

The logo graphic consists of three overlapping parallelogram shapes. The top one is green, the middle one is blue, and the bottom one is purple. They are arranged in a way that they appear to be part of a larger, abstract shape.

CAMBRIDGE
SYSTEMATICS

Think  Forward

Incorporating Values and Perceptions into Travel Forecasting

presented to

Innovations in Travel Modeling

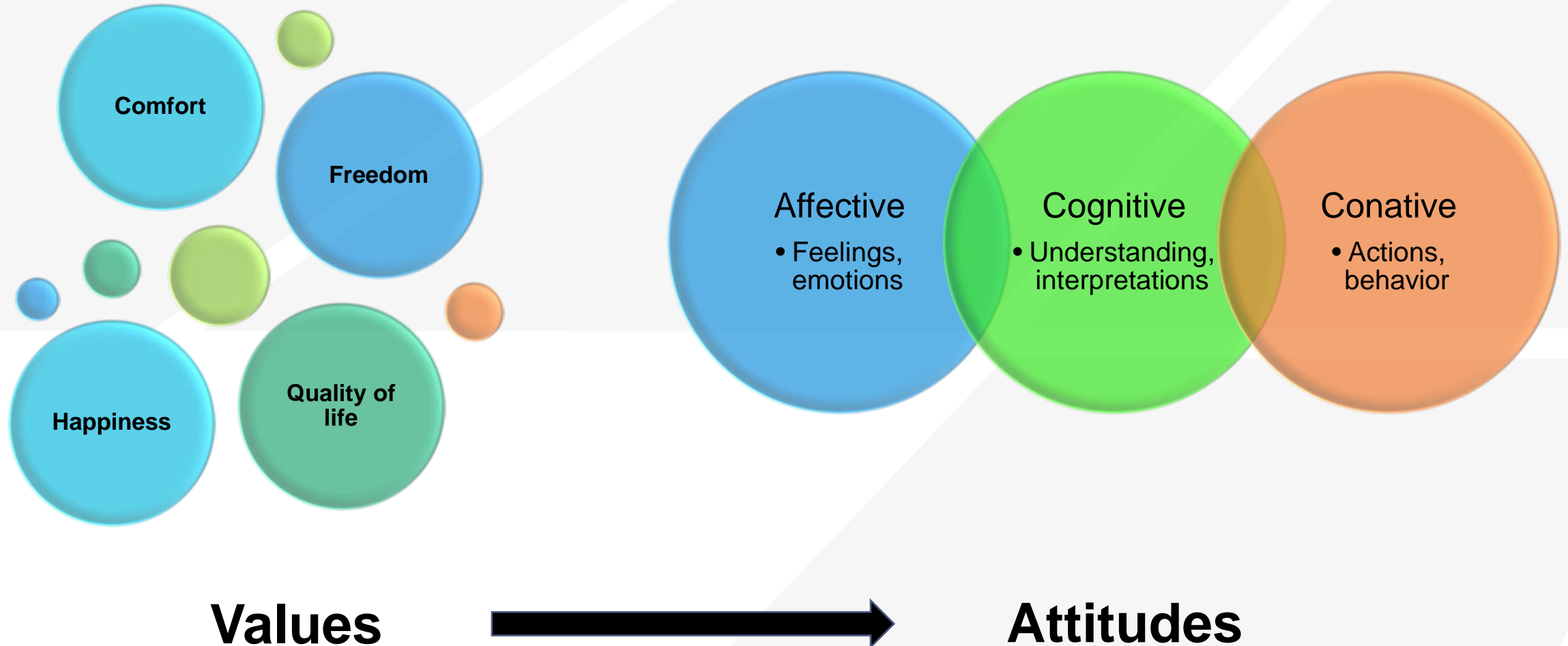
presented by

Cambridge Systematics, Inc.

Arun Kuppam

June 26, 2018

Values shape Attitudes



Confirmatory Factor Analysis

Latent Factors
(from factor analysis)

Explanatory variables
(for mode choice analyses)

Decision variables
(for policy purposes)

Traveler Attitudes



Need for Flexibility



Sensitivity to Personal Travel Experience



Desire to Help the Environment



Need for Time Savings



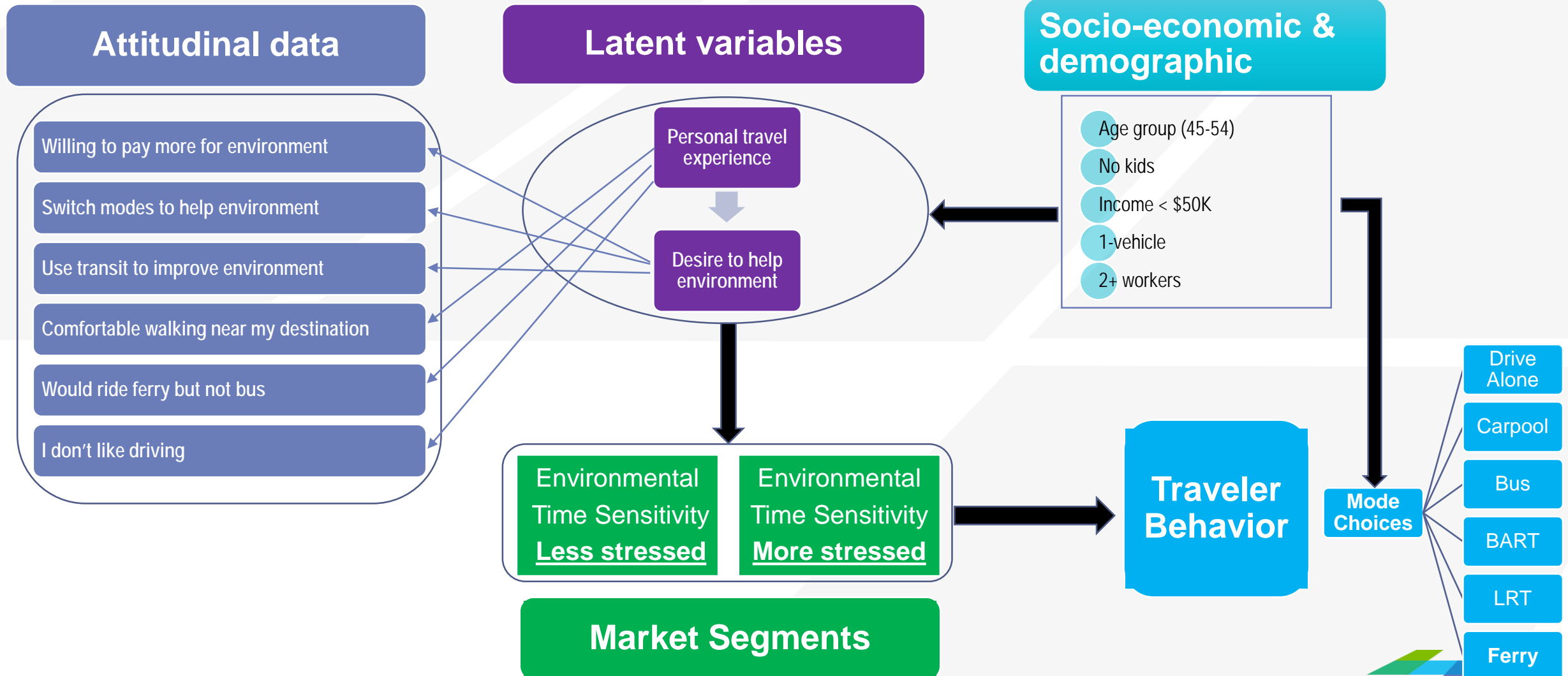
Insensitivity to Transport Costs



Sensitivity to Stress

Factor/Variable	Variable Statements	Coefficient	Std Error	t-value
Factor One	Desire to help the environment			
PAYENVIR	I would be willing to pay more when I travel if it would help the environment.	1.000		
MODENVIR	I would switch to a different form of transportation if it would help the environment.	0.949	0.028	33.447
TRNENVIR	Use of transit can help improve the environment.	0.376	0.018	20.887
Factor Two	Need for timesavings			
CHANGMOD	I would change my form of travel if it would save me some time.	1.000		
HURRY	I am usually in a hurry when I make a trip.	0.911	0.023	39.283
FASTEST	I always take the fastest route to my destination even if I have a cheaper alternative.	0.760	0.024	32.044
NOSTRESS	Having a stress-free trip is more important than reaching my destination quickly.	-0.680	0.030	-22.978
CROWDSOK	I'll put up with crowds if it means I'll get to my destination quickly.	0.657	0.020	32.082
COMFORT	I don't mind delays as long as I am comfortable.	-0.511	0.021	-23.848
DLDRIVE	I don't like to drive, but it is usually the fastest way to get where I need to go.	0.418	0.025	16.791
Factor Three	Need for flexibility			
VARIETY	I need to make trips to a wide variety of locations each week.	1.000		
NEEDFLEX	I need to have the flexibility to make many trips during the day if necessary.	0.841	0.031	27.555
REGULAR	Generally, I make the same types of trips at the same times of the day.	-0.489	0.023	-21.654

Deriving Market Segments

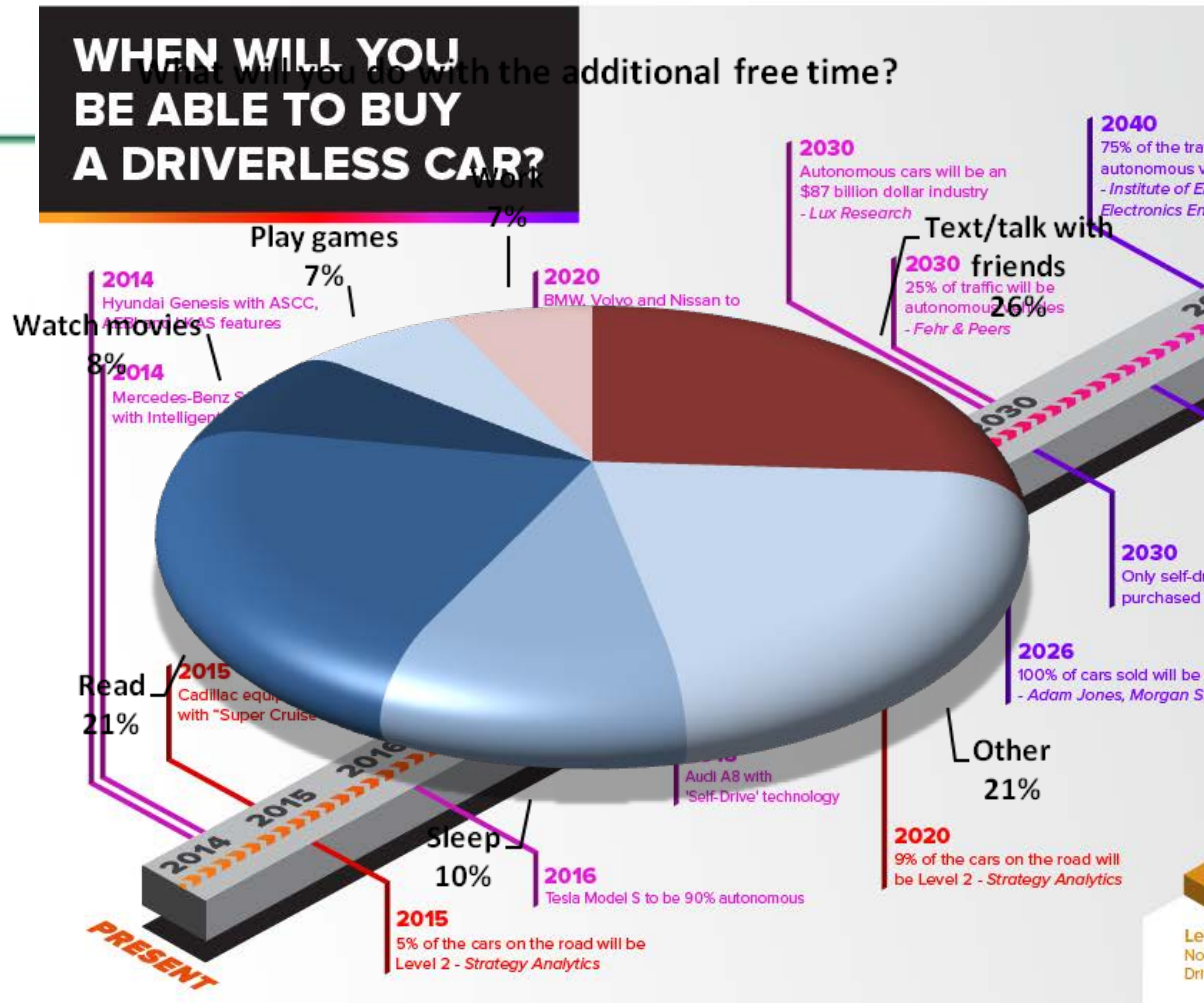


Innovations

Attitudes towards CAVs

Many consumers are very open to trying a self-driving car

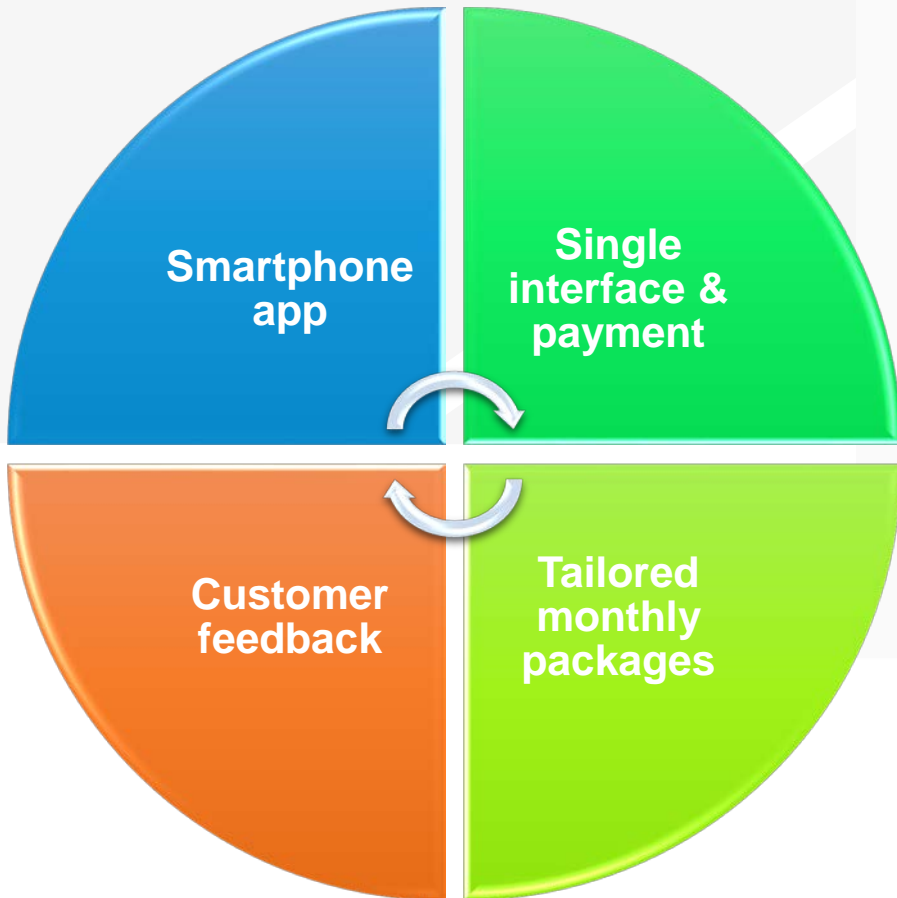
58% say they would take a ride in a fully self-driving car



Attribute	Response
Willingness to ride	58%
Willingness to let kids ride	35%
Willingness to share	38%
Willingness to buy	44%
Willingness to pay	50%
Cost of AV features	\$4,000 to \$10,000
Adoption rates	12% (2025), 25% (2035), 50% (2050)
Arrival of CAVs	2019-2025
Top 3 reasons to adopt	Insurance, safety, time savings
Major concerns	Safety, cybersecurity, technology
Market segments	Millennials, transit riders, ride hailers

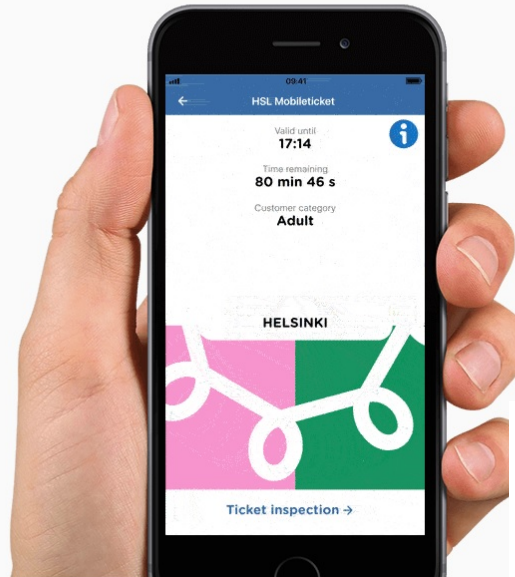
Sources: Mercedes-Benz, GM News, Strategy Analytics, Automotive News, Nissan News, Navigant Research, Volvo News, Fehr & Peers, Lux Research, IHS

Customer feedback in a Mobility-as-a-Service (MaaS) future

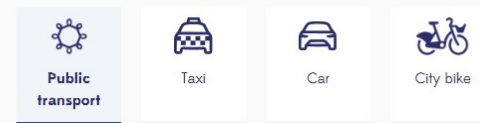


Monthly Plans About us News Help

Whim covers all your journeys



How it works

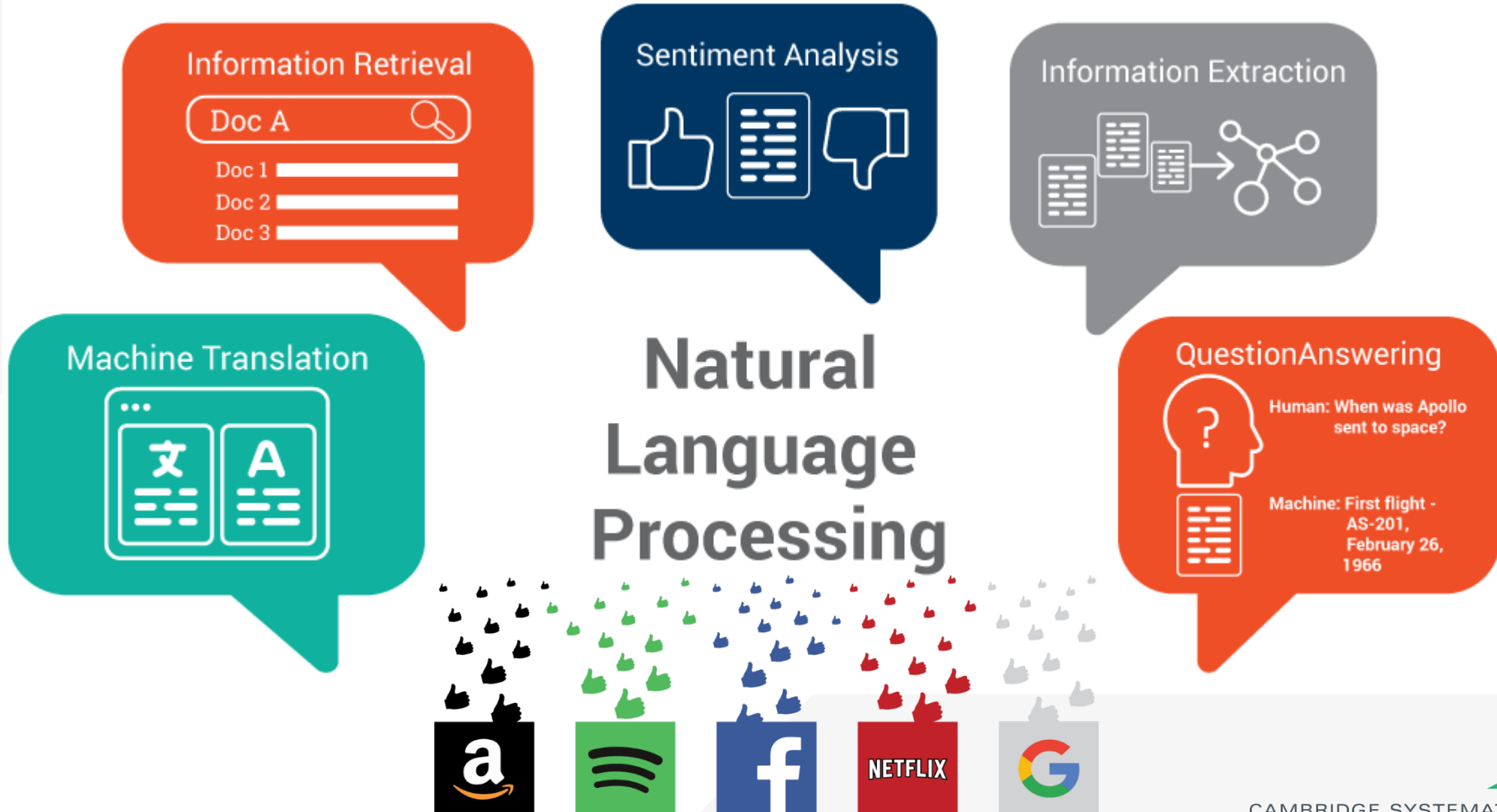


- 1 Choose how you want to travel
- 2 Grab a ticket
- 3 You're ready to go!

Current MaaS Packages – Offered Today

Light	Medium	Premium	Pay-as-you-go
<p>89€ /month</p> <p>Includes HSL Helsinki season ticket + 1.000 Whim points</p> <p>Use your Whim points as you like, for example:</p> <ul style="list-style-type: none"> 2 Taxi trips (~10 km/trip) daytime Unlimited local public transport 	<p>249€ Limited Offer: 100€ /month</p> <p>Includes HSL Helsinki season ticket + 5.500 Whim points</p> <p>Use your Whim points as you like, for example:</p> <ul style="list-style-type: none"> 8 Taxi trips (~10 km/trip) daytime Unlimited local public transport 2 days with a rental car 	<p>317€ /month</p> <p>Includes HSL Helsinki season ticket + 8.000 Whim points</p> <p>Use your Whim points as you like, for example:</p> <ul style="list-style-type: none"> 8 Taxi trips (~10 km/trip) daytime Unlimited local public transport 5 days with a rental car 	<p>Try Whim without commitment and upgrade whenever you like.</p> <p>Transport providers: </p> <p>We get you to your destination using your preferred mode of transport, letting you pay as you go – all in one app!</p>

Natural Language Processing



Sentiment Analysis

Process of computationally identifying and categorizing opinions expressed in a piece of text, especially in order to determine customer's attitude towards a particular topic, product, or service

SENTIMENT ANALYSIS



NEGATIVE

Totally dissatisfied with the service. Worst customer care ever.



NEUTRAL

Good Job but I will expect a lot more in future.

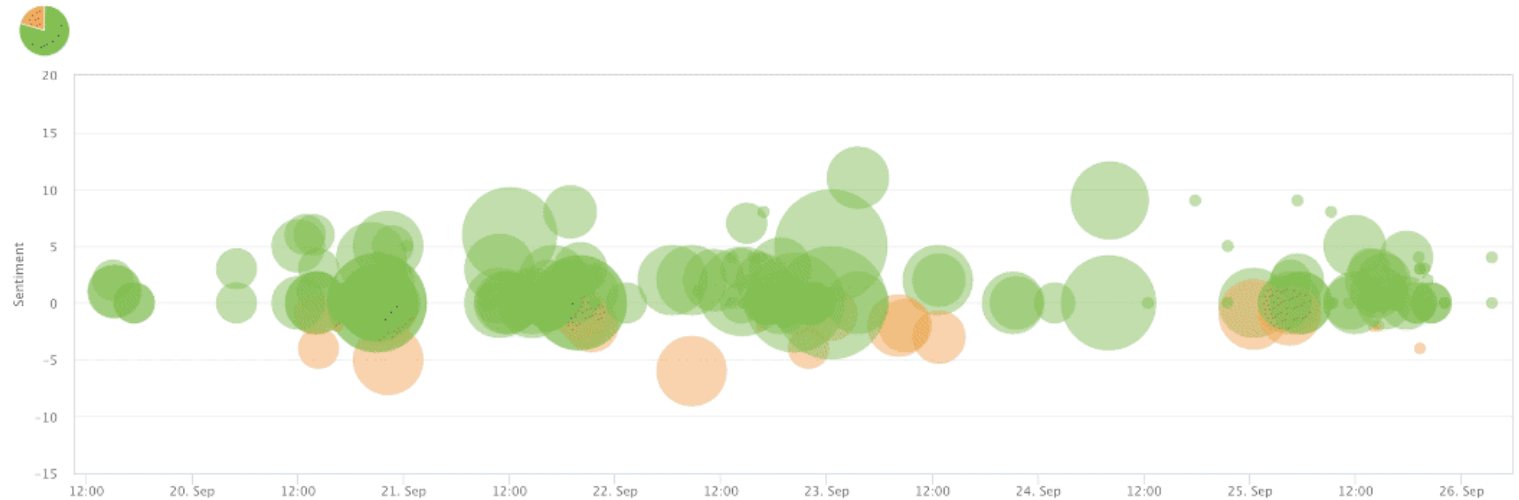


POSITIVE

Brilliant effort guys! Loved Your Work.

Sentiment Analysis

Patient (62)
Org. Advocate/Support (14)
Doctor (14)
Individual Other Healthcare (12)
Org. Other Healthcare (12)
Individual Other Non-healthcare (6)
HCP (5)
Caregiver/Advocate (4)
Org. Other Non-healthcare (2)
Journalist/Media (1)
Researcher/Academic (1)



Positive tweets

- Matthias** @ · Sep 22 +11 0 3
 did I actually mentioned #AndriodAPS is so awesome ;) Thx Milos again, great job! And esp thanks to @AdrianLxM for the AAPS WF 🥰 #OpenAPS
- Dana #hcsn #OpenAPS** @ · Sep 24 +9 0 0
Patient
 @ceben80 hi Wolfgang! So many great German meetups this week - awesome! :) #OpenAPS @scottlebrand
- Niels Hartvig** @ · Sep 24 +9 0 5
 He didn't. Do. Anything. Automated super micro bolus thanks to amazing people, iot and open source. This is life changing #OpenAPS 🙌🙌🙌🙌🙌
- Niels Hartvig** @ · Sep 24 +9 0 0
 @scottlebrand @OpenAPS Pretty sure we get dispensation to use Fiasp in the end of

Negative tweets

- Saskia Wolf** @ · Sep 22 +2 -6 4
 Bad graph day.... Though it's #OpenAPS it still is #diabetes and unfortunately it's still #hormones. Did I ever mention that I hate 'em!?! ;) t.co/7KLF2w3kn5
- Clayton McCook, DVM** @ · Sep 20 +5 -5 4
Individual Other Healthcare
 #OpenAPS crushed the Oklahoma State Fair today. Rides, animals, lemonade, funnel cake: no problem. Love giving our girl her childhood back. t.co/tBBD2fKgjX
- ryan roby** @ · Sep 20 +3 -4 1
 Hey @MDT_Diabetes, when are you going to step up your open source game? Sadly my wife is stuck with you bc of ins. t.co/C5cqxDtVEG
- Kris** @ · Sep 25 +3 -4 0
Individual Other Healthcare

Collaborative Filtering

Frequently Bought Together

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Cybertext: Perspectives on Ergodic Literature
 by Espen J. Aarseth (Aug 6, 1997)
 Average Customer Review: ★★★★★ (3)
 In Stock

List Price: \$22.95
Price: \$19.55
 29 used & new from \$10.82

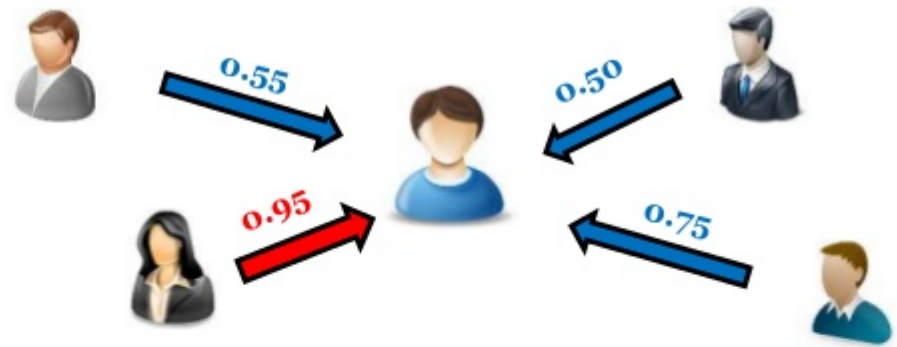
I own it Not interested Rate it

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Narrative as Virtual Reality: Immersion and Interactivity in Lit Media (Parallax: Re-visions of Culture and Society)
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Collaborative Filtering

Similarity



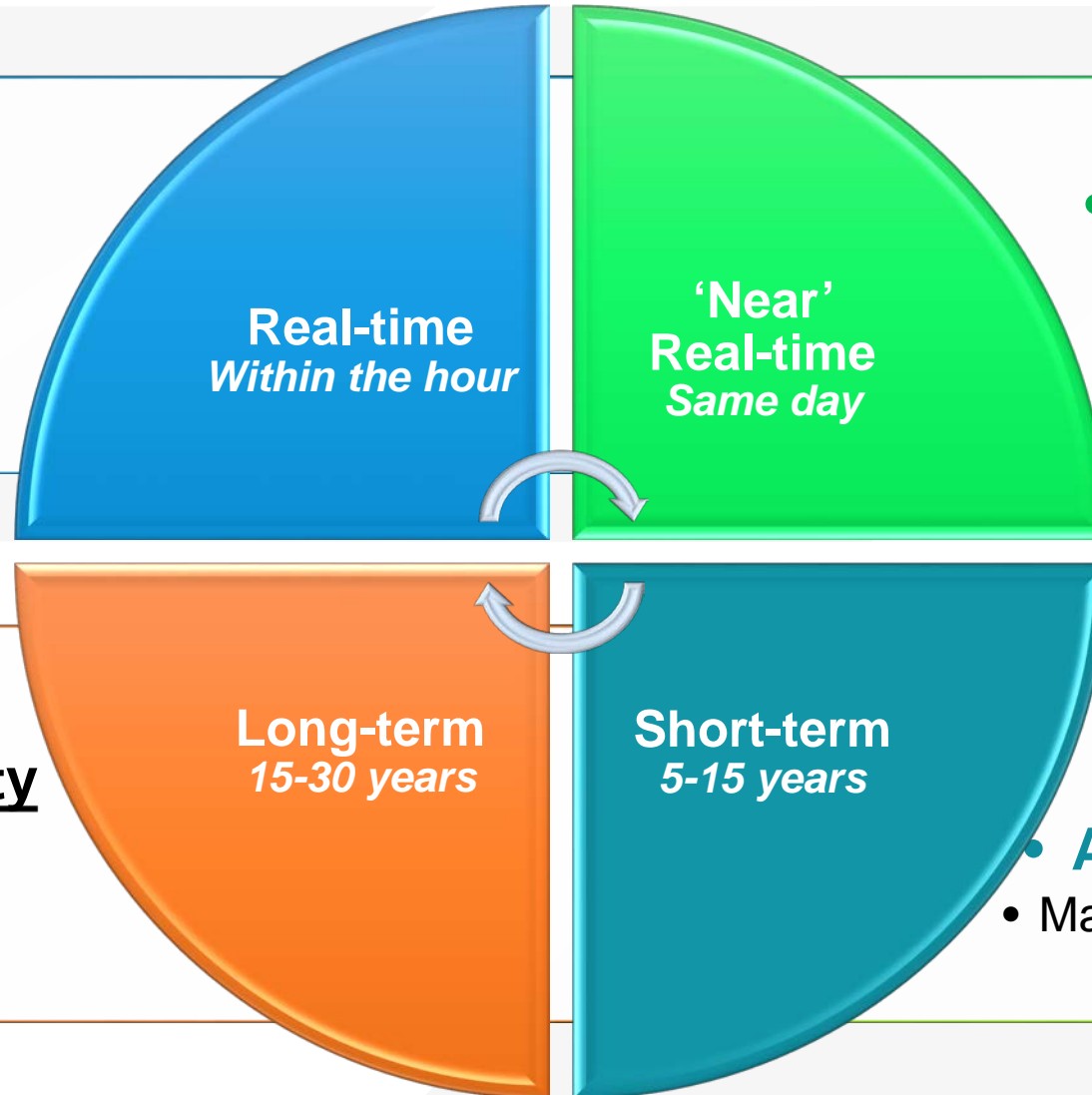
Recommendation



Challenges

Need for different forecasting frameworks

- **Avoid congestion**
- **Traveler feedback**
- Machine learning



- **Plan trips using MaaS**
- **Traveler preferences**
 - Machine learning

- **LRTP, MTP, Conformity**
- **Travel surveys**
- Econometric methods

- **EIR, MIS, Corridors**
- **Attitudes towards modes**
- Machine learning and econometric



Collecting data on a 'regular' basis

Traditional methods

- Expensive and intrusive

Reliability: how accurate are people's responses?

- Perceptions vs behavior

MaaS Providers

- Build user profile reflecting travel behavior, preferences and demographics

Harnessing data from private sector

- Ride hailing, car sharing, cell phone trace data

Emotion detection from facial expressions using AI

- Measures consumer's engagement with brands based on reactions
- Alert driver when feeling drowsy (in self-driving cars)



(a) angry

(b) disappointed

(c) laughing

(d) surprised

Need to be “customer-centric”

