







We are a diverse team with backgrounds in logistics, e-commerce, consulting & aviation





Project Background





Open source data science competition on **Kaggle** from CDP, a global **non-profit organization**



CDP persuades companies throughout the world to **measure**, **manage**, **disclose** and ultimately **reduce** their greenhouse gas emissions



Each year, CDP collects information from companies and cities worldwide about their climate strategy through a voluntary survey



CDP assigns rates to cities and companies based on their reporting transparency that have become an industry standard



- City-business partnerships have huge potential to reduce emissions on a greater scale than the city or business could manage alone."
 - City Business Collaboration Alliance



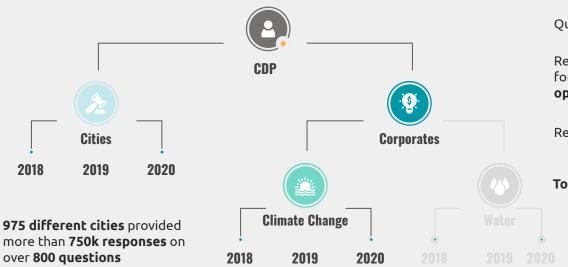
Project Objectives

Develop a methodology to measure the environmental actions of both cities and corporates with respect to social equity

Find areas where cities and corporates can collaboratively work on climate issues that do not perpetuate social inequity

We used survey data from cities and corporates collected between 2018 and 2020

Data file structure for questionnaires and responses



1292 unique corporates provided more than **1.1m responses** on over **800 questions**

A few of the obstacles

Questions differ from year to year

Response options were given in different formats including categorical, numerical and **open text**

Responses given in over 90 languages

Topics included:

- Risks and opportunities
- Climate Strategy
- Emission targets and performance
- Energy consumption
- Emissions breakdown

1,912,208

Valid answers in the data set

8,010

Average number of responses per respondent

> 1000

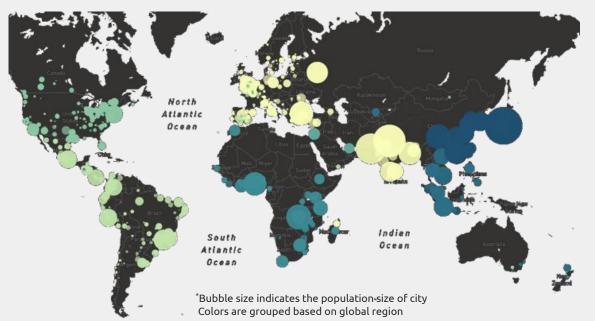
Pages of questionnaires

We analyzed each question one by one

Unlocking Climate Solutions

975 different cities of all sizes located in 94 countries have participated in the CDP survey

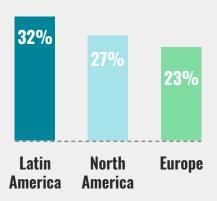
Global distribution of participating cities*



Population range:

400 **37m**

Regional distribution:



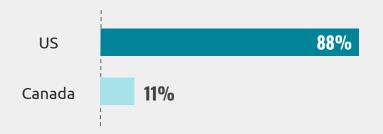
1292 North American companies from 11 industries and 240 sectors participated in the surveys between 2018 and 2020

General Information

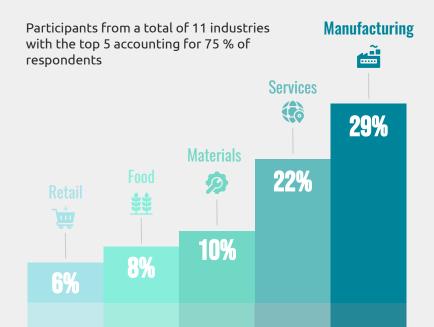
1292 different companies participated in the water and climate change surveys coming from over **240 sectors.**

Corporate disclosure rate has grown by **48%** from 2018 to 2020

Regional distribution:



Primary industry distribution



We developed the SCOREE methodology to measure the environmental and social footprint of cities & businesses

Social Equity

What are the social hazards of climate change and environmental action?

Opportunities

Which opportunities do cities and businesses arising from climate change?

Engagement

What level of engagement do cities and business show?



Collaboration

In what ways are cities and businesses collaborating to mitigate climate risks?

Risks

How at risk are cities and business and what threats arise?

Emissions

What are the current and projected GHG emission levels?

Using 36 criteria, our model captures the intersection of environmental & social action between cities & corporates

Scoring Methodology Cities **Corporates Social Equity** We assigned a total of **36 scores** across **6** tbd categories for cities and corporates For each score we used a similar scoring **C**ollaboration range from 0 to 5 in which we accounted for transparency and therefore rewarding higher scores for more disclosure: **Opportunities** 0 Risks No response Best possible provided outcome **E**ngagement missions



Let's explore the data together

We will conduct a live demonstration of our dashboard to get you a feeling for the CDP data and our scoring model

Unlocking Climate Solutions

City-business collaboration appears to be most promising for the development of clean technologies



Currently, **social equity** appears to play little to **no role** in corporates climate change planning



Thematically, city-business collaboration appears to be most promising for the development of new technologies



At present, city-business collaboration seems to be most underdeveloped in the Asian regions as well as in Latin America

Collaboration along the corporate value chain and with cities is particularly missing in high emitting industries such as fossil fuels

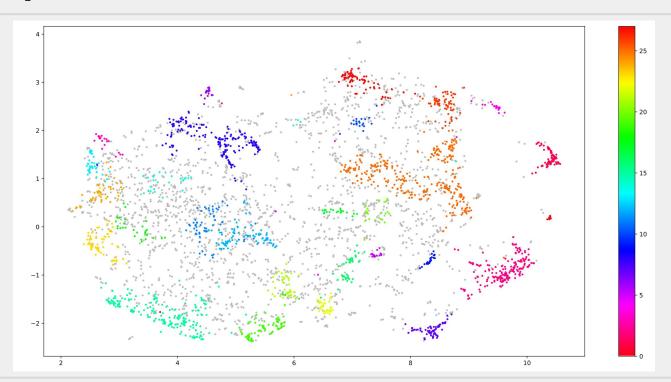
Backup



22,717,655

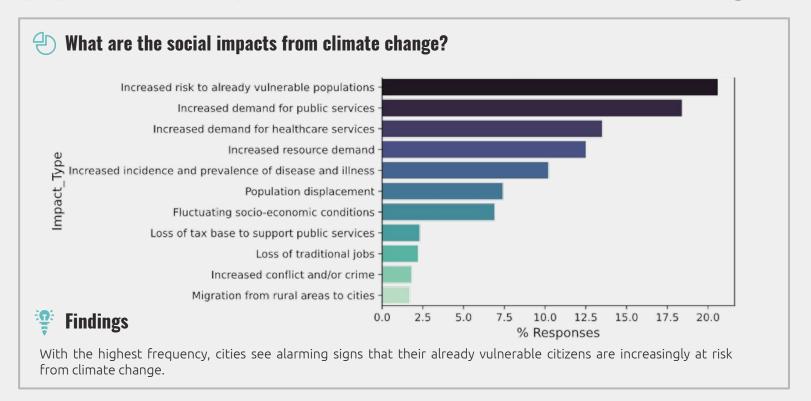
Words to be analyzed with natural language processing

We will apply topic clustering to identify groups from open text responses

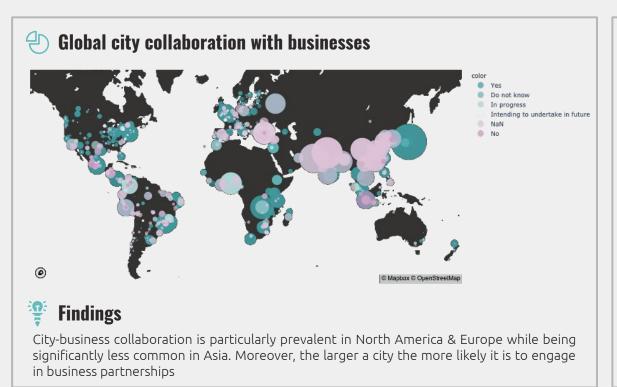


Additional Insights

Analyzing cities' responses shows that already vulnerable populations are particularly at risk from climate change

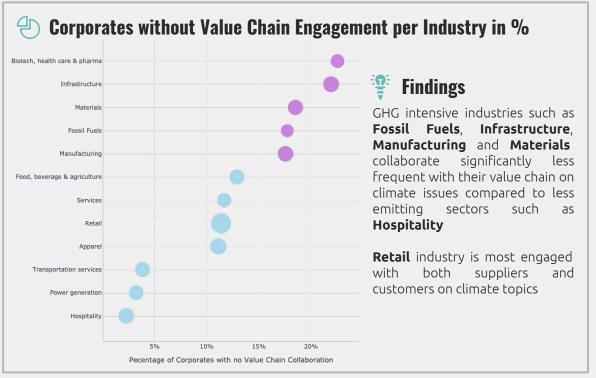


City-business collaboration is already prevalent in North America & Europe with larger cities leading the way



Collaboration score: Score based on the existence of a city-business partnerships, where: NaN **Collaboration area score** Score based on scope city-business partnerships, where: NaN areas

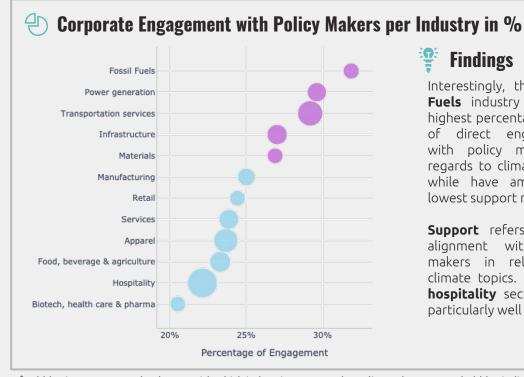
Corporates from GHG intensive industries collaborate less frequently with their value chain on climate issues



Value Chain Engagement Score based on level of value chain collaboration, where: 0 NaN Full Value Chain **Supply Chain** Score based level of engagement with supply chain, where: NaN Co-creation with suppliers

Bubble size represents the percentage of companies in that industry collaborating with both suppliers and customers.

Similarly, these corporates tend to engage more frequently with policy makers with a non-supportive position



Findings

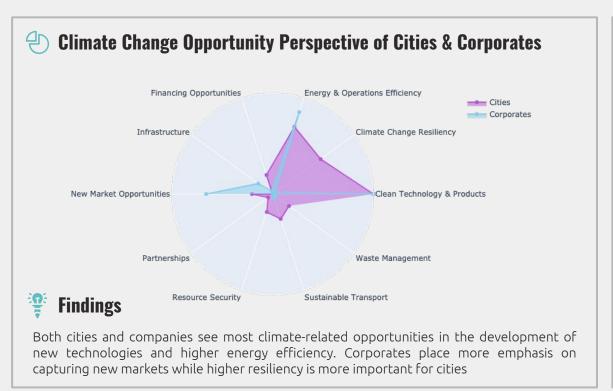
Interestingly, the **Fossil Fuels** industry has the highest percentage (32%) direct engagement with policy makers in regards to climate topics while have among the lowest support rate

Support refers to the alignment with policy makers in relation climate topics. Here, the hospitality sector score particularly well



^{*}Bubble size represents the degree with which industries support the policy makers. Larger bubbles indicate higher level of support

Both Cities and Companies see climate-related opportunities in the development of new technologies and energy efficiency



Opportunity Scores Cities

Scores based on identification of opportunities and identified pathway to maximize them, where:



NaN

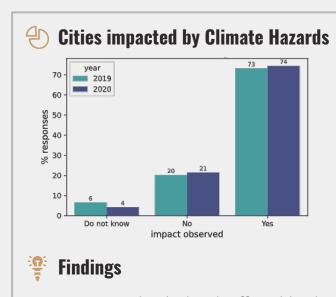
> 5 opportunities identified

Opportunity Scores Firms

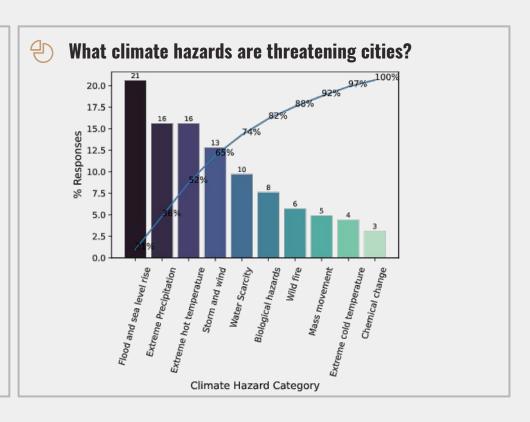
Scores based on number of identified opportunities with:



Risks Cities



Most cities are already directly affected by the threats of climate change. It can be assumed that socially disadvantaged groups are more frequently affected by extreme hot temperatures and water scarcity



Glance on some numbers

3,965,288	answers in the datasets	1,292	participating corporates
1,912,208	evaluable answers	975	participating cities
8,010	possible answers *	94	represented countries
753	different questions *	8	CDP Regions
186	different question headings ·	2	interviewed target groups
149	Number of pages ·		
36	evaluated core questions (scores)		
9	Questionnaires		
3	years considered (2018, 2019, 2020)	1	Dashboard

^{*} average per questionnaire

Challenges

- Questions differ from year to year
- Content of the question cannot be systematically determined
- Reply sequence partly individually selectable
- Numerical, categorical and free text mixed in one column
- Many false statements, transmission errors
- 90 different languages

So, we had to: Analyzing each question, one by one