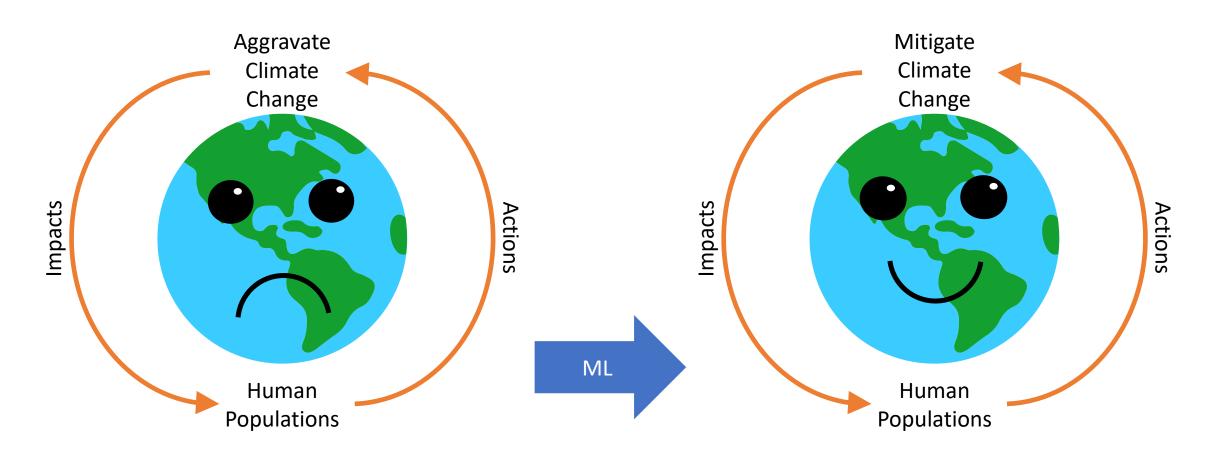
# The Human Effect Requires Affect

Addressing Social-Psychological Factors of Climate Change with Machine Learning



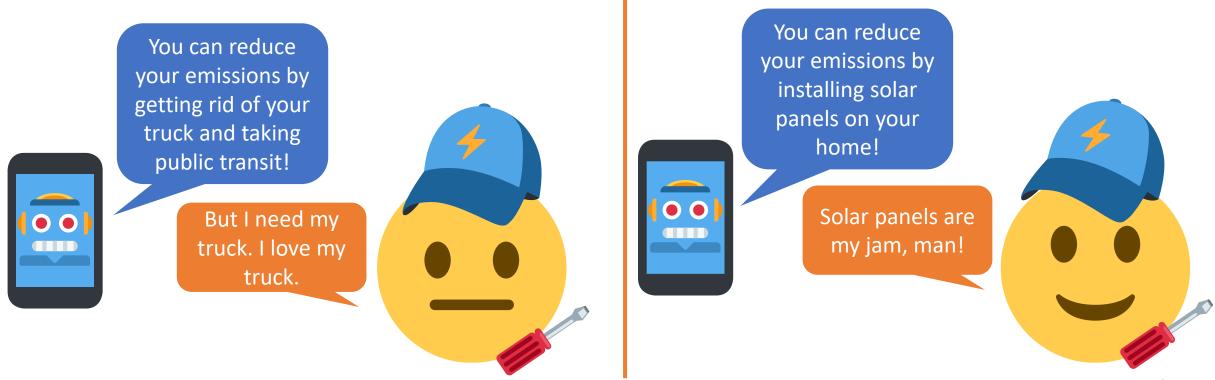
### Climate Change: A global collective action problem



- Ideally, machine learning will help address the human impact on climate change
- However, these ML approaches must take the complex and diverse nature of humans into account

### ML approaches should not be "one size fits all"

- Consider a ML based informational behaviour intervention to reduce emissions
- Though an intervention could be good for most people, it may not be right for some due to relevant social or psychological factors



## Social-Psychological factors in climate change

Socio-demographics:	Cognitive Factors:
• Age	<ul> <li>Cause knowledge</li> </ul>
• Gender	<ul> <li>Impact knowledge</li> </ul>
• Education	<ul> <li>Response knowledge</li> </ul>
Experiential processes:	Socio-cultural Influences:
<ul><li>Experiential processes:</li><li>Personal experience</li></ul>	Socio-cultural Influences: • Social norms

Affect has been found to be the single largest predictor of willingness to engage in mitigative behaviours

### Affect

- The underlying experience of feelings or emotions
- An evaluative heuristic that influences information processing
- Differs between individuals



Energy Usage: 240.68 kWh

Neighbourhood Avg: 321.44 kWh



#### Affective communication:



### Proposal: Affective ML for climate change

- 1. Use ML to model and learn affective identities of individuals
- 2. Evaluate how we could improve ML for climate change with two approaches
- (i) Agent Based Modelling
- Model behaviours and mitigation strategies in relation to climate structures and expected utilities with the addition of affective factors
- Helps understand the dynamics of how affect can influence the adoption of mitigative efforts at scale

- (ii) Simulated Climate Change Social Dilemma
- Small scale experiment where artificial agents attempt to aid a group of humans in avoiding simulated disastrous climate change
- Affective agents helping humans avoid toy collective-risk social dilemmas is a good first step to helping humans avoid the global-risk social dilemma of climate change

### Recap

- Machine learning approaches that contend with the human effects of climate change must account for human social-psychological factors
  - Humans are complex and diverse, not account for individuality may result in unintended outcomes
- With our proposed research we hope to demonstrate how incorporating affect can improve ML for tackling climate change
  - Affect is an important social-psychological factor in climate change

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  - Affect is an important social-psychological factor in climate change

#### Thank you!

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