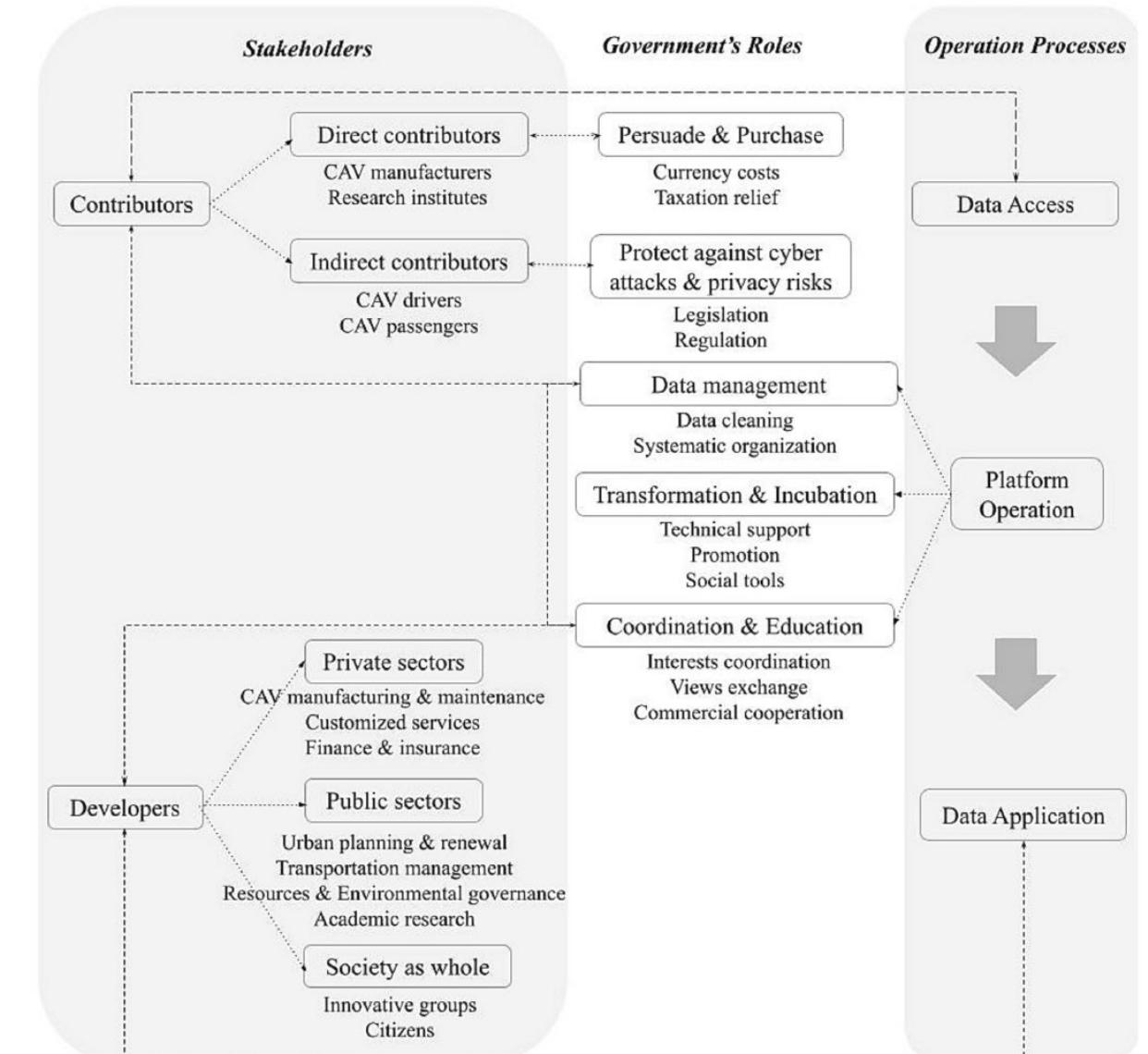


Fig. 3. Stakeholders, operation processes, and governments' roles in a CAV-ODP.
(Source: Authors.)

1. CAV data access: a view of different contributors

Direct contributors: research institutes and companies

- 'persuade and purchase' strategy
- tax cut, subsidy
- benefits of data sharing

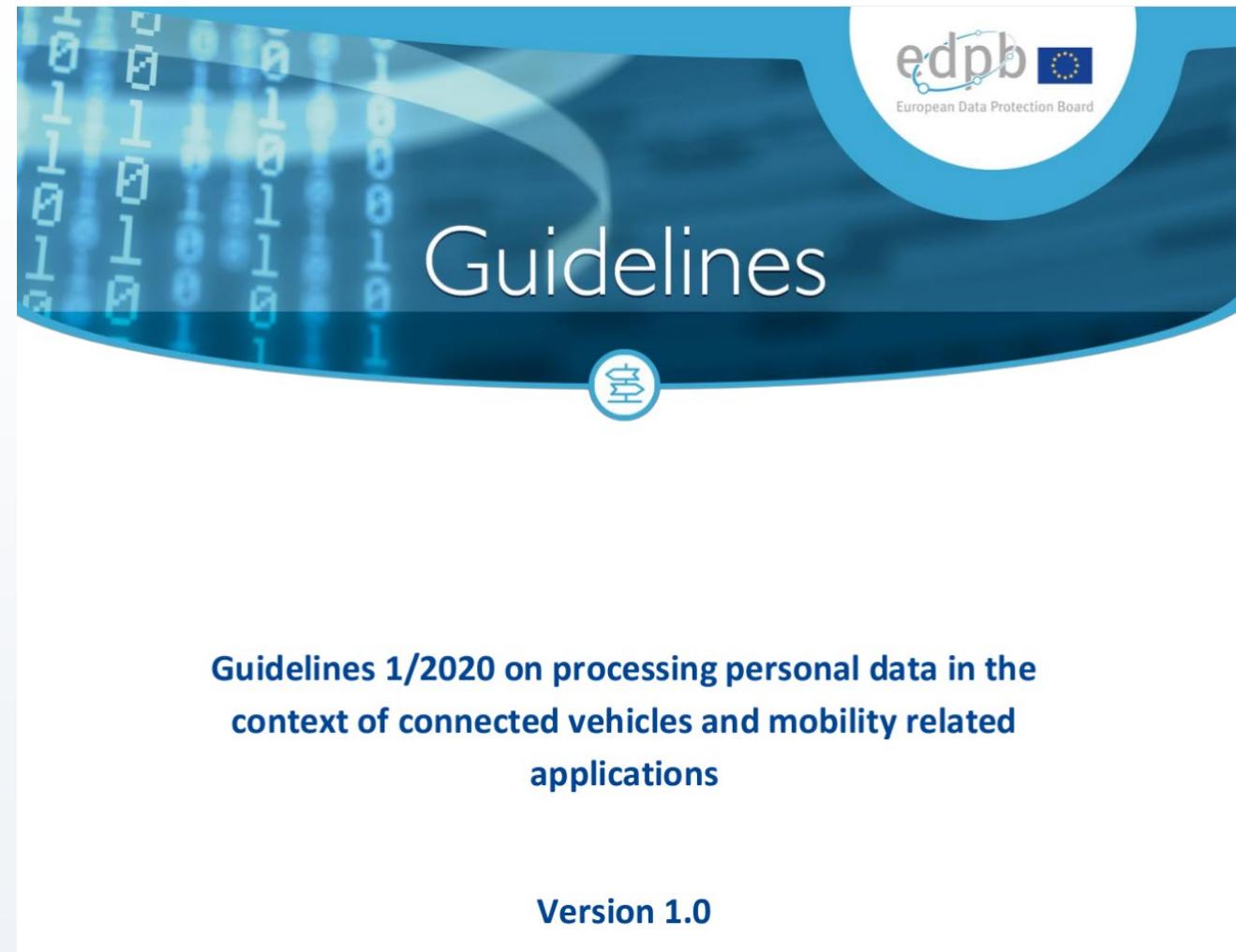
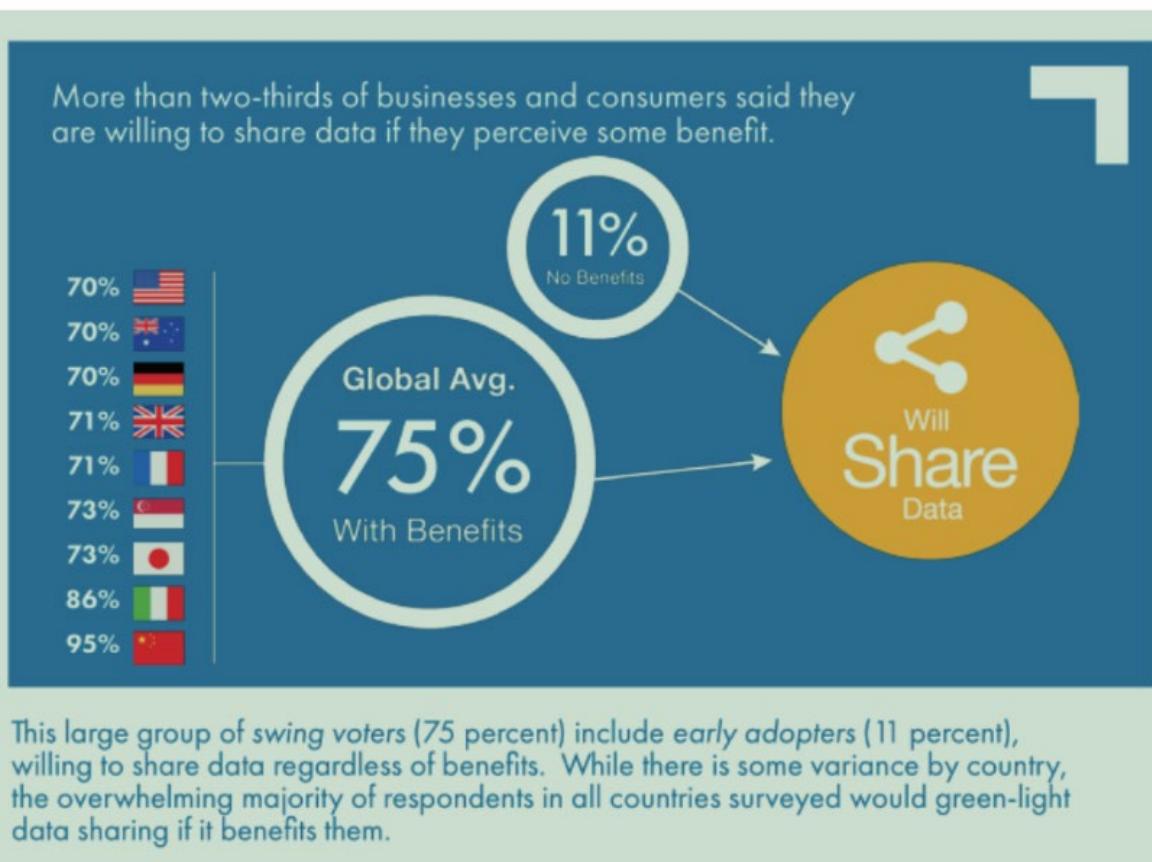
Indirect contributors: individual

- cyber-attacks and privacy leaks
- accountability

Table 3
Sources of CAV-related open data around the world.

Type of Institute	Number	Examples
Research institutes	20	NCLT Dataset: The University of Michigan North
Self-driving companies	7	Waymo Open Dataset
Government departments	0	–

(Source: Authors. Based on information in Appendix C.)



Global Identity and Fraud Report (Experian, 2019)

https://www.edpb.europa.eu/sites/default/files/consultation/edpb_guidelines_202001_connectedvehicles.pdf

2. From access to application: platform operation

CAV data management

data cleaning,
reclassification, and
integration
storage, mining, and
analytics

large volume, variety,
speed
formats, languages,
consistency, geographical
barriers...

Transformation and incubation

Technical: programming
interface (API), graphical user
interface (GUI), web portals,
Cloud sites

Social: events, hackathons,
exhibitions, competitions,
incubators

Outcomes: new products and
services

Coordination and education

Coordinating data
contributors and developers

Arousing public awareness
technical communication,
commercial
cooperation, interest
coordination, and views
exchange

2. From access to application: platform operation

Hu et al., 2022

CAV data management



Contents lists available at [ScienceDirect](#)
Transportation Research Part C
journal homepage: www.elsevier.com/locate/trc

Processing, assessing, and enhancing the Waymo autonomous vehicle open dataset for driving behavior research

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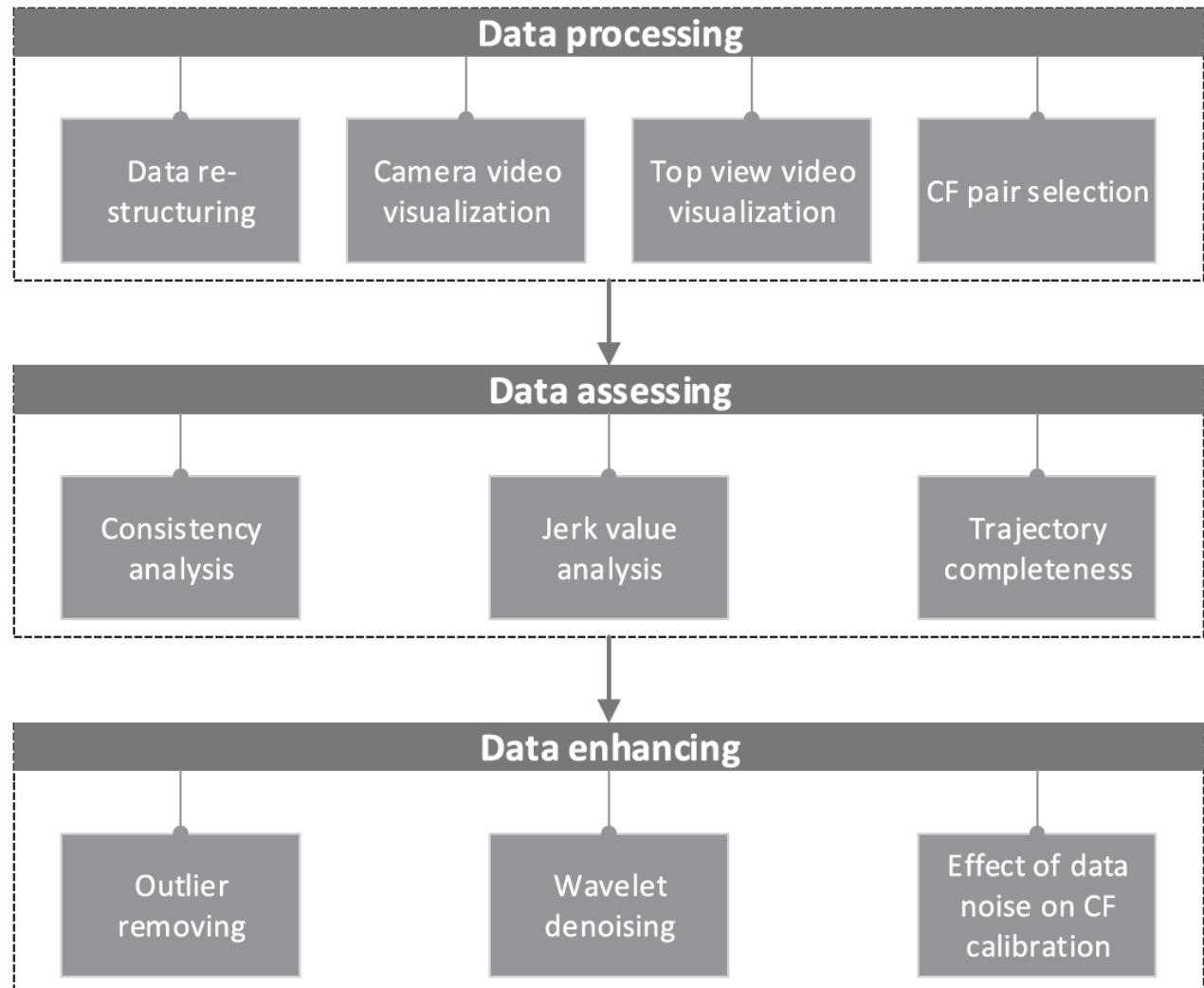


Fig. 1. Flow chart of the data processing, assessing and enhancing procedure; CF: car following.

2. From access to application: platform operation

Transformation and
incubation

Coordination and
education

MAR
24
2024

March 24 @ 2:00 pm - 3:00 pm

East Village Walking Tour: Explore NYC's invisible digital city

Lower East Side Playground 400 East 12th Street, New York

Uncover the unseen parts of Manhattan's East Village through a 45-minute walking tour led by Helpful Places in partnership with Sarah Batchu, a nonprofit leader and public servant. Together we will explore open datasets, smart cities infrastructure, and other urban gems hidden in plain sight. After the 45-minute walk we'll settle into a nearby coffeeshop [...]

Free



When: March 16-24, 2024

Where: Throughout New York City and online.



NYC Open Data Team

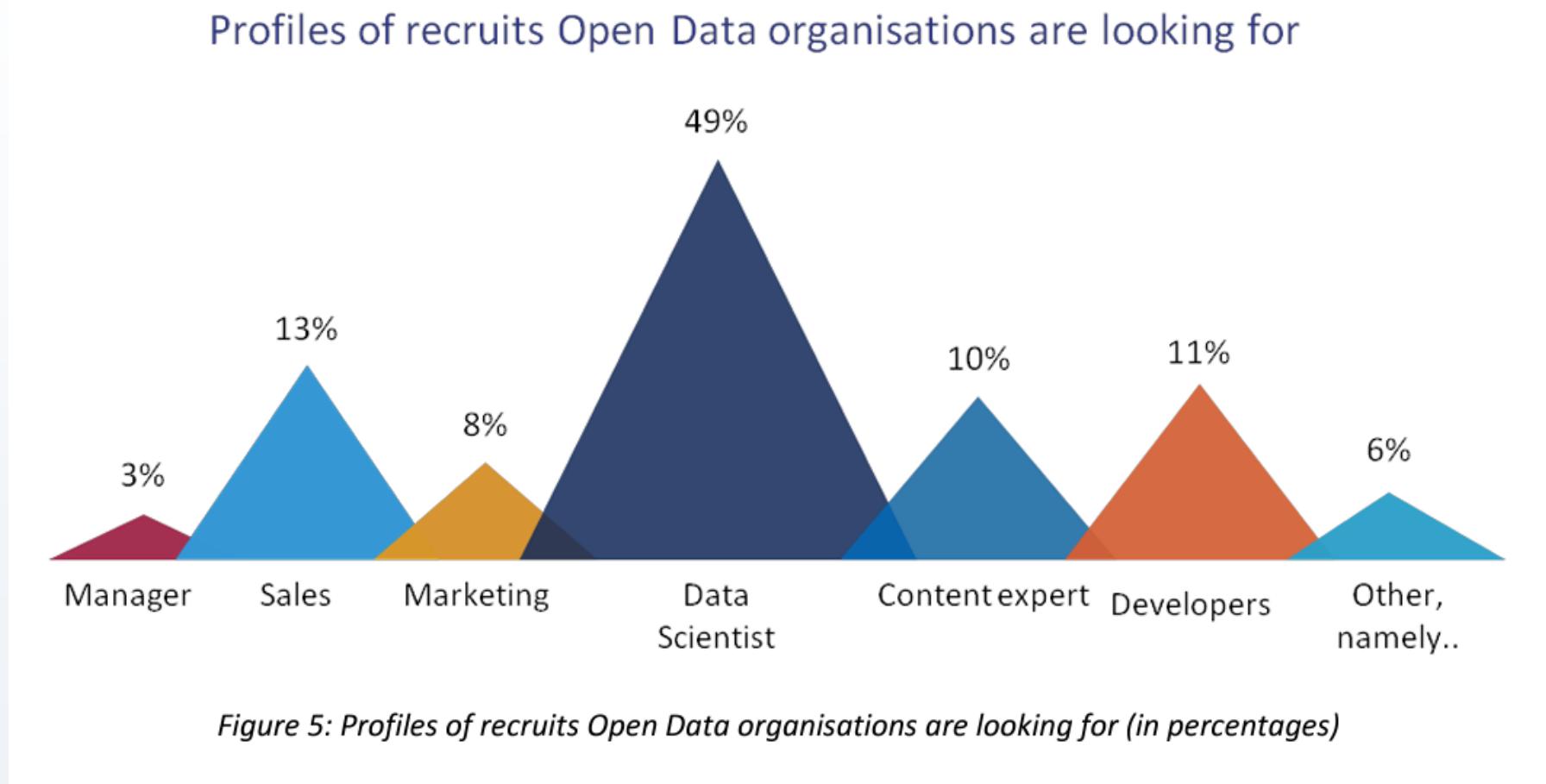
NYC Open Data is a free public resource with billions of rows of information about how New York City works. It is managed by the Open Data Team, which works with City agencies to make data available, coordinate platform operations and improvements, and promote the use of Open Data both within government and for every New Yorker.

The Open Data Team is part of the NYC Office of Technology and Innovation's Office of Data Analytics.

Learn more at nyc.gov/opendata and nyc.gov/oti.



2. From access to application: platform operation



3. CAV open data application

3.1 The private sector

3.2 The public sector

3.3 Society as a whole

3. CAV open data application

3.1 The private sector

CAV manufacturers

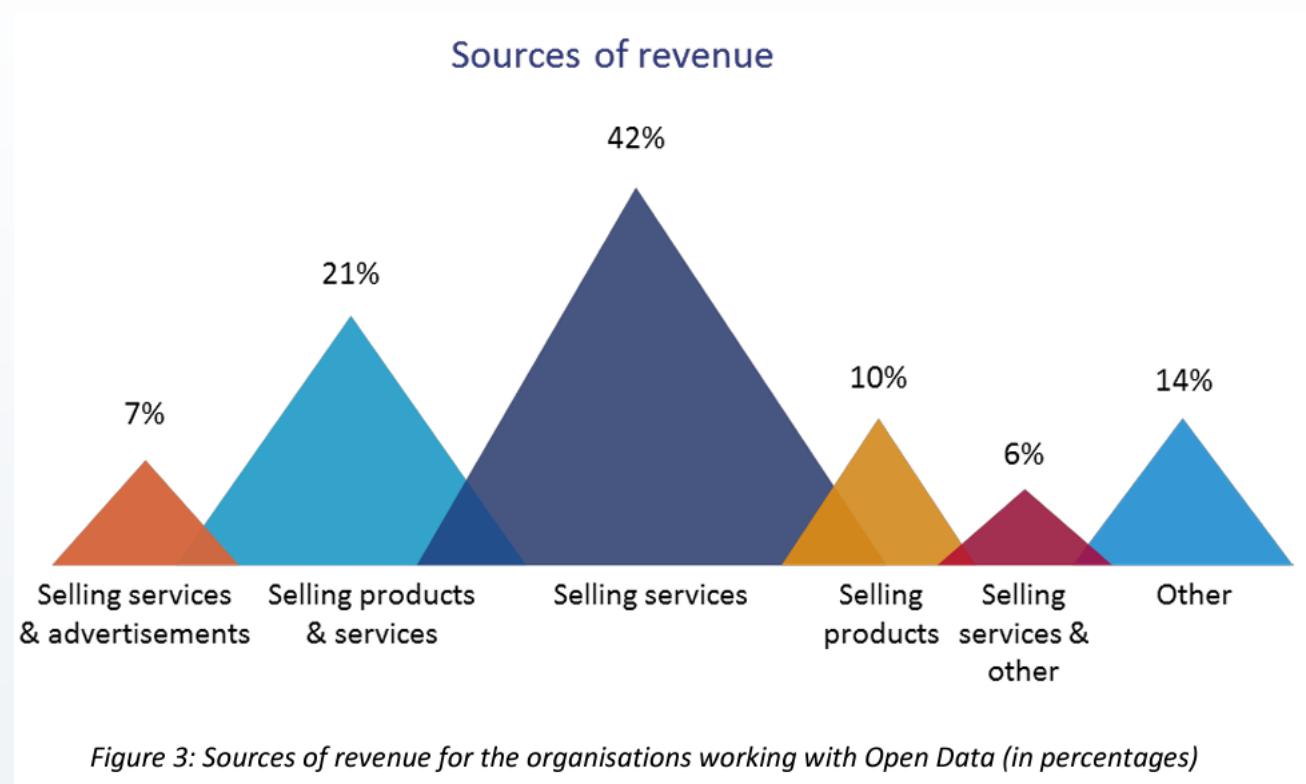
Customized services/products

Consulting

Finance

insurance model estimation

Small and young enterprises can benefit more (Berends et al., 2020).



Berends J., Carrara W., Engbers W., Vollers H. (2020)

3. CAV open data application

3.1 The private sector

CAV manufacturers

Policy paper

Finding the way forward: Location data to enable connected and automated mobility

Published 18 October 2023

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[Key definitions](#)

[Section 1: A developing sector](#)

[Section 2: Enabling safer deployment with location data](#)

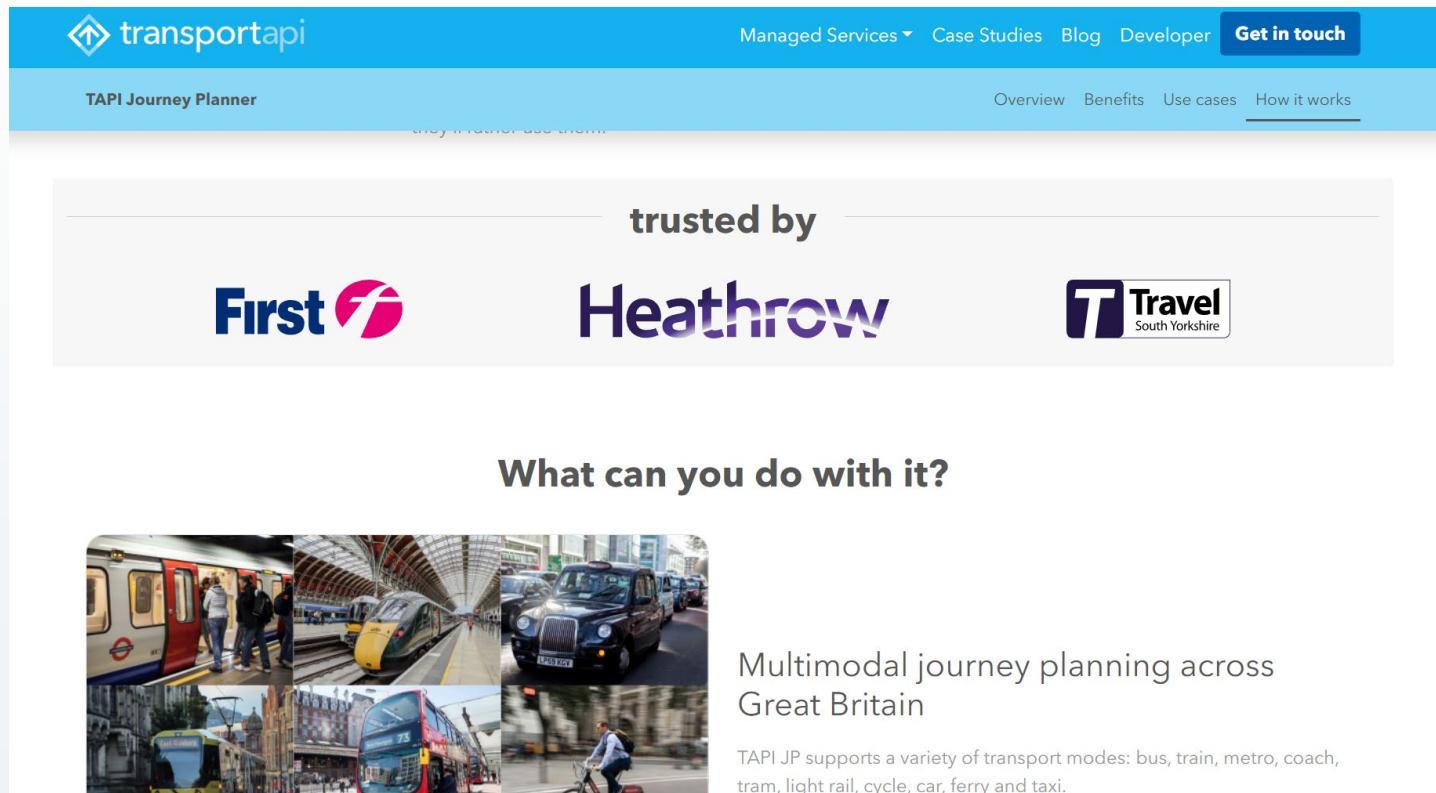
[Section 3: Opportunities to improve location data for connected and automated](#)

Executive summary

Connected and automated vehicles (CAVs) are no longer within the realm of science fiction. Connected and automated functionality is becoming more widespread in our daily lives, from [robot food and grocery delivery in Greater Manchester](#) to [driverless taxis in San Francisco](#). Connected and automated mobility (CAM) is part of the future of transport and could reduce congestion, improve accessibility and make our journeys safer and more efficient. The impact of CAM will be felt on the road, in the air and at sea.

This report highlights the role location data and location technologies will have in the safe deployment of CAM at scale on the UK's roads.
<https://www.gov.uk/government/publications>

Data-as-a-service (DaaS)



The screenshot shows the homepage of the TransportAPI website. At the top, there's a blue header bar with the TransportAPI logo on the left, followed by navigation links: Managed Services, Case Studies, Blog, Developer, and a prominent blue 'Get in touch' button. Below the header, a secondary navigation bar includes TAPI Journey Planner, Overview, Benefits, Use cases, and How it works, with 'How it works' being the active tab. A large section titled 'trusted by' features logos for First, Heathrow, and Travel South Yorkshire. Below this, a heading 'What can you do with it?' is followed by a collage of images showing various modes of transport: a subway train, a high-speed train at a station, several black London taxis, a double-decker bus, a person riding a bicycle, and a person walking near a bus stop. To the right of the collage, text describes the service: 'Multimodal journey planning across Great Britain' and 'TAPI JP supports a variety of transport modes: bus, train, metro, coach, tram, light rail, cycle, car, ferry and taxi.'

TransportAPI, a *Data-as-a-Service* portal offered by Placr Ltd., provides a comprehensive UK transport data catalogue (<https://www.transportapi.com>)

3. CAV open data application

3.2 The public sector

CAVs offer *real-time* vehicle, road, and environmental data for decision-making.

The ODP *fuses* data from multiple sources to form a complete regional picture.

Urban and
transport planning
policymaking

Identifying dilapidated
construction
Route planning
Car parking

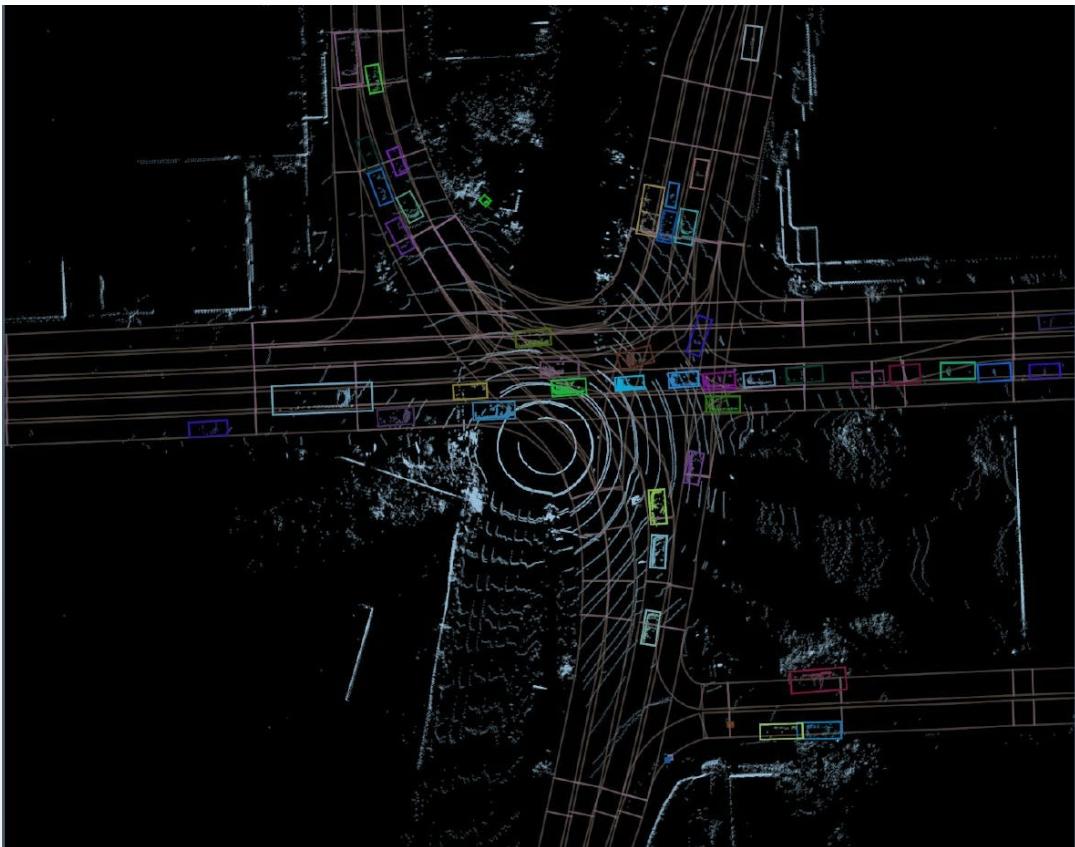
Mapping natural
resources and
monitoring
environmental risks

Mountain fire, pollution,
temperature, humidity...
Carbon emission monitor

Academia

Behavioural
Health
Commuting patterns

Transport planning



Large Car-following Data Based on Lyft level-5 Open Dataset: Following Autonomous Vehicles vs. Human-driven Vehicles

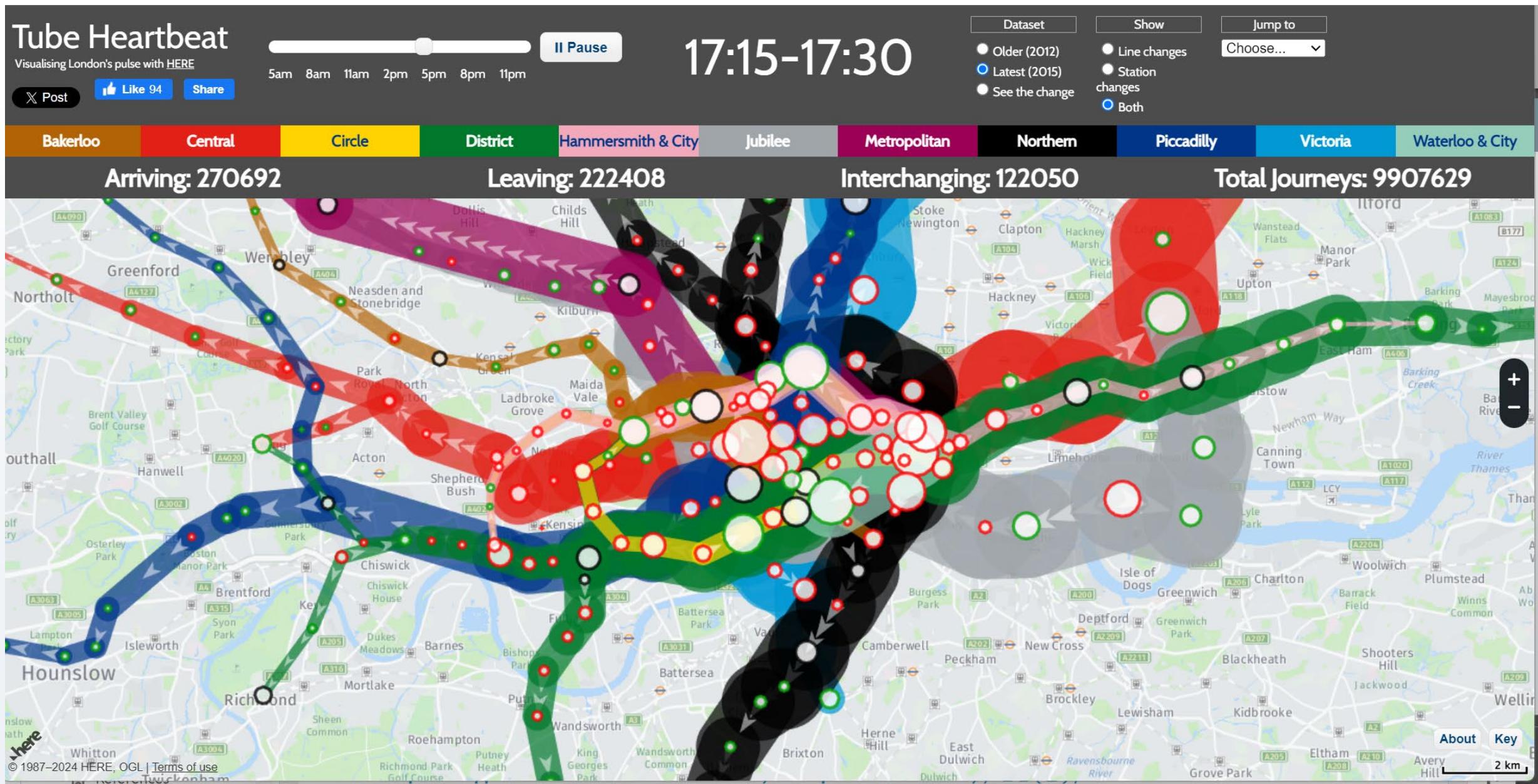
Guopeng Li^{1,*}, Yiru Jiao¹, Victor L. Knoop¹, Simeon C. Calvert¹, and J.W.C. van Lint¹

Abstract— Car-Following (CF), as a fundamental driving behaviour, has significant influences on the safety and efficiency of traffic flow. Investigating how human drivers react differently when following autonomous vs. human-driven vehicles (HV) is thus critical for mixed traffic flow. Research in this field can be expedited with trajectory datasets collected by Autonomous Vehicles (AVs). However, trajectories collected by AVs are noisy and not readily applicable for studying CF behaviour. This paper extracts and enhances two categories of CF data, HV-following-AV (H-A) and HV-following-HV (H-H), from the open Lyft level-5 dataset. First, CF pairs are selected based on specific rules. Next, the quality of raw data is assessed by anomaly analysis. Then, the raw CF data is corrected and enhanced via motion planning, Kalman filtering, and wavelet denoising. As a result, 29k+ H-A and 42k+ H-H car-following segments are obtained, with a total driving distance of 150k+ km. A diversity assessment shows that the processed data cover complete CF regimes for calibrating CF models. This open and ready-to-use dataset provides the opportunity to investigate the CF behaviours of following AVs vs. HVs from real-world data. It can further facilitate studies on exploring the impact of AVs on mixed urban traffic.

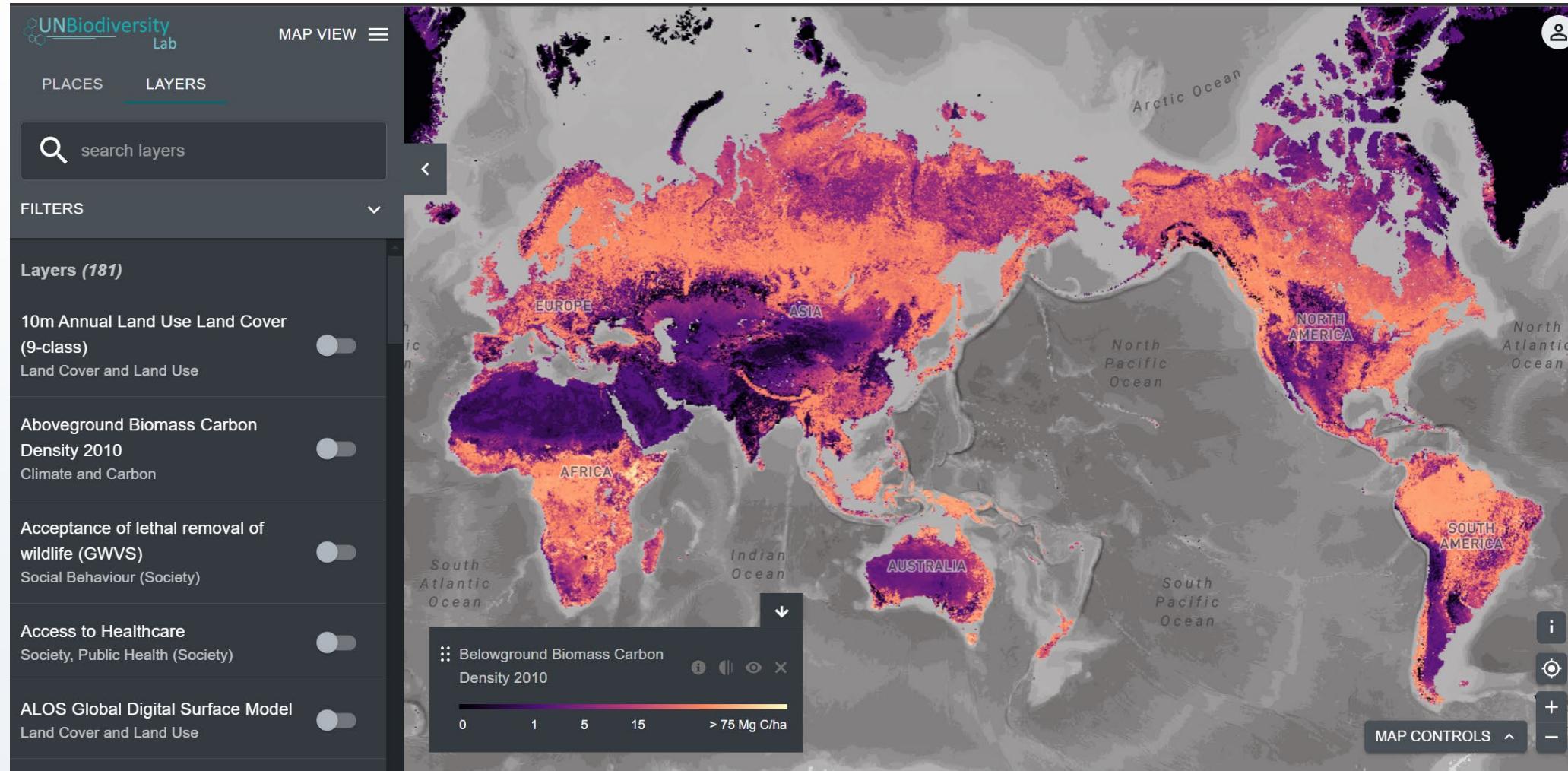
Index Terms— Car-following, trajectory dataset, autonomous vehicle, driving behaviour

or seemingly-real AV in different scenarios [8–10]. Similar experiments can also be carried out in a virtual environment by using driving simulators [11]. Field tests and simulations are controllable so researchers can focus on specific points of interest. However, due to cost limitations, these two approaches cannot provide comprehensive and large data covering diverse scenarios.

Recently, the release of autonomous driving datasets, such as Waymo [12], nuScenes [13], and Lyft5 [14], has enabled researchers to study AVs' impacts on traffic with real-world data. Hu et al. [15] offer the first attempt to process a CF dataset from the Waymo dataset. However, because AVs are not marked in the entire dataset of Waymo, only 274 HV-following-AV (H-A) pairs and 1032 HV-following-HV (H-H) pairs are extracted. The limited amount of samples leads to contradictory findings. For example, Wen et al. [16] conclude that, compared with H-H, H-A has lower driving volatility, smaller time headways, and higher Time-to-Collision (TTC); while Hu et al. [17] found no significant difference between H-H and H-A, except for smaller spacing during congestion. To reduce the biases when using small datasets, a larger and



Natural resources



UN-biodiversity MapX

3. CAV open data application

3.3 Society as a whole

An individual's role is not only a consumer but also an engaged *citizen* (Milakis & Müller, 2021)

Enhancing public service efficiency and transparency.

Boosting sharing, innovation, and start-up urbanism.

CAV-ODP as an educational platform of emerging technologies: from acceptance to proactive participation.

Critical reflections

Why government?

A cost-benefit view

- Externalities of CAV data application
- Internalising costs
- Maximising and sharing indirect benefits
- Overcoming the ‘anti-common tragedy’

from a technology-centric view of CAVs to a holistic approach to governance

Bringing platform capitalism and smart urbanism in dialogue

The private sector participation in data-generating platforms

- tech-giants fear?
- ‘black box’ of decision making
- lacking accountability
- disconnects platforms from place-based responsibilities
- a rising ‘platform logic’ (capital + tech)

The public sector in smart cities

- social monitoring and control?
- top-down oversight of urban systems
- ‘smart cities’ ending up as real estate construction

Emerging technology and data may change power dynamics.
Be careful.

Challenges

Privacy and security

Unexpected new categories of data generated

Cross-jurisdictional social impacts and inequalities (Caprotti et al., 2022): uneven global development and latecomers



English

Search

Important milestones

- February 2024 European AI Office
- January 2024 AI innovation package to support Artificial Intelligence startups and SMEs
- December 2023 Political agreement on the AI Act reached by the co-legislators
- June 2023 European Parliament's negotiating position on AI Act
- December 2022 General approach of the Council on AI Act
- September 2022 Proposal for an AI liability directive
- June 2022 Launch of first AI regulatory sandbox in Spain: Bringing the AI Regulation forward

Shaping Europe's digital future

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[Home](#) > [Policies](#) > [AI Act](#)

AI Act

The AI Act is the first-ever legal framework on AI, which addresses the risks of AI and positions Europe to play a leading role globally.

The AI Act aims to provide AI developers and deployers with clear requirements and obligations regarding specific uses of AI. At the same time, the regulation seeks to reduce administrative and financial burdens for business, in particular small and medium-sized enterprises (SMEs).

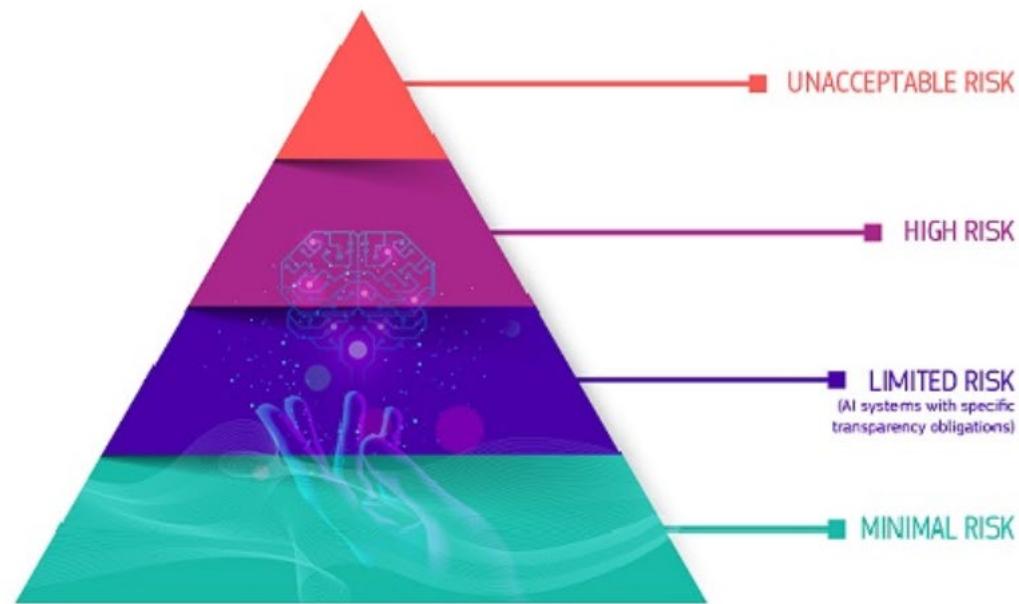
The AI Act is part of a wider package of policy measures to support the development of trustworthy AI, which also includes the [AI Innovation Package](#) and the [Coordinated Plan on AI](#). Together, these measures will guarantee the safety and fundamental rights of people and businesses when it comes to AI. They will also strengthen uptake, investment and innovation in AI across the EU.

The AI Act is the first-ever comprehensive legal framework on AI worldwide. The aim of the new rules is to foster trustworthy AI in Europe and beyond, by ensuring that AI systems respect



A risk-based approach

The Regulatory Framework defines 4 levels of risk for AI systems:



All AI systems considered a clear threat to the safety, livelihoods and rights of people will be banned, from social scoring by governments to toys using voice assistance that encourages dangerous behaviour.

Key references

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Thank you