

# The Hidden Emissions of Electric Vehicles

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**Are you anxious about...**

**...the increase in extreme weather events?**

# Flooding in Florida (April 2023)



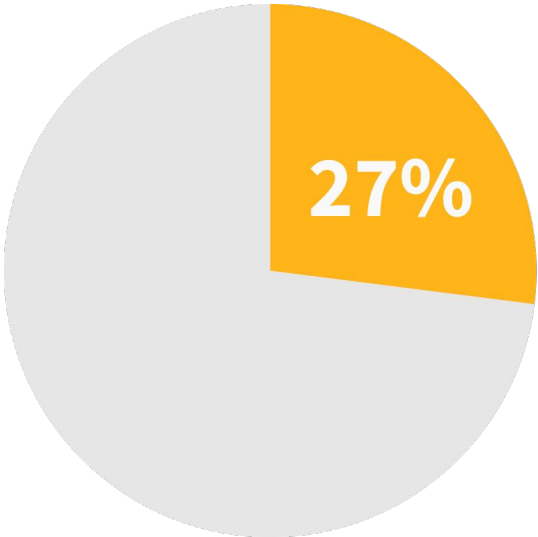
Joe Cavaretta | South Florida Sun-sentinel | Getty Images

# Bay Area Bomb Cyclone (January 2023)



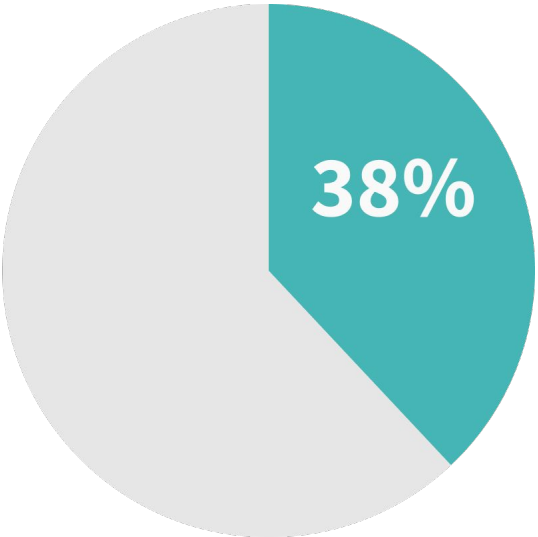
**Feeling the effects of climate change**

# Transportation contributions to greenhouse gas emissions in 2020:



**In the U.S.**

and



**In California**

# Strategies to Reducing Transportation Emissions



Develop sustainable  
passenger vehicles



Design  
walkable cities



Shift from passenger  
vehicles to public  
transportation



# Strategies to Reducing Transportation Emissions



Develop sustainable  
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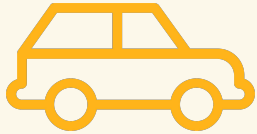
**California has required that by 2035:**

**All new passenger vehicles must be  
ZERO-EMISSION**

# What are Zero Emission Vehicles?

## Zero Tailpipe Emissions

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All Battery Electric Vehicle  
(BEV)

VS

## Tailpipe Emissions

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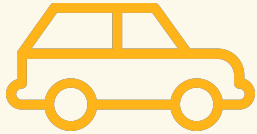


Internal Combustion Engine Vehicle  
(ICE)

# What are Zero Emission Vehicles?

## Zero Tailpipe Emissions

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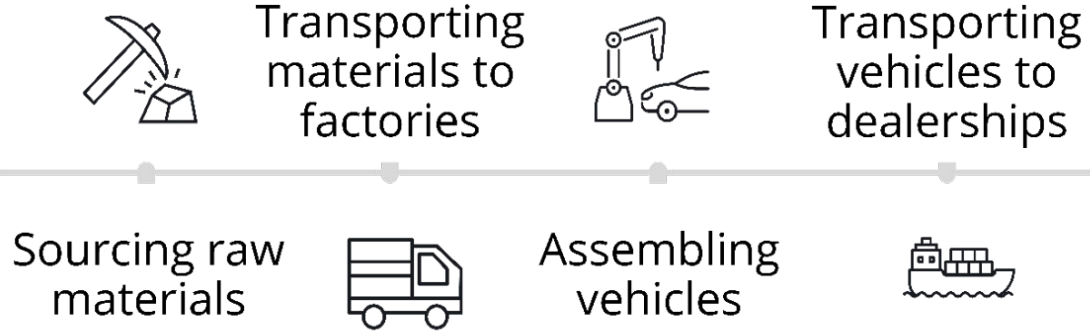


Internal Combustion Engine Vehicle  
(ICE)

**How much do zero-emission  
vehicles truly emit?**

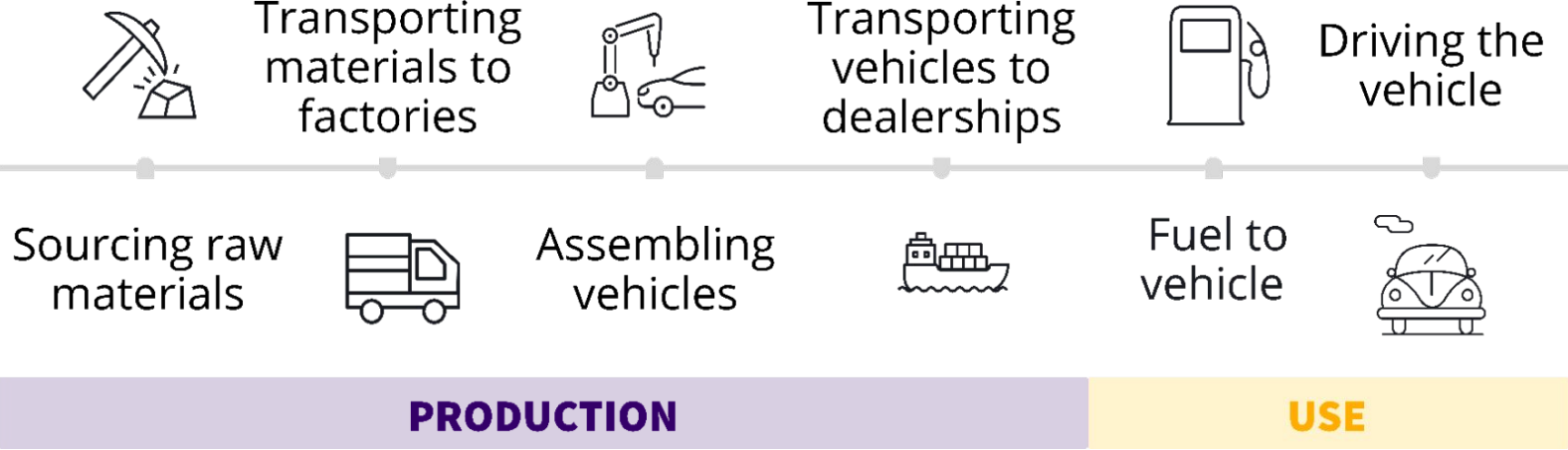
**Consider the entire vehicle life cycle.**

# Emissions over a Vehicle's Lifetime



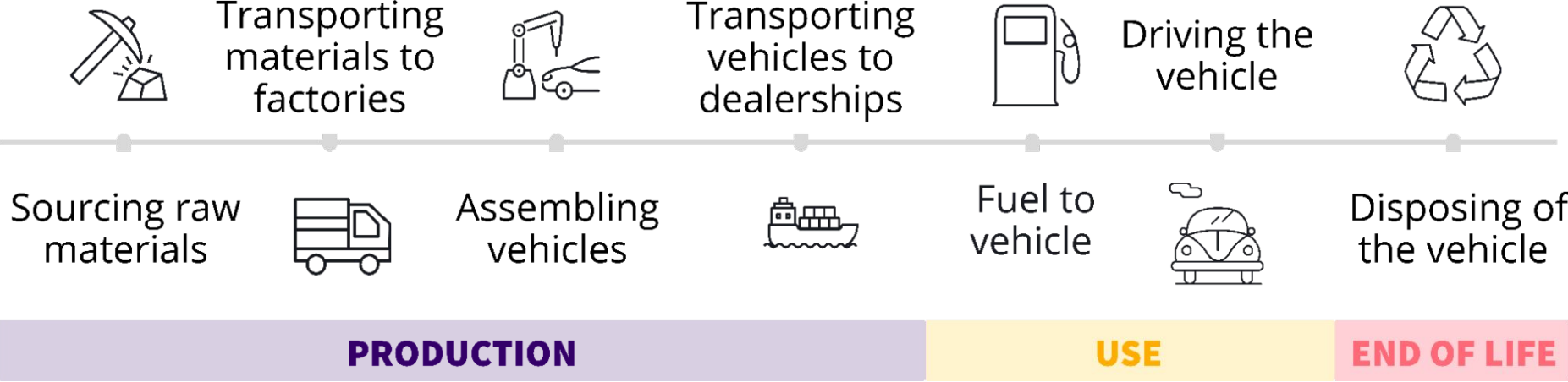
**PRODUCTION**

# Emissions over a Vehicle's Lifetime

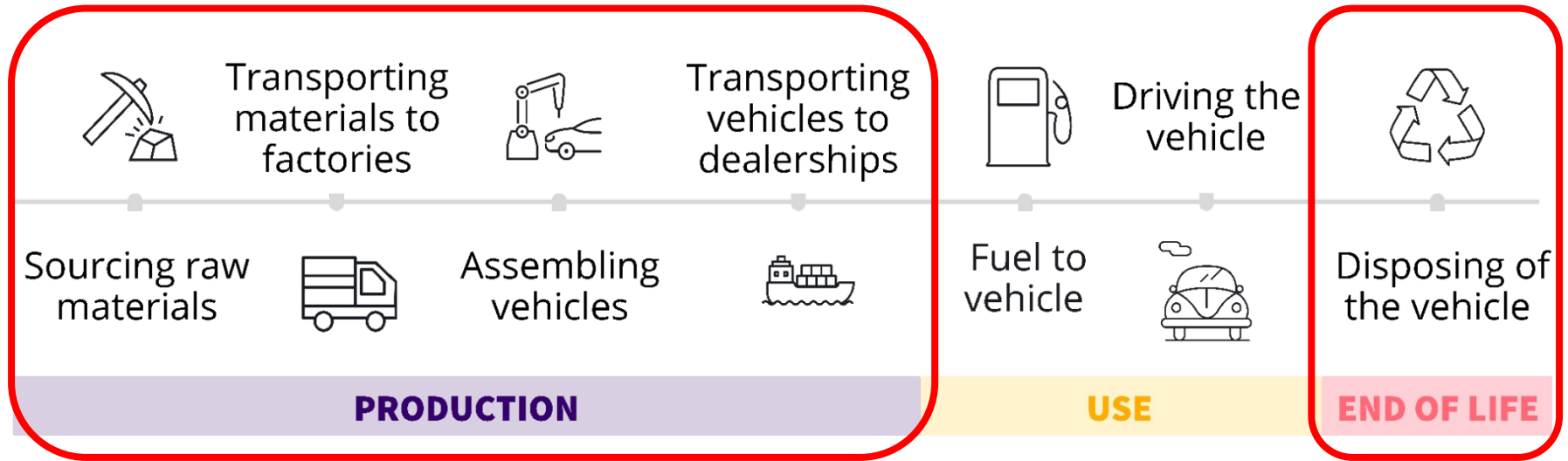




# Emissions over a Vehicle's Lifetime



# Problem #1: Emissions calculations are oversimplified and not comprehensive.





**Problem #2:** Current models are not accessible.

## **Our Solution:**



### **Emissions Explorer**

Calculates vehicle  
lifetime emissions



### **Interactive Website**

Storytelling to break down  
complex emissions issues

# Vehicle Emission Calculator Comparison

Emissions Calculators	Vehicle Selection	Location Selection	Use Phase	Production + End of Life
<b>Our Emissions Explorer</b>	✓	✓	✓	✓
<b>Evtool by Union Concerned Scientists</b>	✓	✓	✓	
<b>Driveclean by CARB</b>	✓	✓	✓	
<b>Evolution by Argonne</b>	✓		✓	
<b>Greenercars by ACEEE</b>	✓		✓	✓
<b>Beyond the Tailpipe by Oak Ridge</b>		✓	✓	
<b>Electricity Sources and Emissions by AFDC</b>			✓	

# Demo



Try our Emissions Explorer tool!  
[tinyurl.com/emissions-explorer](https://tinyurl.com/emissions-explorer)

# How does Emissions Explorer work?

## 1. User Inputs



Location



Length of  
Ownership



Vehicle

## 2. Emissions Estimate



Calculation from  
GREET model

## 3. Digestible Outputs



Quantitative  
Estimate



Contextualized  
Output

## 1. User Inputs



**Location**



Length of  
Ownership

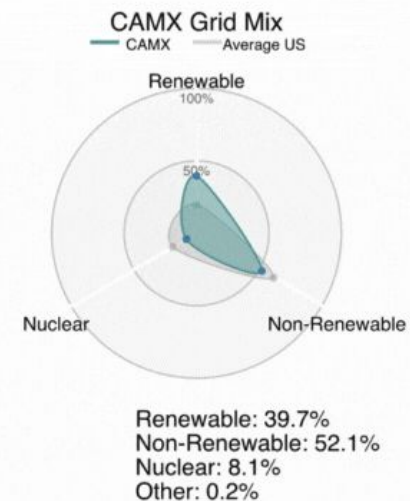


Vehicle

## 2. Emissions Estimate



## 3. Digestible Outputs





# 1. User Inputs



Location



Length of Ownership



Vehicle

# 2. Emissions Estimate

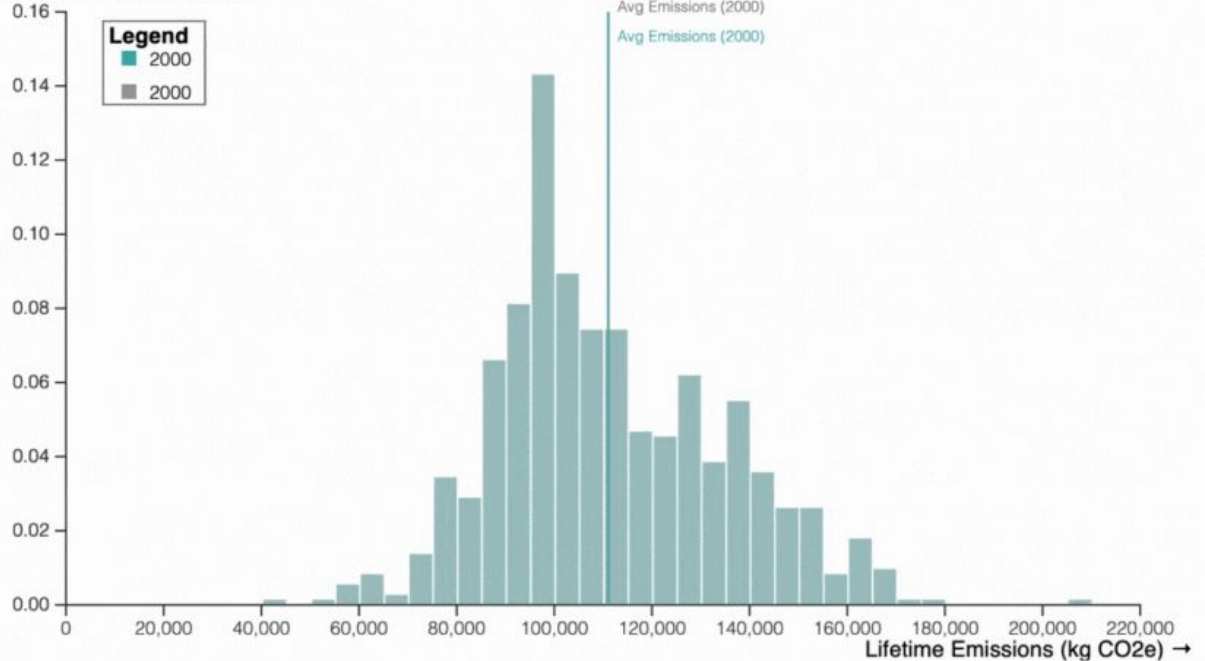
# 3. Digestible Outputs

Choose Year



### Vehicle Lifetime Emission Comparison with Model Year 2000

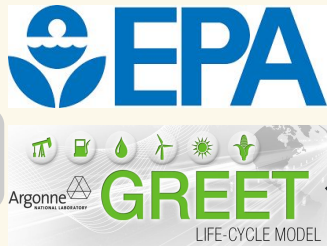
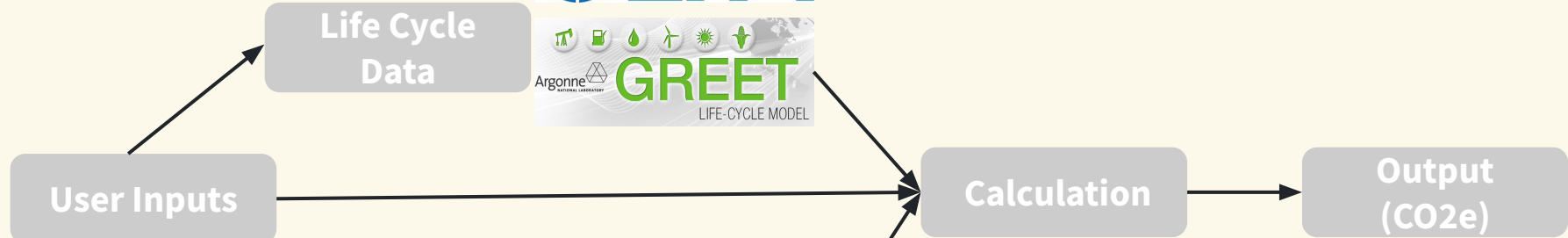
↑ Proportion of Vehicle Models



1. User Inputs

2. Emissions Estimate

3. Digestible Outputs



# Emissions Estimate: Calculations

PRODUCTION

USE

END OF LIFE

## Vehicle



## We include:

- Weight
- Composition
  - Steel
  - Aluminum
  - 30+ others

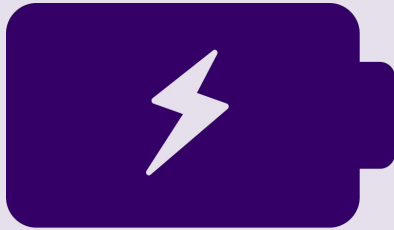
# Emissions Estimate: Calculations

PRODUCTION

USE

END OF LIFE

## EV Battery



### We include:

- Weight
- Capacity
- Chemistry
  - Li-Ion and NIMH

# Emissions Estimate: Calculations

**PRODUCTION**

**USE**

**END OF LIFE**

## **Combustion Vehicle**

- Fuel Efficiency
- Miles Driven

# Emissions Estimate: Calculations

PRODUCTION

USE

END OF LIFE

## Combustion Vehicle

- Fuel Efficiency
- Miles Driven

## Electric Vehicle

- Vehicle efficiency
- Miles driven
- ***Charging location***

# Emissions Estimate: Calculations

**PRODUCTION**

**USE**

**END OF LIFE**

## Consumables

Fluids



Battery



Tires



# Emissions Estimate: Calculations

PRODUCTION

USE

END OF LIFE



**Vehicle**

**We include:**

- Recycling method



**EV Battery**

**We include:**

- Recycling method
- Battery size



# Validating our Emissions Estimate

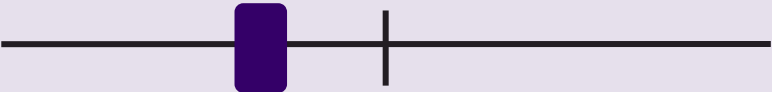
PRODUCTION

USE

END OF LIFE

Literature Range

EV Battery



Vehicle Body



**Within  
middle  
25%!**

# Validating our Emissions Estimate

PRODUCTION

USE

END OF LIFE

**+35%\***

\*Compared to EPA estimate

# Validating our Emissions Estimate

PRODUCTION

USE

END OF LIFE

**+35%\***

\*Compared to EPA estimate

## **We assume:**

- Fuel Emissions
- EV Emissions

# Validating our Emissions Estimate

**PRODUCTION**

**USE**

**END OF LIFE**

- Not many estimates and large uncertainty range
- Overall a small value
  - Less than 5% of total vehicle emissions

1. User Inputs

2. Emissions Estimate

3. Digestible Outputs

**127,095 kg CO<sub>2</sub>e**

1. User Inputs

2. Emissions Estimate

3. Digestible Outputs

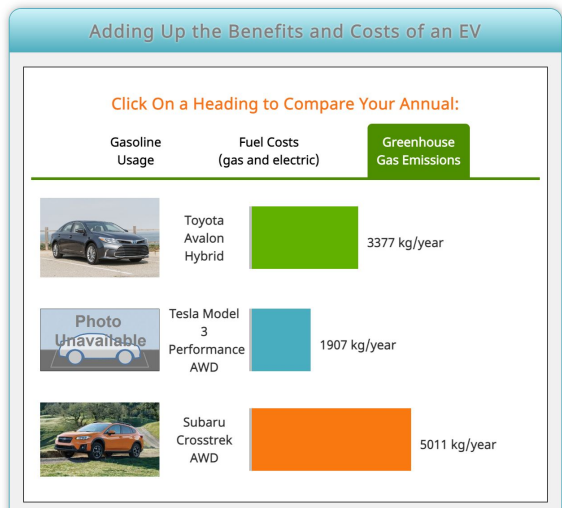
**127,095 kg CO<sub>2</sub>e**

**But what does this mean?**

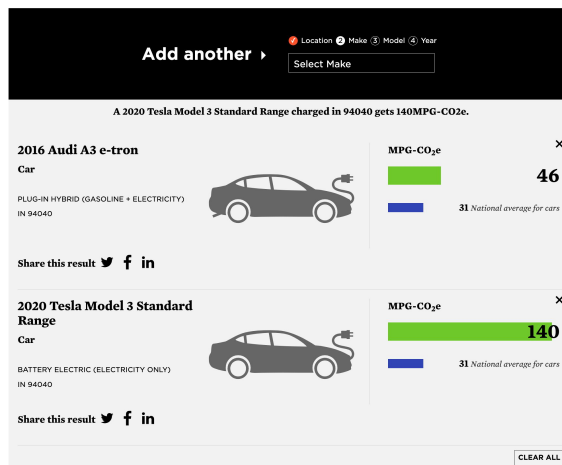
# 1. User Inputs

# 2. Emissions Estimate

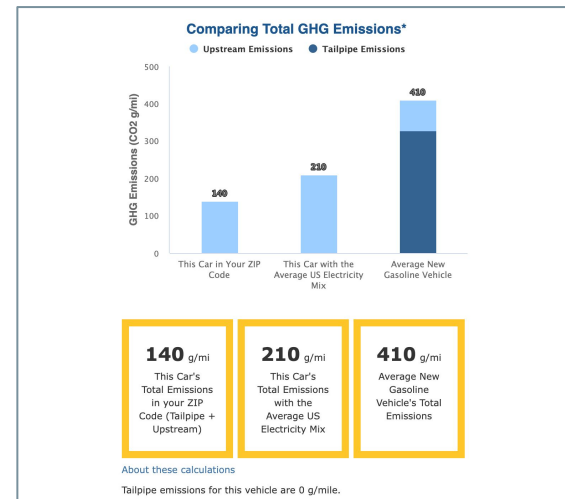
# 3. Digestible Outputs



Car Webtool "EVOLUTION" by Argonne National Laboratory



How Clean is Your Electric Vehicle by Union of Concerned Scientists



Beyond the Tailpipe Emissions Calculator by Oak Ridge National Laboratory

1. User Inputs

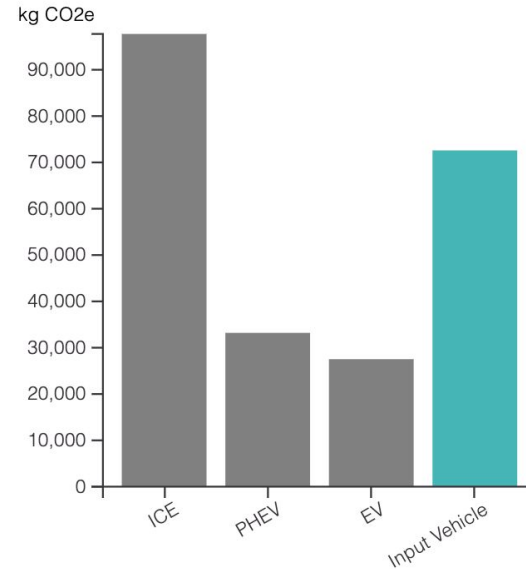
2. Emissions Estimate

3. Digestible Outputs

# 1. Context

# 2. Unitization

Lifetime Emissions Comparison to Vehicle Type Averages



\*Note: Averages shown in bar chart are based on zip code, model year, and planned number of miles for driving from user inputs.



1. User Inputs

2. Emissions Estimate

3. Digestible Outputs

1. Context

Your vehicle lifetime emissions is equal to emissions from



63

Round trip flights from SF to NYC

2. Unitization

1. User Inputs

2. Emissions Estimate

3. Digestible Outputs

Enter number of miles:

356

Minimum Number of Miles: 1, Maximum: 9999

### Estimated Emissions

Estimated Emissions: 145.18 kgCO<sub>2</sub>e

This is equivalent to emissions from an average American household using electricity for:

**1 WEEKS**



and

**3 DAYS**



and

**8 HOURS**



# 1. Context

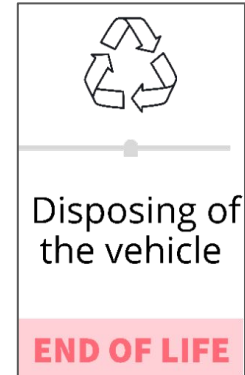
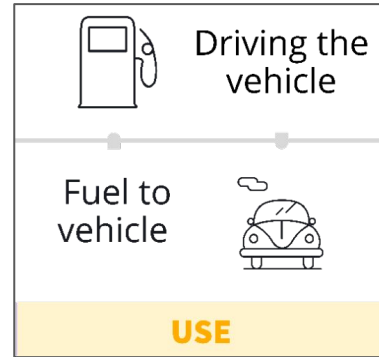
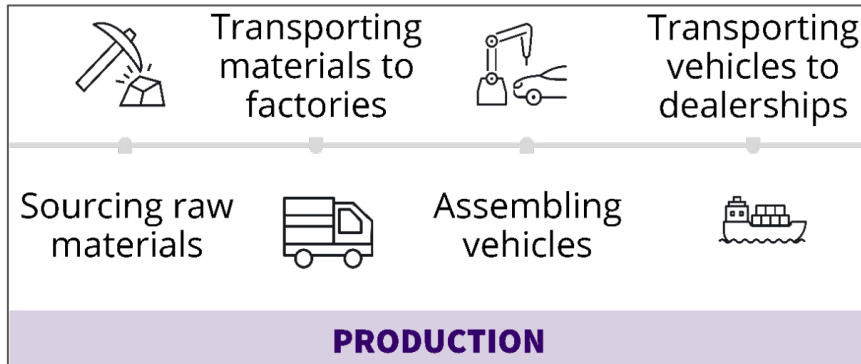
# 2. Unitization

**Measuring environmental impact...**

**...is more complex than just  
'zero tailpipe emissions.'**

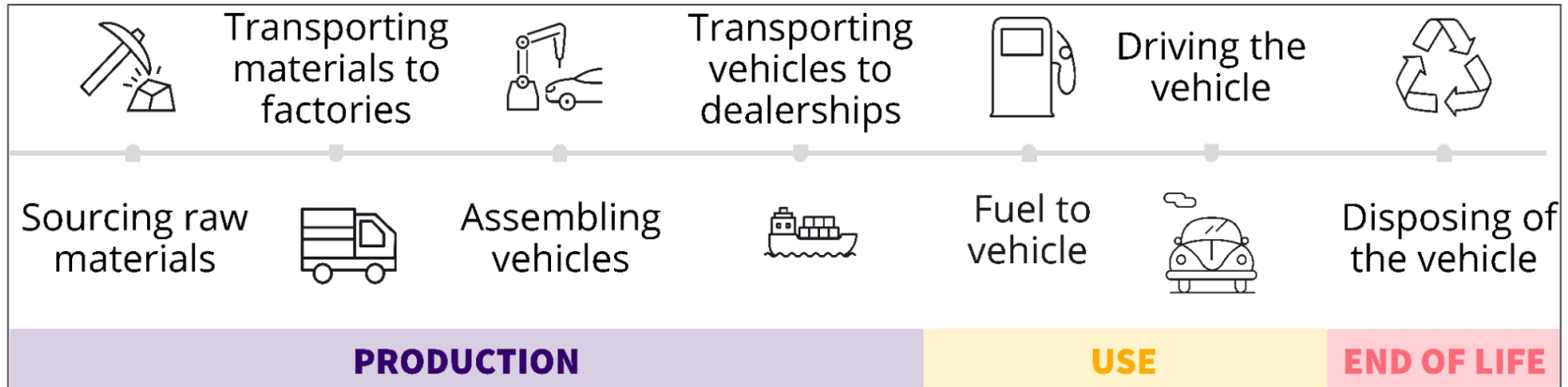
# Systems Thinking

Rather than focusing on **isolated parts...**

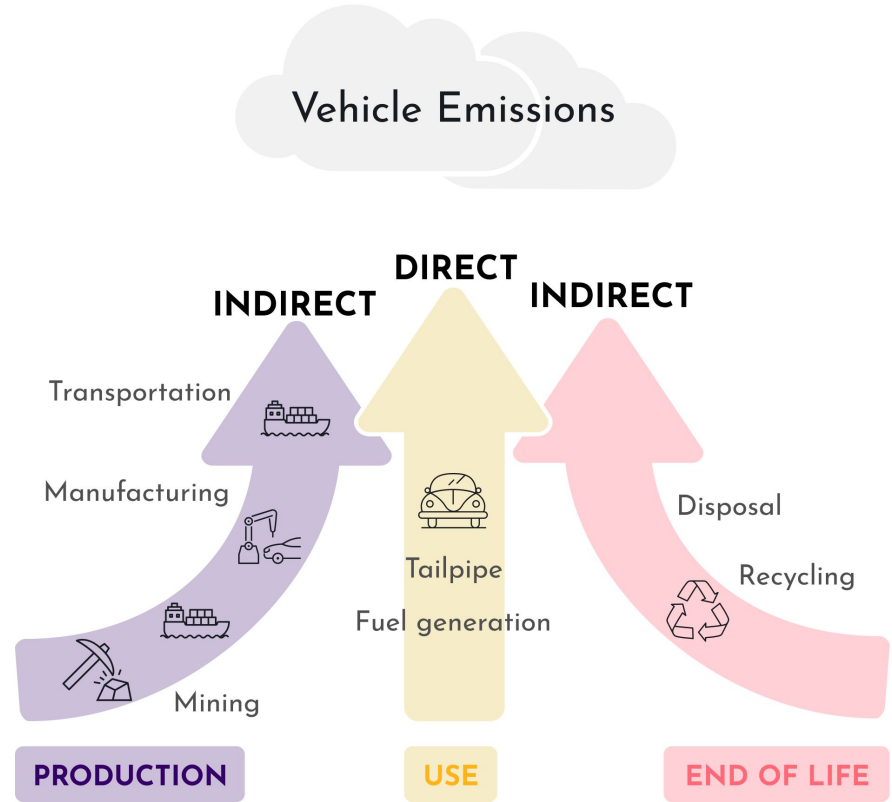


# Systems Thinking

...think in terms of **relationships and interactions**



Global Processes  
=  
Global Emissions



## **Systems Thinking**

**How may communities be affected by transitions to electric vehicles?**

# Access to Charging

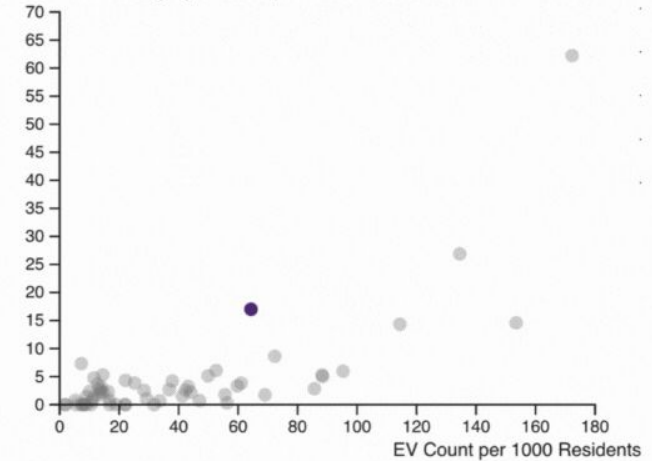


Selected County:  
**Los Angeles**

Est. Population: 9989165  
Number of EVs: 642677  
Total Public Chargers: 16744

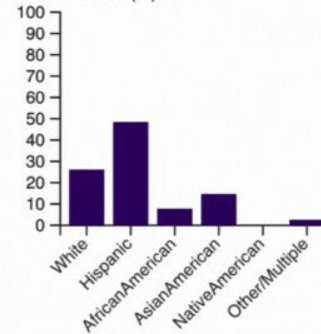
## 2021 Public EV Charging Stations vs. EV Ownership by County

↑ Public EV Charging Stations per 10000 Residents



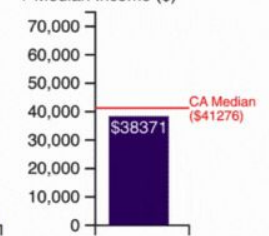
## Demographic Breakdown

↑ Contribution (%)



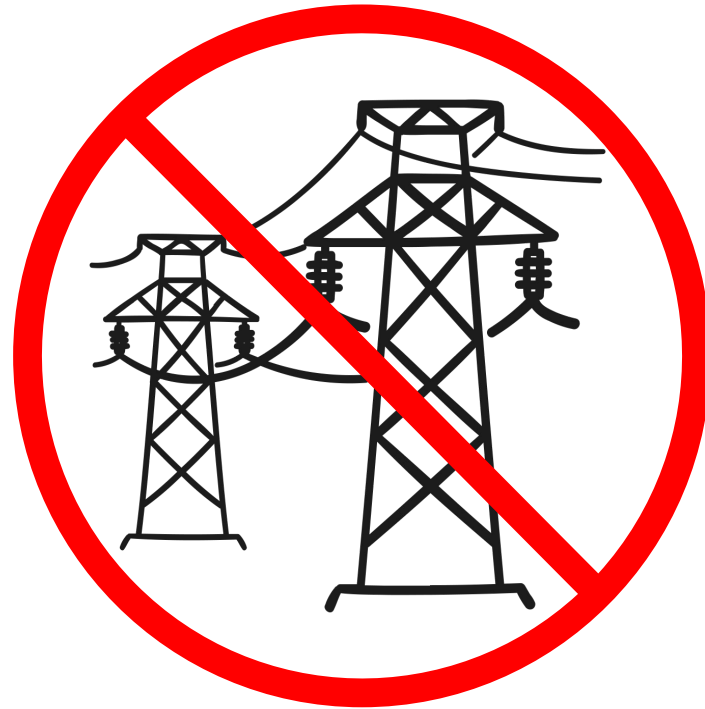
## Per Capita Median Income

↑ Median Income (\$)

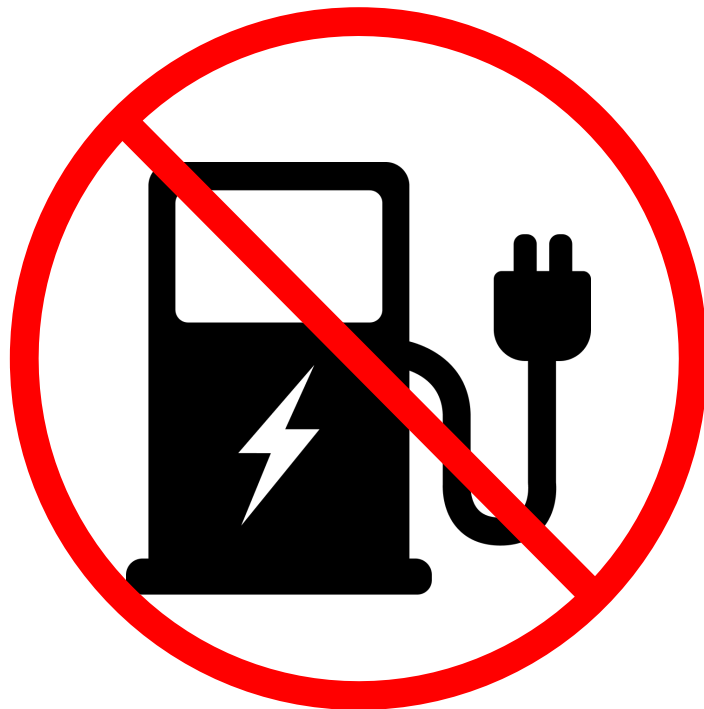
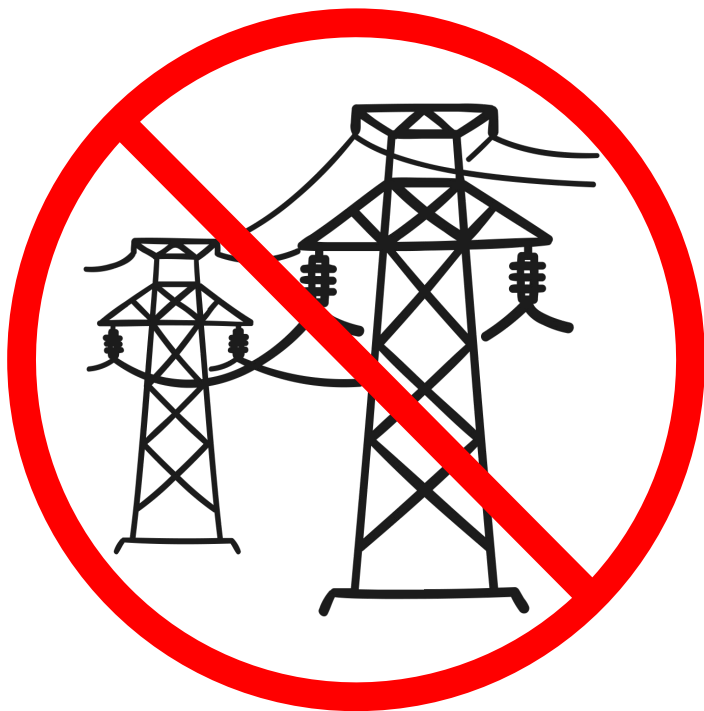




# Extreme Weather = No Power



# No Power = No Charging



# Strategies to Reducing Passenger Vehicle Emissions



Drive an EV

# Strategies to Reduce Passenger Vehicle Emissions



Drive an EV



Drive Less



Drive a Smaller Vehicle

**Think Bigger:  
Impact of electric vehicles on our  
environment and society**

# Ongoing Impact

## Reproducibility

- Documentation on GitHub
  - Open access data
  - Open source code

## Increasing Data Availability

- Conversations with the EPA
  - Realizing the lack of public-facing EV data
  - Plan to offer structured EV data to public

# Climate Change and Informatics

- Bridging the gap in communication of complex topics
- Translating scientific information into digestible concepts
- Collaborating across disciplines

# Thank you!

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## Questions?

We especially thank our advisor,  
Professor Marti Hearst!

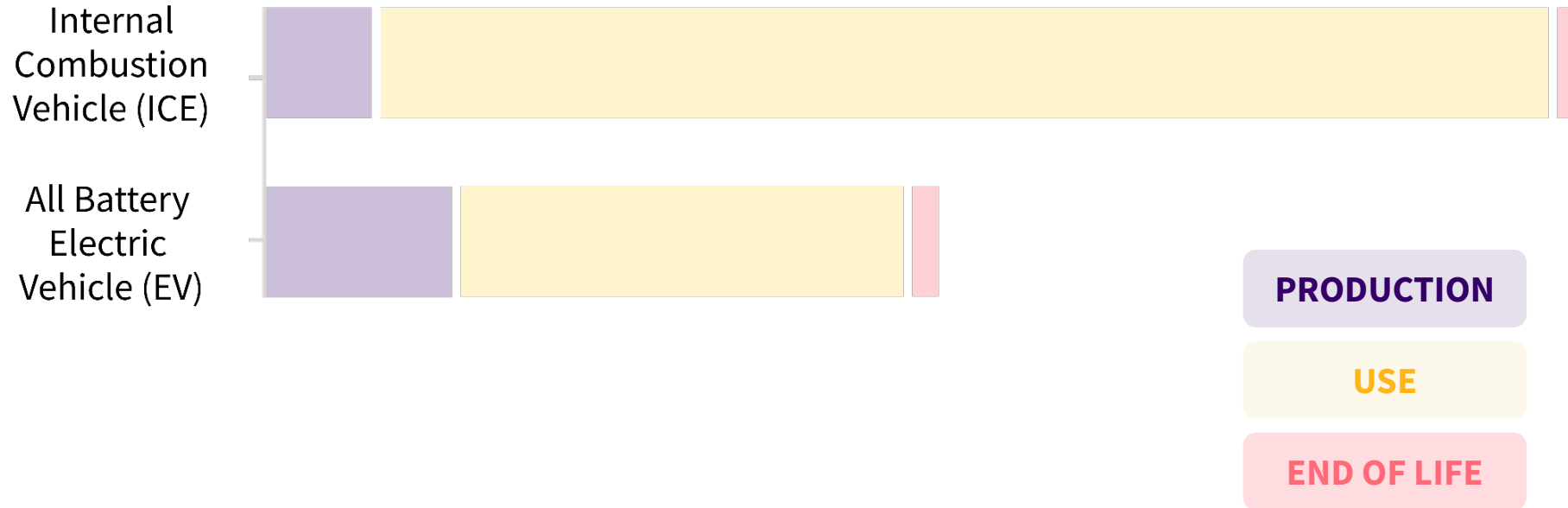


Try our Emissions Explorer tool!  
[tinyurl.com/emissions-explorer](https://tinyurl.com/emissions-explorer)



# Appendix

# What is difference of Lifetime Emissions between Vehicle Types?



# Next Steps

## Future Proofing

- Grid mix modeling over time
- Model-specific battery densities

## Future Work

- Temperature and humidity effects
  - Integrate with EPA MOVES Deep Learning model
- Integrate EPA-certified battery weights
- Model-specific material compositions

**END APPENDIX**