

12 End-User-Friendly Explanatory Forms

Prototype Design Template

based on *EUCA: End-User-Centered Explainable AI Framework*

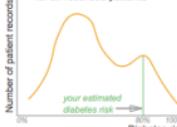
Website: <http://weinajin.github.io/end-user-xai>

Created by Weina Jin (Email: weinaj at sfu dot ca)

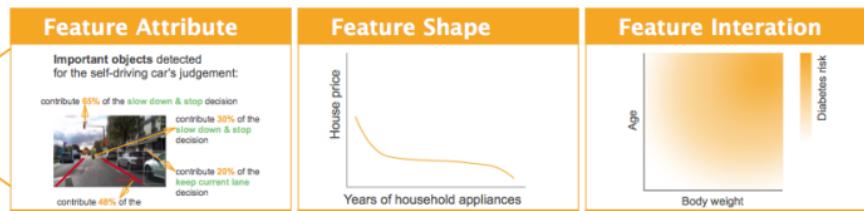
Explain using:

Explanatory Form & its Example

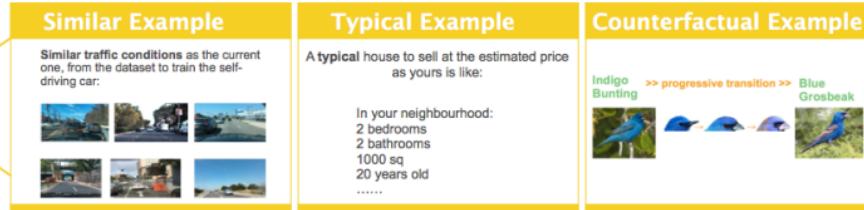
Supplementary information

Input	Output	Dataset	Performance
The image you uploaded: 	Predicted price of your own house \$ 650,000 with certainty of 90% \$ 638 ~ 662,000 with certainty of 95%	Distribution of predicted diabetes risk for all recorded patients  Number of patient records 0% 100% Diabetes risk your estimated diabetes risk	Overall performance of the autonomous driving mode: Measured using average distance driven between disengagements* Under normal road condition: 40 km During the night: 5 km On rainy days: 3 km On snowy days: 1 km * Disengagement means when the automated system is switched off by the intervention of a human driver

Features



Examples



Rules



1. Supplementary Information

1.1 Input

1.2 Output

1.3 Dataset

1.4 Performance

The features of your current input:

- Feature 1
- Feature 2
- Feature 3
-

The features of your own house

- 2 bedrooms
- 1 bathroom
- 780 sq
- 20 years old
- household appliances for 10 years
- distance to school, parks: 2 km

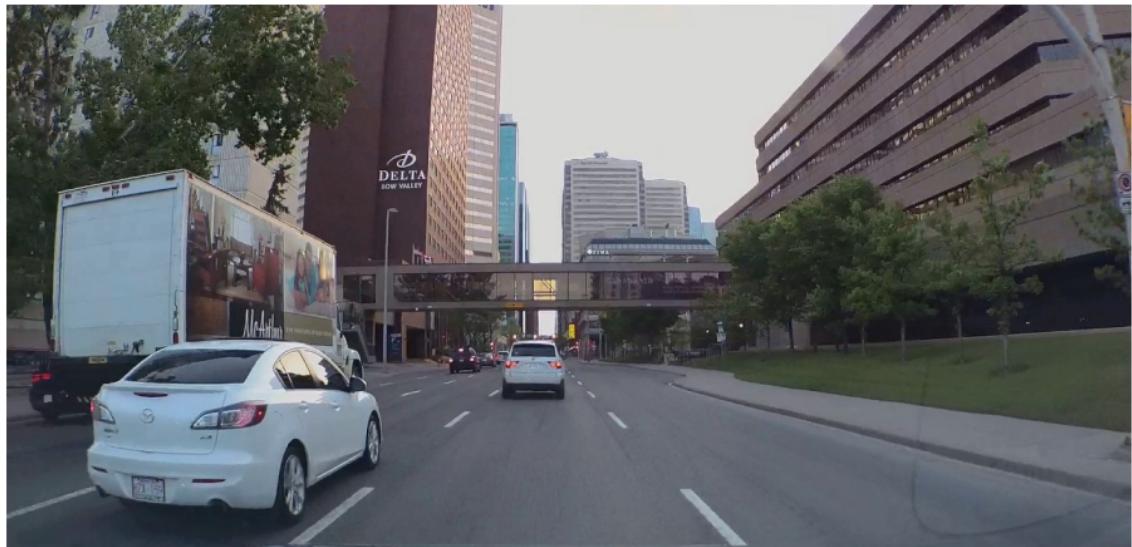
The data from your health records used for prediction:

- Male, 33 years old
- Three consecutive blood sugar level: normal, normal, higher than normal
- Body weight: 75 kg, height 175 cm
- Calories intake per day: 3200
- Minutes of exercise per week: 50 min
- Family history of diabetes:
-

The image you uploaded:



Current traffic view:



1. Supplementary Information

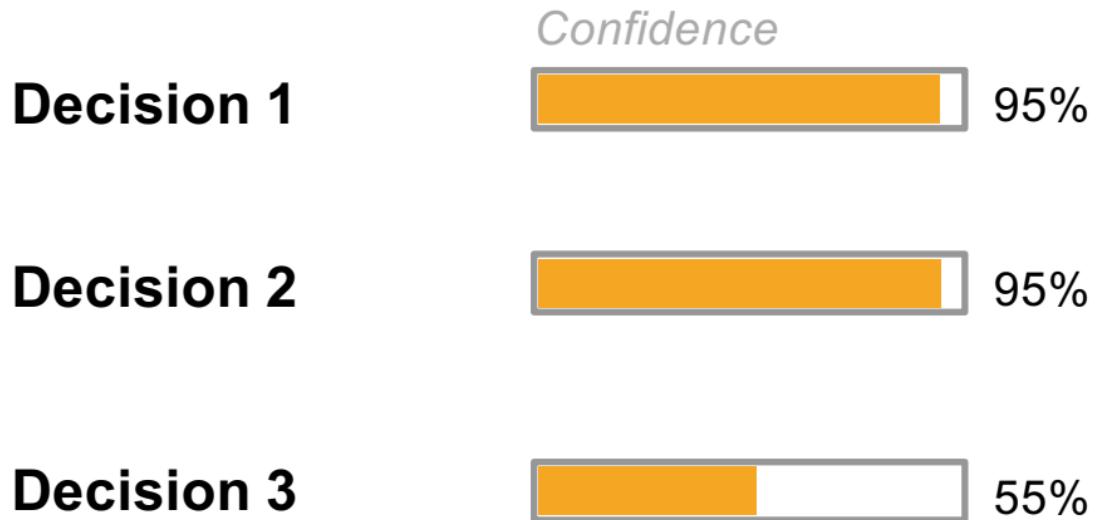
1.1 Input

1.2 Output

1.3 Dataset

1.4 Performance

AI's Decisions:



The current decisions, and **their percentage** in the training dataset where the AI learns from

	<i>Confidence</i>	<i>Precentage</i>	
Decision 1	95%	25%	
Decision 2	95%	34%	
Decision 3	55%	2.9%	

**Your chance of getting diabetes
within the next year is:**

80 %

Predicted price of your own house

\$ 650,000

Your chance of getting diabetes
within the next year is:

80 %

with a certainty of 90%

75 ~ 85%

with a certainty of 95%

Predicted price of your own house

\$ 650,000

with certainty of 90%

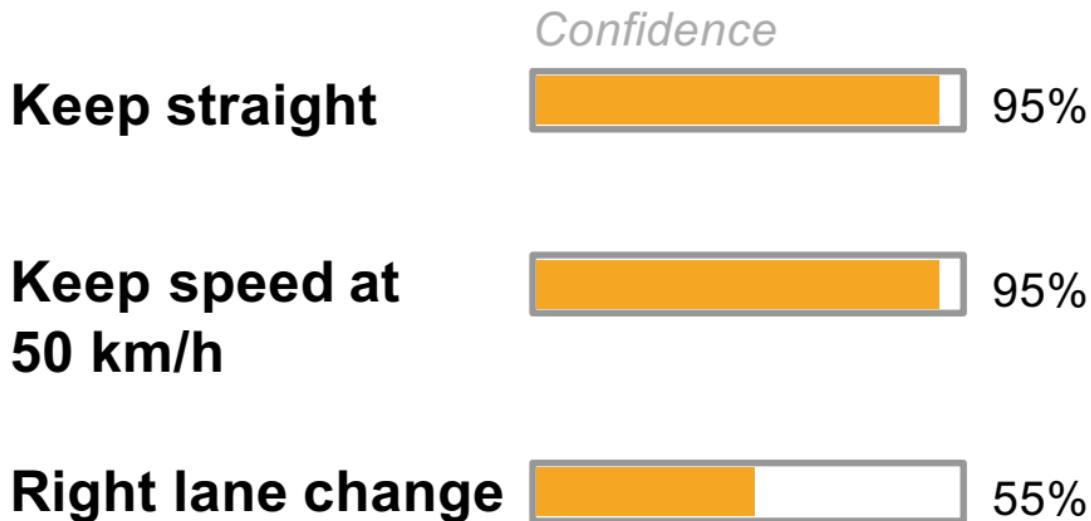
\$ 638 ~ 662,000

with certainty of 95%

The image you uploaded is
recognized as:



Driving decisions under the current traffic:



The three most likely bird according to your uploaded image, and **their percentage in the training dataset** where the AI learns from

	<i>Likelihood</i>	<i>Precentage</i>	
Indigo Bunting	95%	1.5%	
Blue Grosbeak	70%	1.2%	
Lazuli Bunting	55%	1.3%	

The current driving decisions, and their percentage in the training dataset where the self-driving car learns from

	<i>Confidence</i>	<i>Percentage</i>	
Keep straight	95%	25%	
Keep current speed	95%	34%	
Right lane change	55%	2.9%	

1. Supplementary Information

1.1 Input

1.2 Output

1.3 Dataset

1.4 Performance

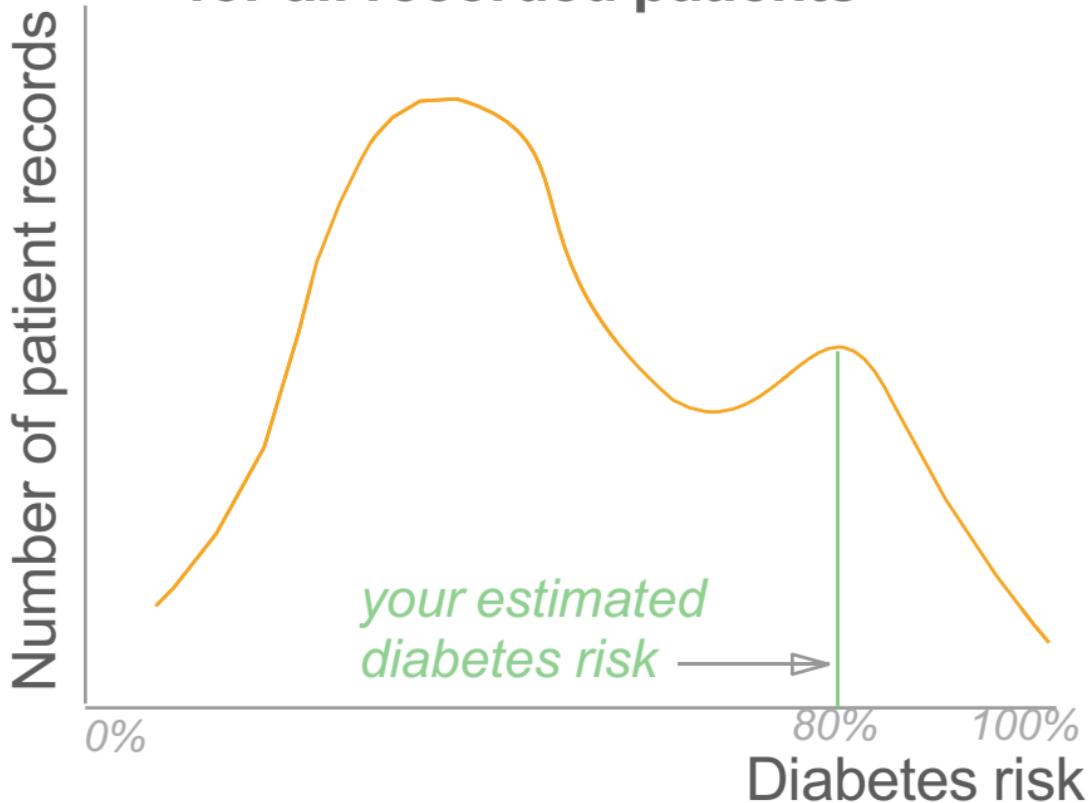
Distribution of house prices



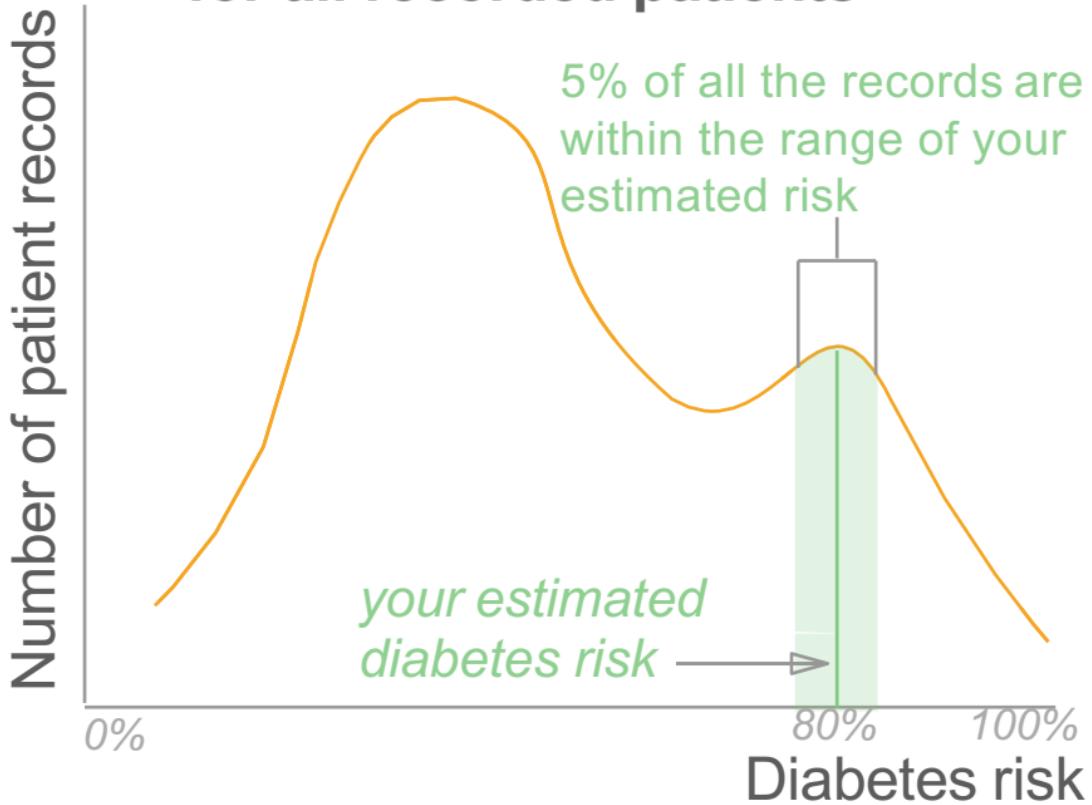
Distribution of house prices



Distribution of predicted diabetes risk for all recorded patients



Distribution of predicted diabetes risk for all recorded patients



1. Supplementary Information

1.1 Input

1.2 Output

1.3 Dataset

1.4 Performance

Overall performance of the AI :

- Accuracy: 85%
- Error rate: 15%

Overall performance of the AI bird recognition tool:

- Accuracy: 85%
- Error rate: 15%

Overall performance of the autonomous driving mode:

*Measured using average distance driven between disengagements**

- Under **normal** road condition: 40 km
- During the **night**: 5 km
- On **rainy** days: 3 km
- On **snowy** days: 1 km

* Disengagement means when the automated system is switched off by the intervention of a human driver

The performance of the AI tool to predict diabetes risk

- Mean prediction error: $\pm 15\%$
- Max prediction error: $\pm 30\%$
- The AI tool can explain 75% of the variation in the training data

The performance of the AI house prediction tool

- Mean prediction error: $\pm 50,000$
- Max prediction error: $\pm 120,000$
- The AI tool can explain 95% of the variation in the training data

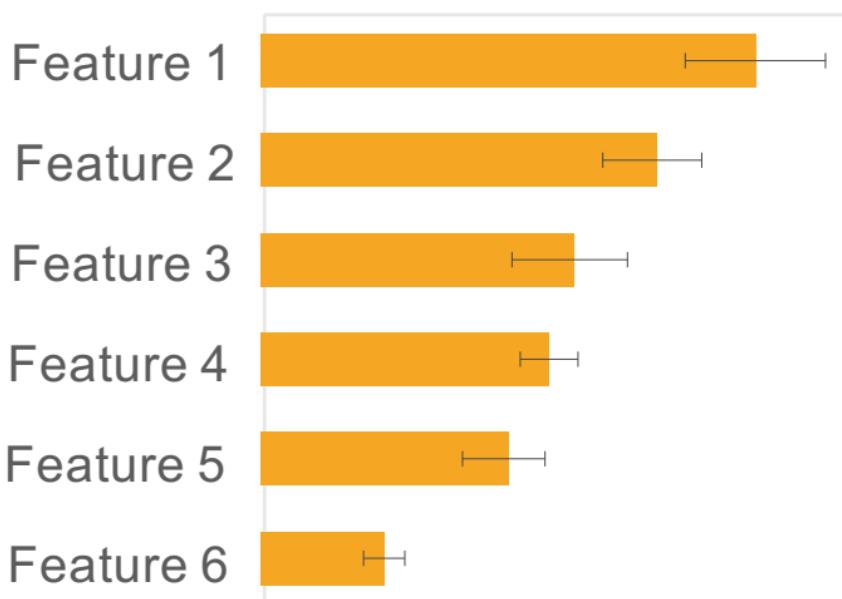
2. Feature-based explanation

2.1 Feature Attribute

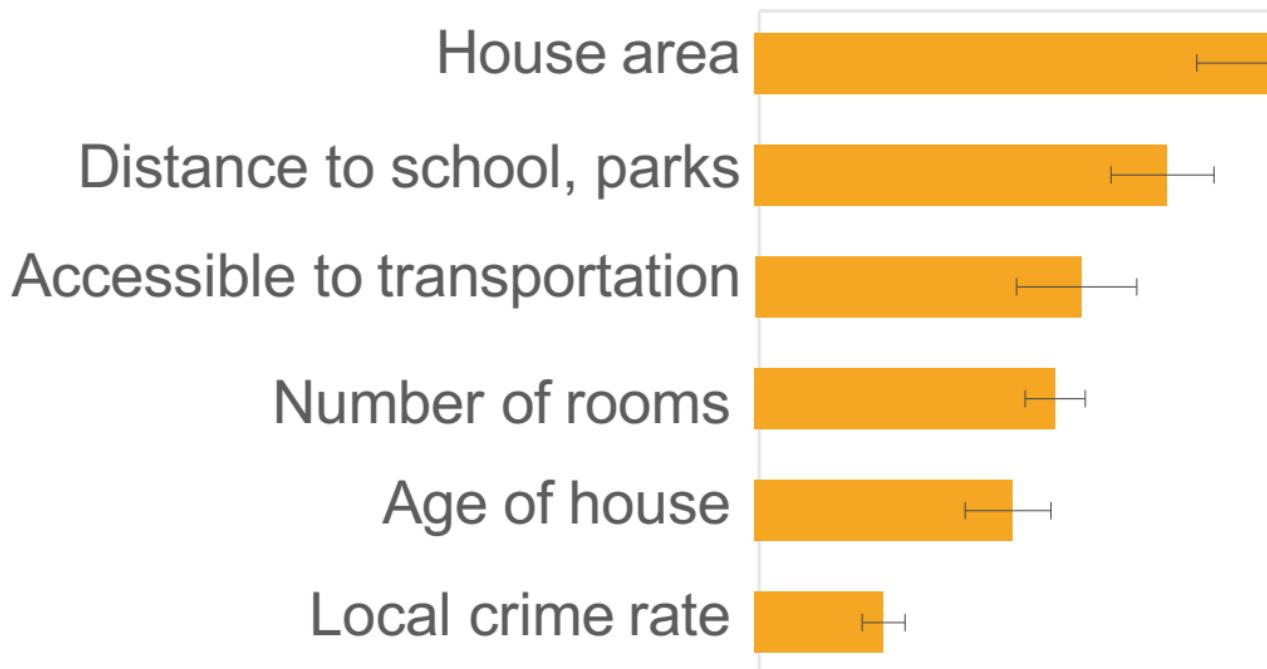
2.2 Feature Shape

2.3 Feature Interaction

How important is each feature to the result:



How important is each feature to the result:



Feature importance score

House area



Distance to school, parks



Accessible to transportation



Number of rooms



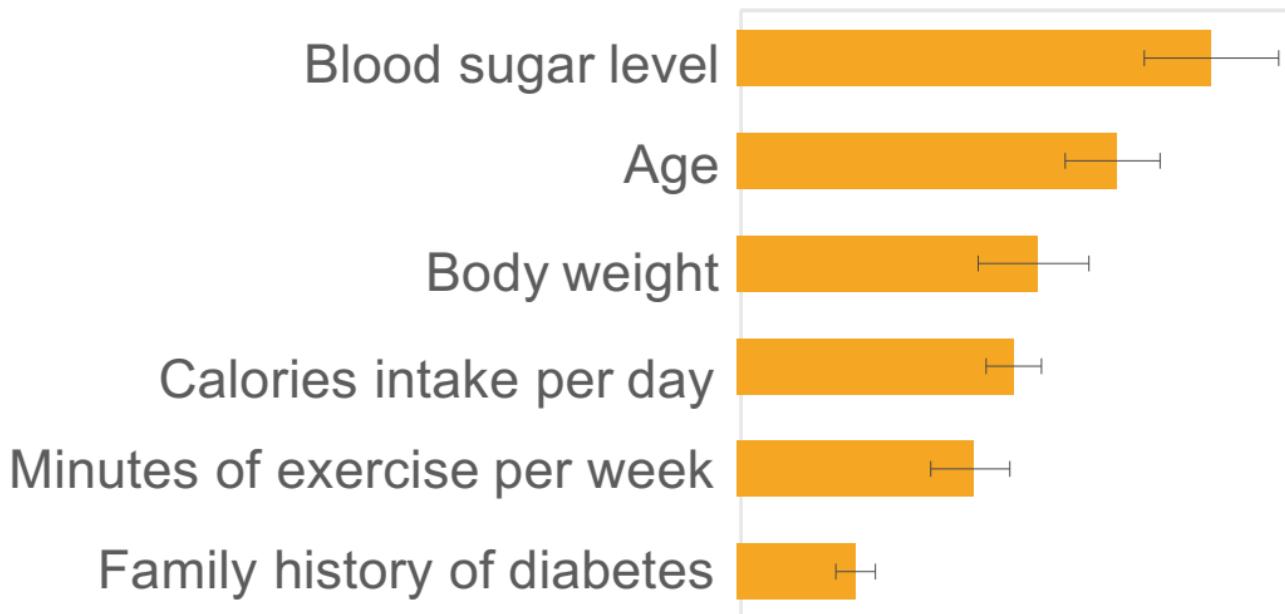
Age of house



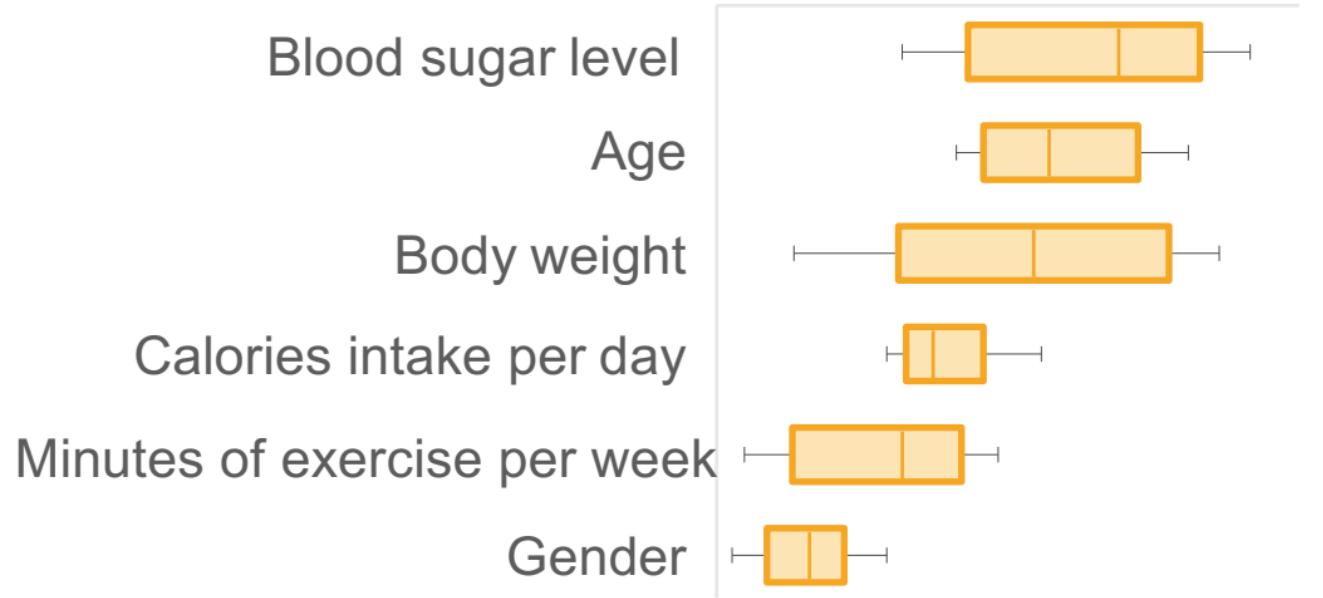
Local crime rate



How important is each feature to the result:



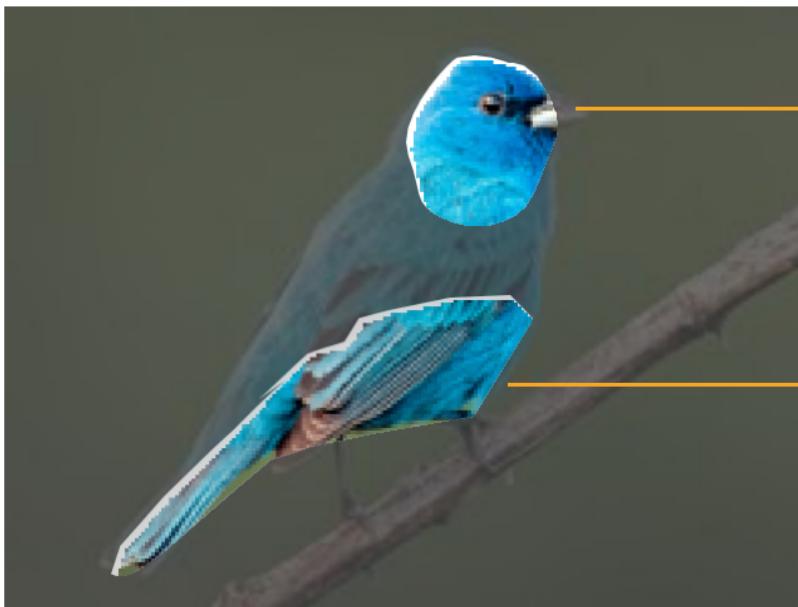
Feature importance score



Important regions (highlighted)
for AI's bird recognition:



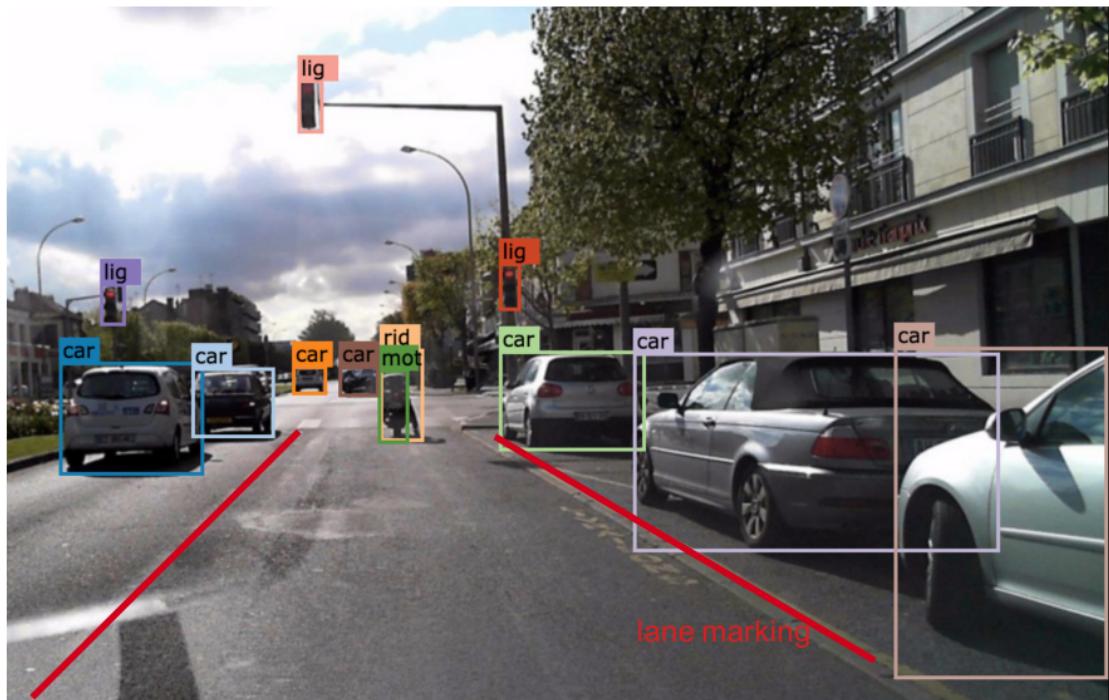
Important regions (highlighted) for AI's bird recognition:



contribute
30% of the
overall
decision

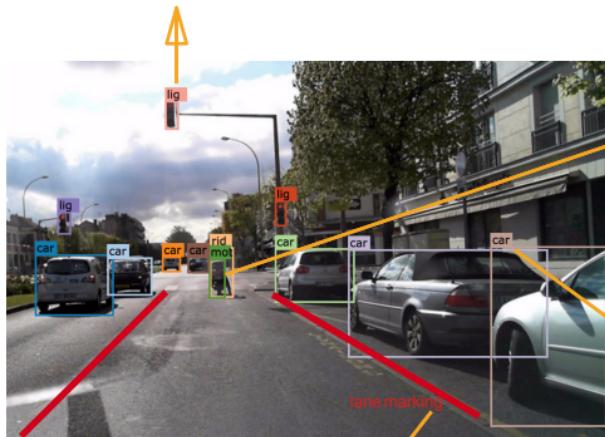
contribute
20% of the
overall
decision

Important objects detected for the self-driving car's judgement:



Important objects detected for the self-driving car's judgement:

contribute **65%** of the **slow down & stop** decision



contribute **30%** of the **slow down & stop** decision

contribute **20%** of the **keep current lane** decision

contribute **48%** of the **keep current lane** decision

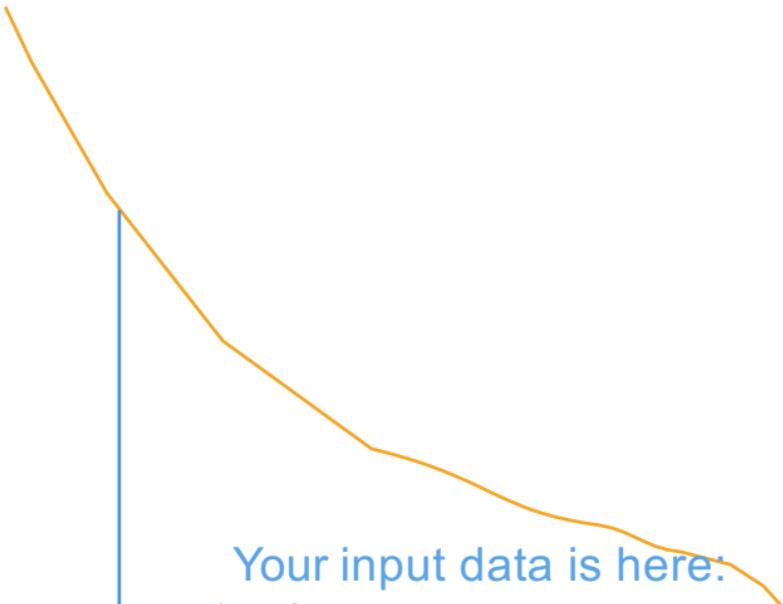
2. Feature-based explanation

2.1 Feature Attribute

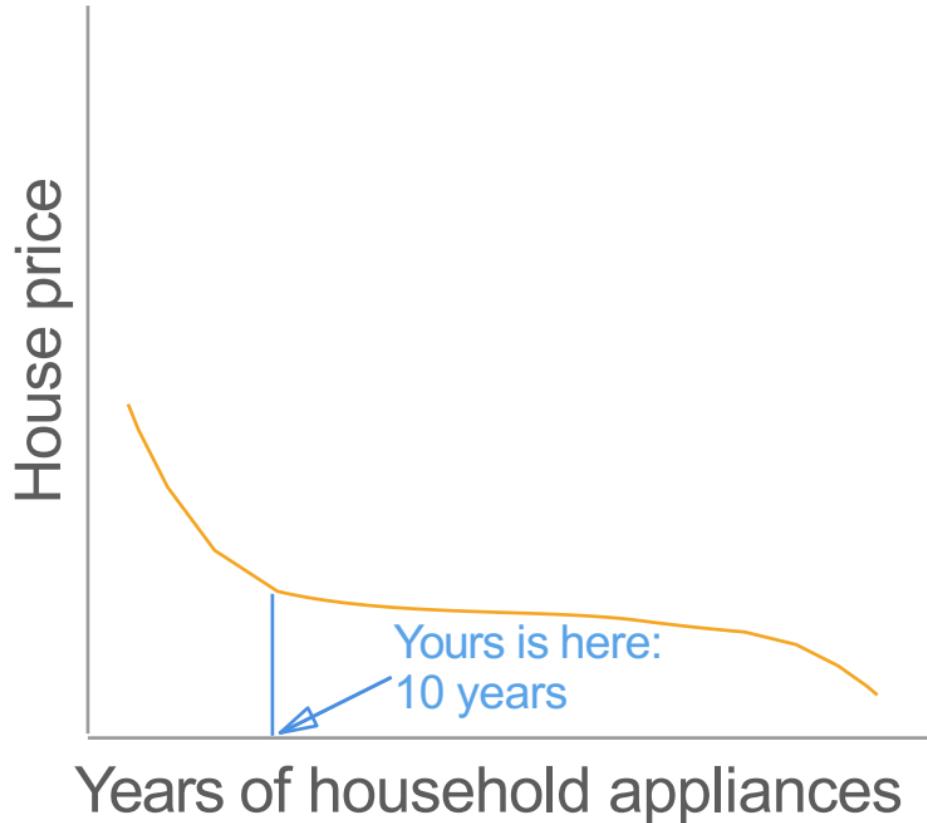
2.2 Feature Shape

2.3 Feature Interaction

Prediction



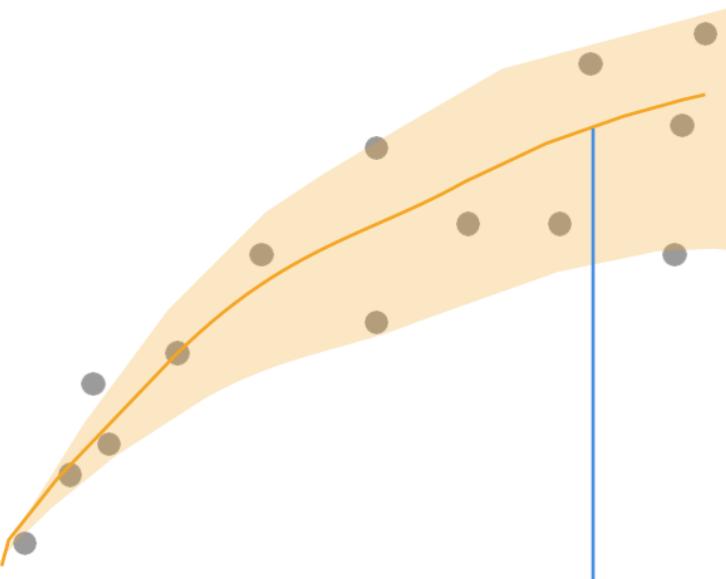
Feature 1

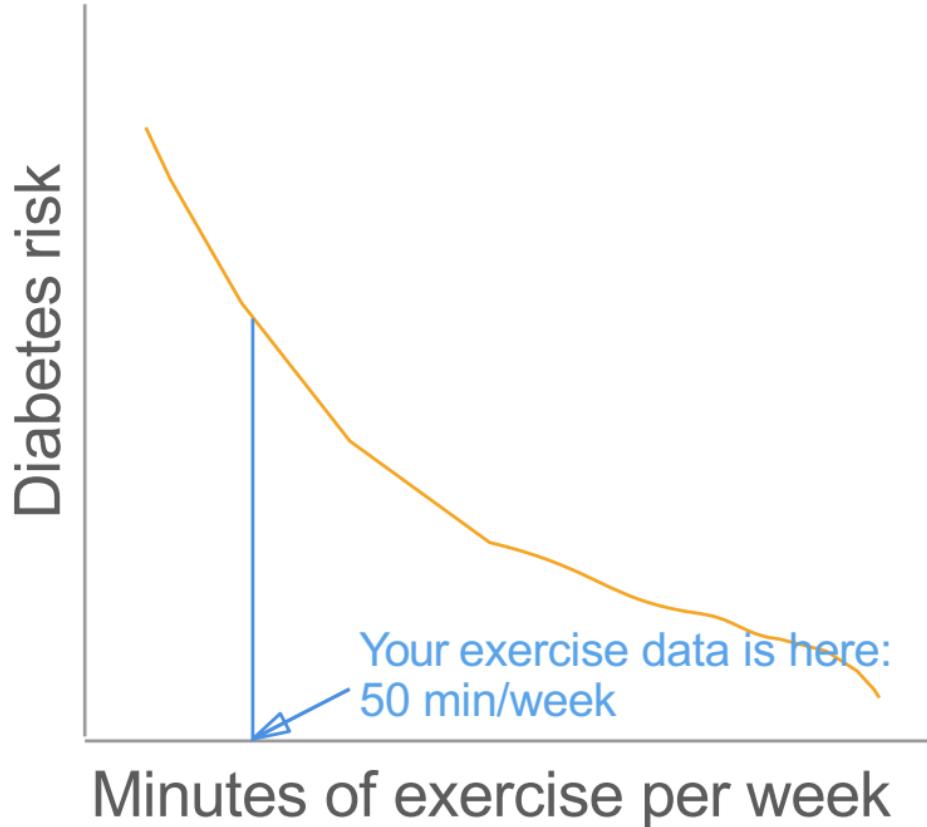


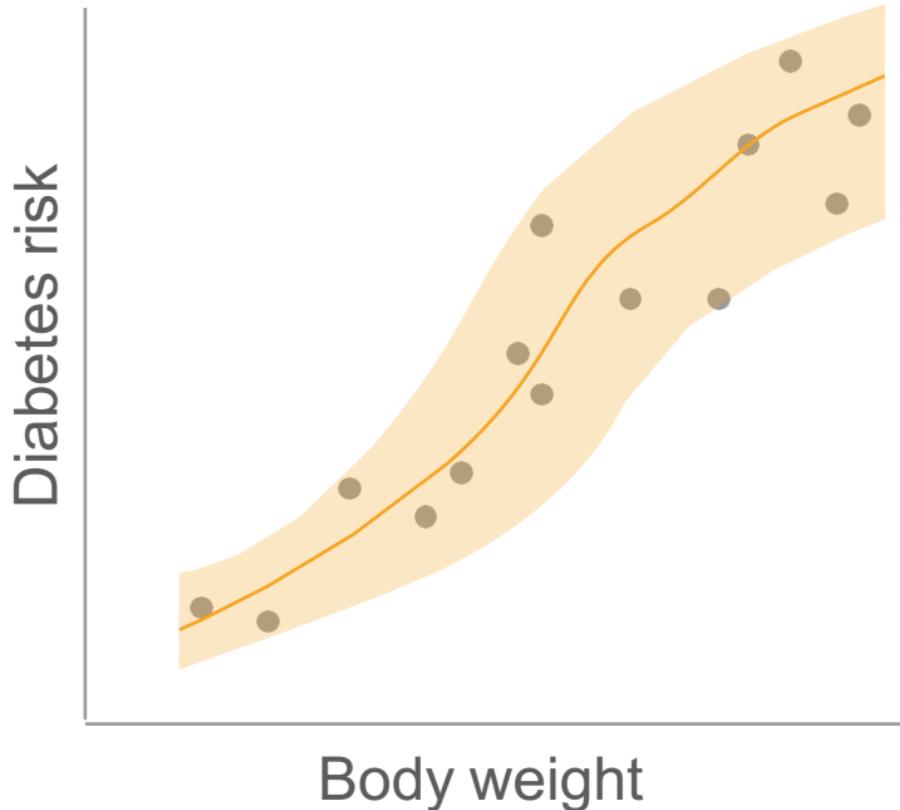
House price

House area

↑ Your house is here:
780 sq





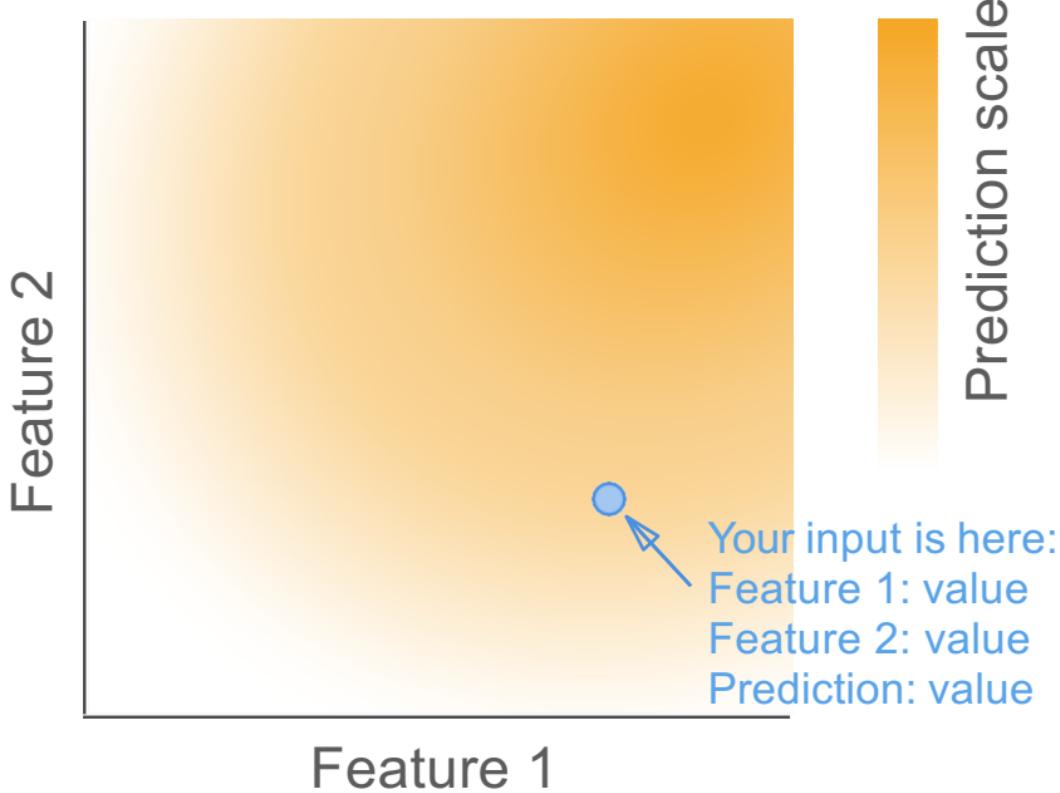


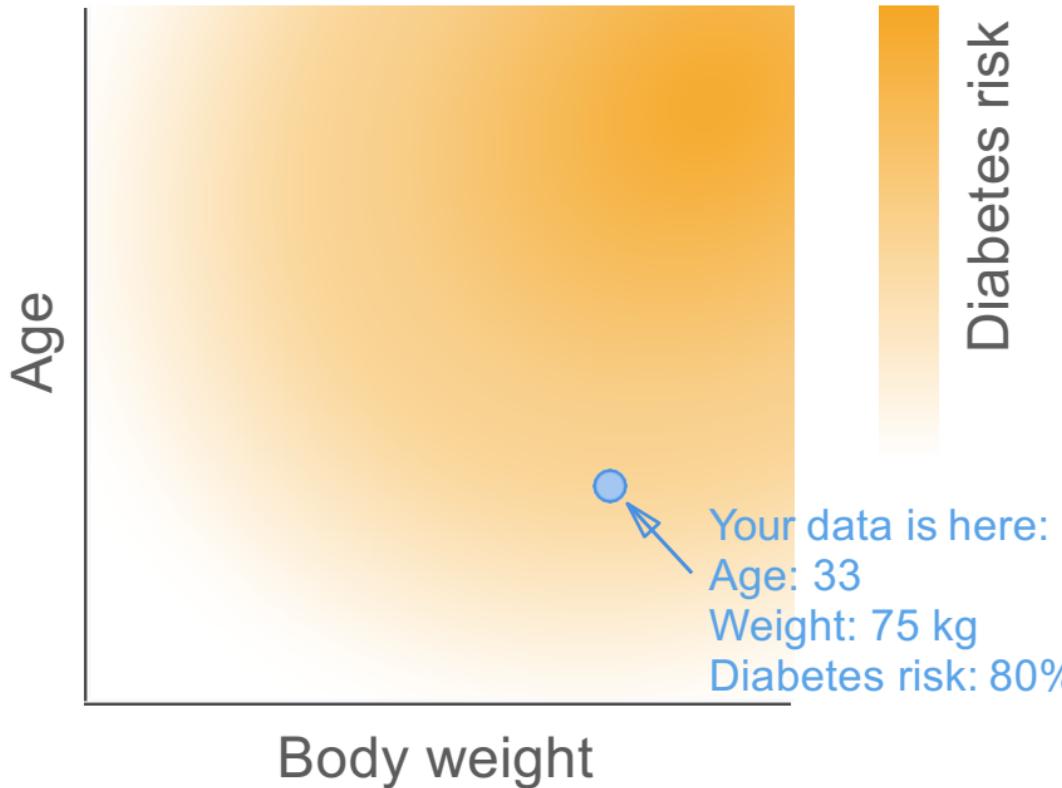
2. Feature-based explanation

2.1 Feature Attribute

2.2 Feature Shape

2.3 Feature Interaction





Number of rooms

House area



Your house is here:
Area: 780 sq
Rooms: 3
Price: 650,000

House price

3. Example-based explanation

3.1 Similar Example

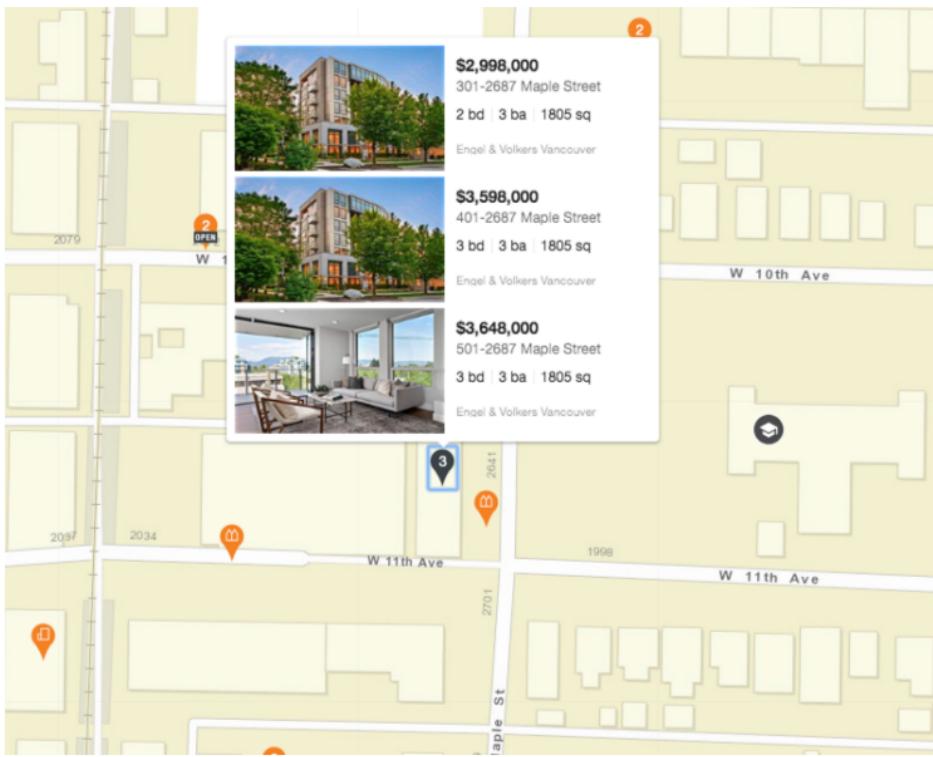
3.2 Typical Example

3.3 Counterfactual Example

A *similar example* as your input is like:

- Feature 1
 - Feature 2
 - Feature 3
 - Feature 4
 - Feature 5
 - Feature 6
-
- **Prediction:**

The houses of **similar features** as yours



A similar case as yours is like:

- Male, 35 years old
- Three consecutive blood sugar level: normal, normal, higher than normal
- Body weight: 81 kg, height 183 cm
- Calories intake per day: 3400
- Minutes of exercise per week: 60 min
- Family history of diabetes:
- **Diabetes risk: 82%**

Similar images to the one you uploaded:



Indigo Bunting
95%



Indigo Bunting
95%



Blue Grosbeak
70%



Blue Grosbeak
70%



Lazuli Bunting
55%



Painted Bunting
45%

Similar traffic conditions as the current one, from the dataset to train the self-driving car:



3. Example-based explanation

3.1 Similar Example

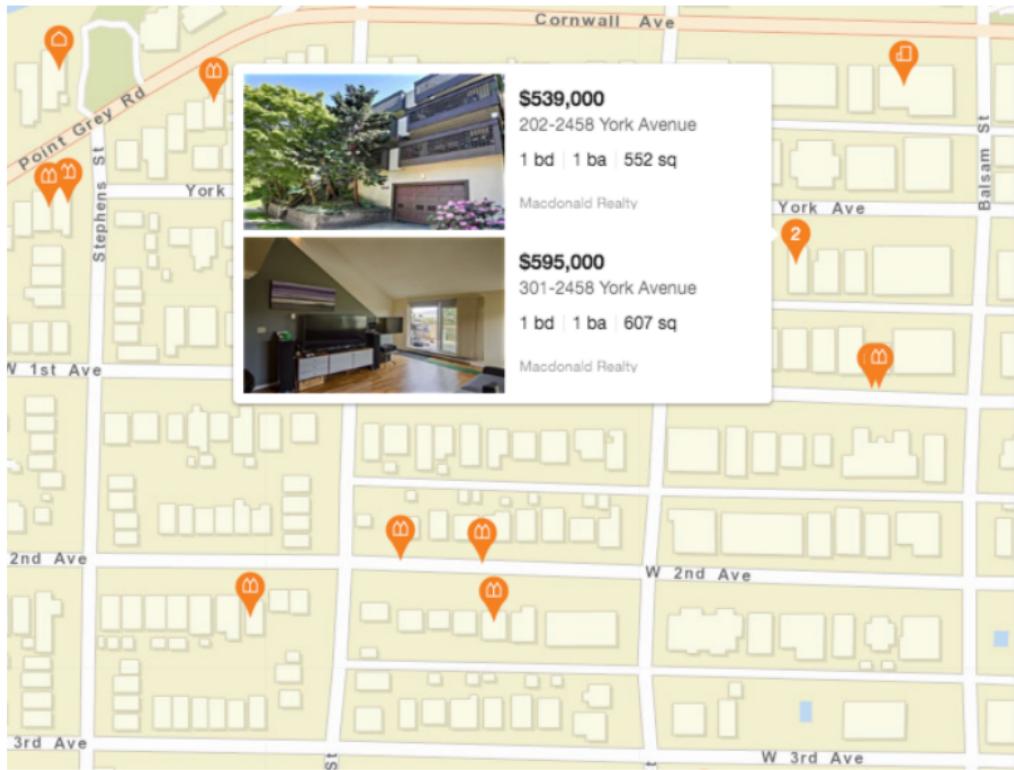
3.2 Typical Example

3.3 Counterfactual Example

A *typical example* of the same prediction as yours (prediction value) is like:

- Feature 1
- Feature 2
- Feature 3
- Feature 4
- Feature 5
- Feature 6

The houses of **similar price** as yours



A typical case of the same diabetes risk as yours (80%) is like:

- Male, 45 years old
- Three consecutive blood sugar level: normal, normal, higher than normal
- Body weight: 78 kg, height 175 cm
- Calories intake per day: 3000
- Minutes of exercise per week: 30 min
- Family history of diabetes:
-

The three most likely bird according to your uploaded image, and **typical examples**

**Indigo
Bunting**
95%



**Blue
Grosbeak**
70%



**Lazuli
Bunting**
55%



Typical traffic conditions to reach the self-driving car's current decision:

Keep straight
95%



Keep current speed
70%



Right lane change
55%



3. Example-based explanation

3.1 Similar Example

3.2 Typical Example

3.3 Counterfactual Example

If one of your input features had changed to the following value, your predicted outcome would have increased by 20%:

- Feature 1 changed to some value
- Feature 2 changed to some value
- Feature 3 changed to some value
- Feature 4 changed to some value
- Feature 5 changed to some value
- Feature 6 changed to some value
-

If the feature of your house had changed to the following feature,
your house would have increased 10% of the estimated value

- have a back yard, or
- 3 bathrooms, or
- 1200 sq, or
- less than 10 years old, or
- has new household appliances
-

If your health data had changed to the following,
your diabetes risk would have decreased by 20%:

- 3 years younger than now
- Body weight: loss 5 kg
- Increase 50 min of weekly exercise
- Reduce 500 calories of daily calories intake
-

Bird A

highlight different regions

Bird B



Bird A >> progressive transition >> **Bird B**



4. Rule-based explanation

4.1 Decision Rules

4.2 Decision Tree

4.3 Decision Flowchart

If **feature 1** \leq some value,
and **feature 2** $>$ some value,
Then the prediction **is some value**

If **house area** is some value,
and **distance to school, parks** $<$ some
value,
Then the prediction **is another value**

If **house area** \leq 800 sq,
and **distance to school, parks** $>$ 2.5 km,
Then house price **is no more than**
600,000

If **house area** is 800 - 900 sq,
and **distance to school, parks** $<$ 2.5 km,
Then house price **is about**
700,000-850,000

If **blood sugar** is high,
and **body weight** is overweight,
Then the estimated diabetes risk
is above 80%

If **blood sugar** is normal,
and **body weight** is overweight,
Then the estimated diabetes risk
is about 20-50%

If **bird bill** is small and thin,
and **wings and tails** are short,
Then the bird is recognized as
Indigo Bunting

If **bird bill** is big and thick,
and **wings and tails** are long,
Then the bird is recognized as
Blue Grosbeaks

If **traffic sign** is stop sign,
or the speed of the **car in front** are
slower,

Then the speed decision is to
slow down and stop

If **traffic sign** is 50km/h speed limit,
and the speed of the **car in front** are
the same or faster,

Then the speed is kept at
50km/h

	house area	distance to school, parks	house price prediction
Rule 1	≤ 800 sq	> 2.5 km	$< 600,000$
Rule 2	≤ 800 sq	< 2.5 km	$600,000-$ $700,000$
Rule 3	$800-900$ sq	< 2.5 km	$700,000-$ $850,000$

	blood sugar	body weight	diabetes risk
Rule 1	high	high	> 80%
Rule 2	high	normal	50-80%
Rule 3	normal	normal	< 20%

4. Rule-based explanation

4.1 Decision Rules

4.2 Decision Tree

4.3 Decision Flowchart

Feature 1

<cutoff value of feature 1

Feature 2

>cutoff value of feature 1

Feature 2

<cutoff value
of feature 2

>cutoff value
of feature 2

Prediction
1

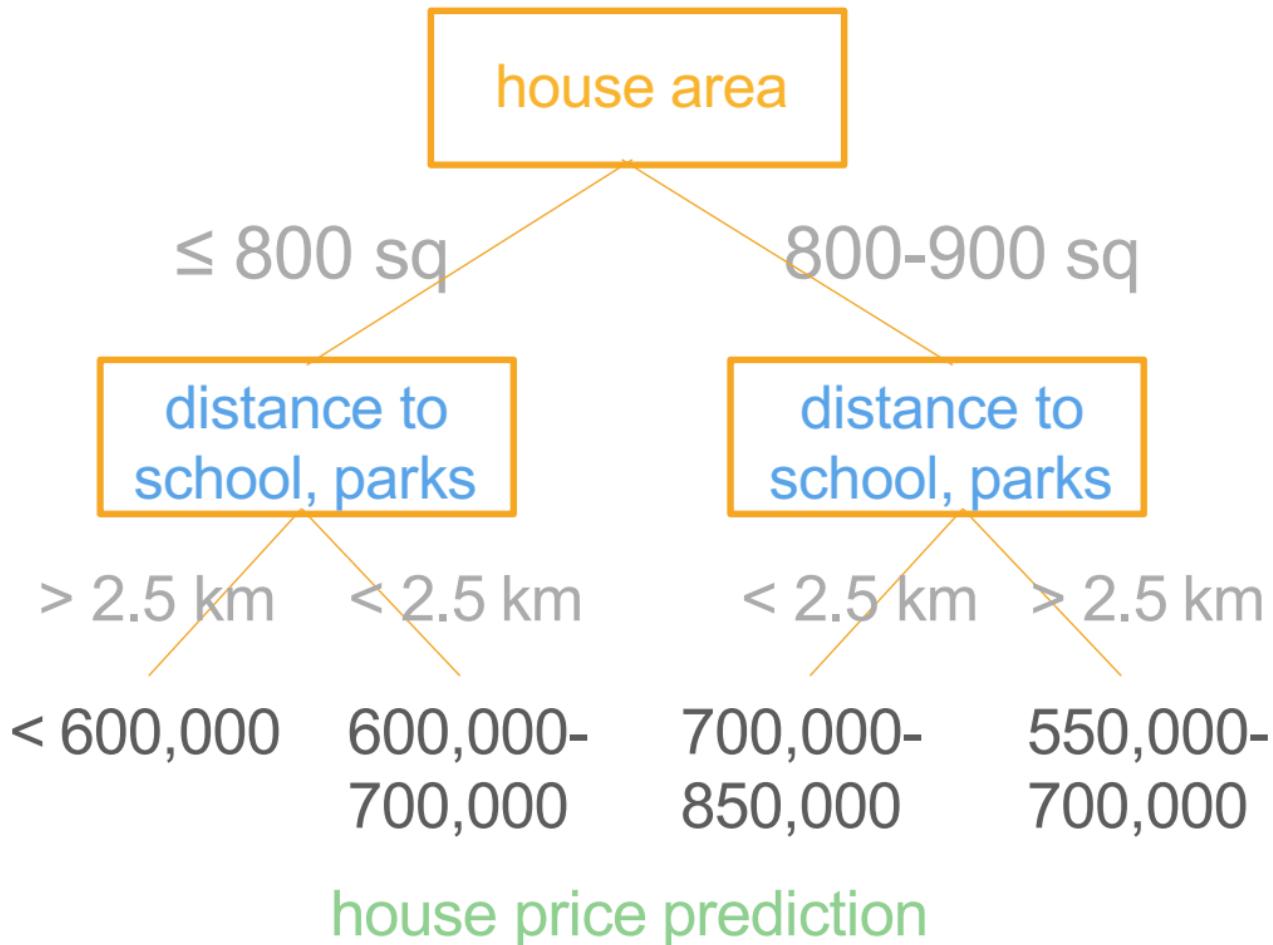
<cutoff value
of feature 2

Prediction
3

>cutoff value
of feature 2

Prediction
4

Estimated prediction



Blood sugar

normal

high

Body weight

Body weight

normal

overweight

< 20%

20-50%

normal

overweight

50-80%

>80%

Estimated diabetes risk

an uploaded image



Indigo
Bunting,
male



Indigo
Bunting,
female



Blue
Grosbeak,
male



Blue
Grosbeak,
female

current traffic view



Slow down
and stop



Slow down
to 30 km/h



Keep speed
at 50km/h



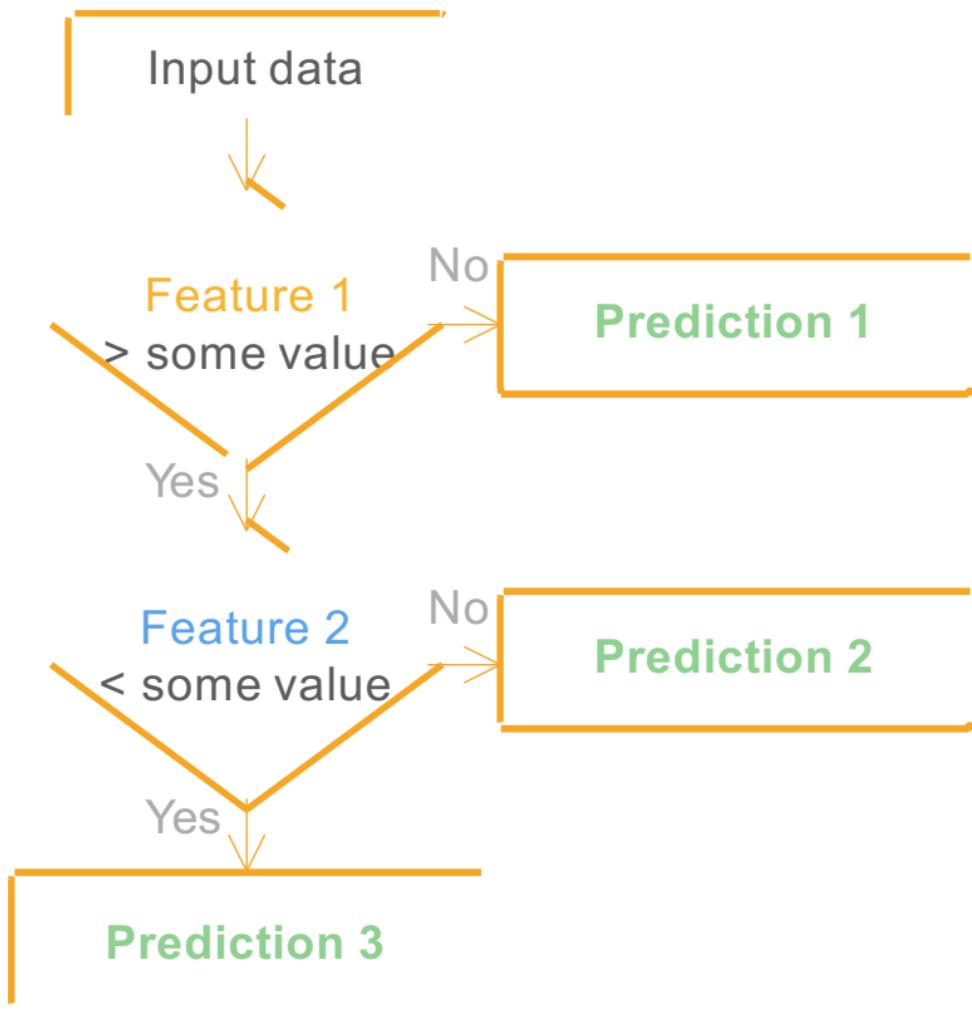
Slow down
to 40km/h

4. Rule-based explanation

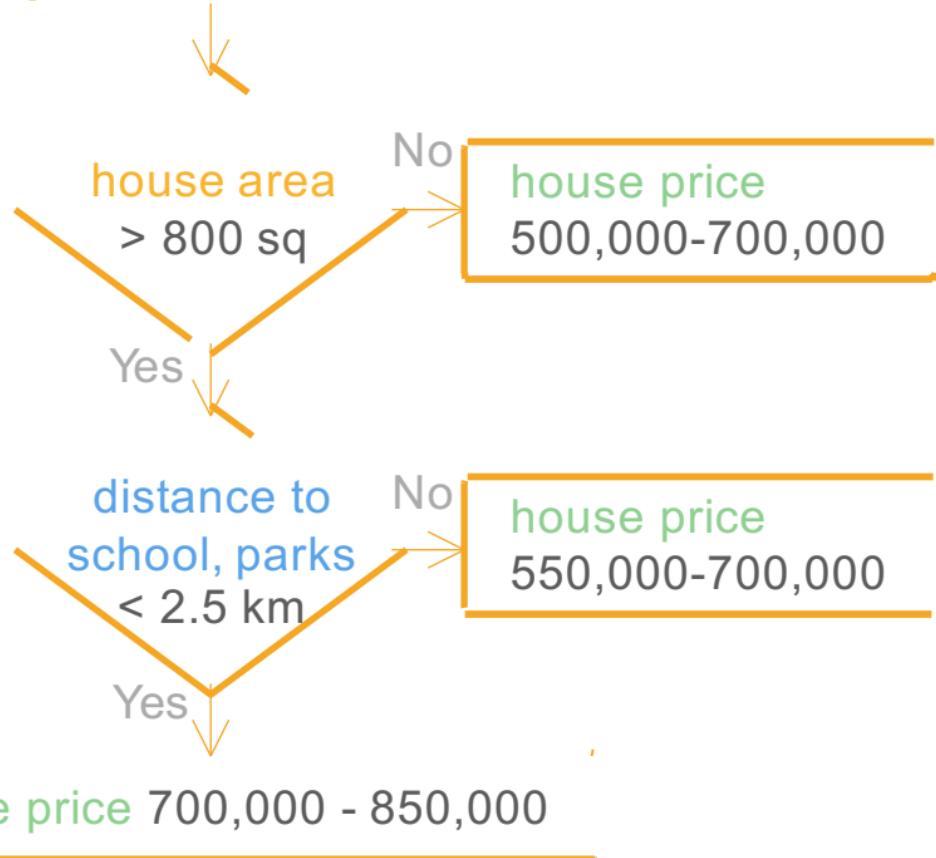
4.1 Decision Rules

4.2 Decision Tree

4.3 Decision Flowchart



A house to sell



A patient's health record



Yes

diabetes risk > 80%

an uploaded image



looks at head

house area
 > 800 sq

looks at belly



reach a conclusion on the bird species

current traffic view



detected
traffic sign

lig

detected
traffic objects



reach driving decisions