

LKH'S DATASET PROPOSAL FOR CAPSTONE

https://www.kaggle.com/jinbonnie/animal-data

Predict how likely it is for an animal to be adopted



Multi-class classification:

- Adopted,
- adopted & returned
- not adopted

Or... just Binary class:

Adopted vs not adopted

Will likely do multiclass as I've not explored it before!



```
Adopted is 5184
Adopted & return is 626
Not Adopted is 4480
----sum of the 3 is 10290
Total is 10290
```

Smote / use class_weight = balanced

COLUMNS

- id:
- ID of animal in animal shelter system (Use for initial filtering b4 dropping)
- intakedate:
- the date he/she has been taken by the shelter (Easily filter by year etc.) and create new columns
- intakereason
- reason for adopting EG. 'Moving' 'Abandoned' 'Incompatible with owner lifestyle' -> One hot for 25 values
- - istransfer
- has animal been transferred EG. [0 1] one hot it
- - sheltercode
- the identify code of the shelter ->one hot encode?
- identichipnumber
- the micro-chip id of the pet -> Binary, one hot (Chipped / not chipped)
- - animalname
- animal's name -> considering dropping (no real value) since theyre too unique with 4336 values
- breedname
- the breed of the animal -> I can try one hot encoding 799 breeds... we will see
- basecolour
- the color of the animal -> can try one hot encoding for 78 colours
- speciesname
- Animal Species name -> choosing only cat & dog due to extremely high imbalance
- animalage
- Age -> One hot encode 273 values
- sexname
- Binary M/F -> One hot encode

COLUMNS

- location
- section of the shelter -> consider dropping or one hot for 39 values
- movementdate
- the date they have been moved -> in take to
- movementtype
- -['Adoption' 'Foster' 'Transfer' 'Reclaimed' 'Released To Wild' 'Stolen' 'Escaped'] -> Where I got my label
- istrial
- is that trial or confirm change -> Dropping since all are 0s
- returndate
- Binary 0/1 if animal has been returned -> Where I got my label
- returnedreason
- why they were been returned -> Drop too hard to make use of the data
- deceaseddate
- date of passing -> Label encode making not deceased I and deceased 0
- deceasedreason
- reason for passing -> Drop too hard to make use of the data
- diedoffshelter
 - Binary 0/1 death in shelter -> one hot
- puttosleep
- Binary 0/I whether put to sleep -> label 0 = put to sleep, I = sleep
- - isdoa
 - Binary 0/1 dead on arrival -> Label 0 = DOA, 1 = alive

COLUMNS

In summary:

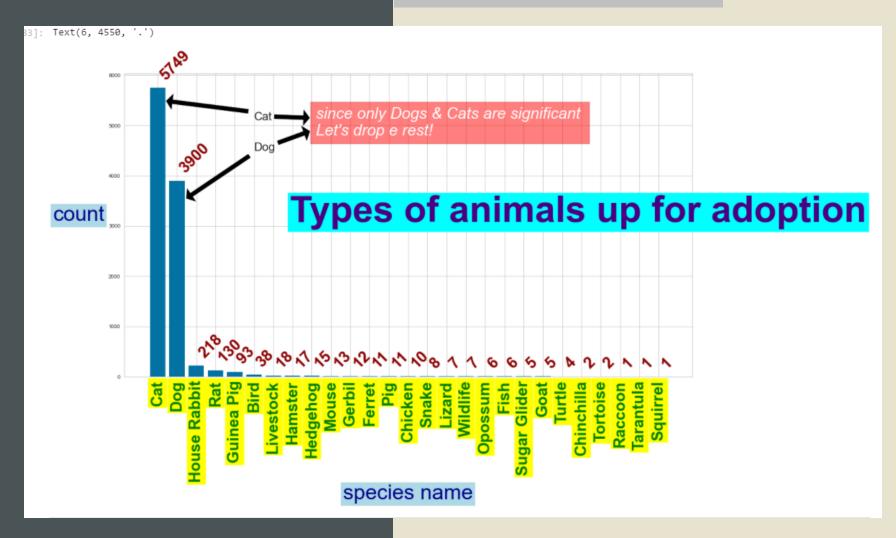
Highly Cardinal/unique features = drop

Categorical data = one hot

Even binary data = one hot

Ordinal data = label encode

SOME EXAMPLES OF AN IMBALANCED FEATURE



SMALL SAMPLE (HEAD 5)

| | id | intakedate | intakereason | istransfer | sheltercode | identic hip number | animalname | breedname | basecolour | speciesname | movementdate |
|----|-------|-------------------------|-----------------------------------|------------|-------------|--------------------|------------|---|--------------------|-------------|----------------------------|
| 5 | 31469 | 2013-03- 26 00:00:00 | Incompatible with owner lifestyle | 0 | D1303720 | 981020007006095 | Bonnie | Basenji/Mix | Brown and White | Dog | 2013-03-30 00:00:00 |
| 13 | 46437 | 2016-10- 26 00:00:00 | Abandoned | 0 | C16103406 | 981020017650993 | Nova | Domestic Long Hair | Black | Cat | 2017-04-07 00:00:00 |
| 40 | 47414 | 2017-02- 16 00:00:00 | Abandoned | 0 | D17021424 | 981020021060979 | Beemo | Pitbull/Mix | Blue | Dog | 2017-04-15 00:00:00 |
| 47 | 47502 | 2017-02- 27 00:00:00 | Marriage/Relationship split | 0 | D17021511 | 981020015101070 | Zoey | Pitbull/Mix | Grey and White | Dog | 2017-04-08 00:00:00 |
| 56 | 47558 | 2017-03- 06 00:00:00 | Abandoned | 0 | D17031567 | 981020021074652 | Clyde | Golden Retriever/Poodle, Standard | Golden | Dog | 2017-03-29 00:00:00 |

SMALL SAMPLE (HEAD 5)

| movementdate | movementtype | istrial | returndate | returnedreason | deceaseddate | deceasedreason | diedoffshelter | puttosleep | isdoa |
|------------------------|--------------|---------|-------------------------|-----------------------------------|------------------------|--------------------------------------|----------------|------------|-------|
| 2013-03-30 00:00:00 | Adoption | 0.0 | 2017-05- 08 00:00:00 | Incompatible with owner lifestyle | NaN | Died in care | 0 | 0 | 0 |
| 2017-04-07 00:00:00 | Adoption | 0.0 | 2018-02- 09 00:00:00 | Incompatible with owner lifestyle | 2018-02-10 00:00:00 | UU - untreatable, unmanageable | 0 | 1 | 0 |
| 2017-04-15 00:00:00 | Adoption | 0.0 | 2017-07- 12 00:00:00 | Rabies Monitoring | NaN | Died in care | 0 | 0 | 0 |
| 2017-04-08 00:00:00 | Adoption | 0.0 | 2017-05- 05 00:00:00 | Marriage/Relationship split | NaN | Died in care | 0 | 0 | 0 |
| 2017-03-29 00:00:00 | Adoption | 0.0 | 2017-04- 04 00:00:00 | Incompatible with owner lifestyle | NaN | Died in care | 0 | 0 | 0 |

- Many many categorical features -> Need one hot creating even more columns
- -> Might have too many columns -> curse of dimensionality
- HOWTO SOLVE:
- I) Regularization and Sparsity
- If supported by the model, I would recommend LI or ElasticNet regularization to zero-out some features.
- 2) Feature Selection
- We could try various different feature selection algorithms (e.g., selecting by variance or by greedy search: sequential backward/forward selection, genetic algorithms, etc.)
- 3) Adding dropout layers

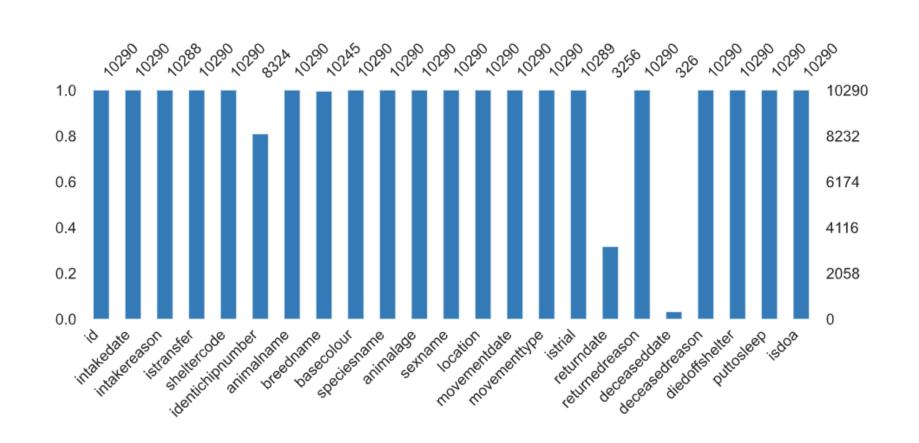
Feature selection and engineering:

*Need to create new features out of the date time which might be very troublesome My label is derived from multiple Booleans ---> not that easy to encode ...:(

Need to ensure I use one hot/ label encoding properly

Deceased & returned reason is propagated on all same IDs who have passed away/returned in the future.

Missing data plot



Feature selection and engineering:

- *Need to create new features out of the date time which might be very troublesome
- My label is derived from multiple Booleans ---> not that easy to encode ... :(
- Need to ensure I use one hot/ label encoding properly

- Animal age doesn't change and is only on intake date.
- Intake date also doesn't update to the return date
- It probably is not even worth it to re-categorise the data
- Cannot consider duplicates since they're all different

| id | intakedate | intakereason | movementtype | movementdate | returndate | animalage |
|-------|---------------------|--------------|--------------|---------------------|---------------------|--------------------|
| 60702 | 2018-08-24 08:18:50 | Stray | Foster | 2018-09-07 00:00:00 | 2018-09-13 00:00:00 | 11 years 5 months. |
| 60702 | 2018-08-24 08:18:50 | Stray | Foster | 2018-09-16 00:00:00 | 2018-10-02 00:00:00 | 11 years 5 months. |
| 60702 | 2018-08-24 08:18:50 | Stray | Foster | 2018-10-10 00:00:00 | 2018-10-18 00:00:00 | 11 years 5 months. |
| 60702 | 2018-08-24 08:18:50 | Stray | Foster | 2018-10-19 00:00:00 | 2018-10-31 00:00:00 | 11 years 5 months. |
| 60702 | 2018-08-24 08:18:50 | Stray | Foster | 2018-10-31 00:00:00 | 2018-11-04 00:00:00 | 11 years 5 months. |
| 60702 | 2018-08-24 08:18:50 | Stray | Foster | 2018-11-04 00:00:00 | 2018-11-21 00:00:00 | 11 years 5 months. |
| 60702 | 2018-08-24 08:18:50 | Stray | Foster | 2018-11-21 00:00:00 | 2018-12-03 00:00:00 | 11 years 5 months. |
| 60702 | 2018-08-24 08:18:50 | Stray | Foster | 2018-12-03 00:00:00 | 2018-12-21 00:00:00 | 11 years 5 months. |
| 60702 | 2018-08-24 08:18:50 | Stray | Foster | 2018-12-21 00:00:00 | 2019-01-04 00:00:00 | 11 years 5 months. |
| 60702 | 2018-08-24 08:18:50 | Stray | Foster | 2019-01-04 00:00:00 | 2019-02-03 00:00:00 | 11 years 5 months. |
| 60702 | 2018-08-24 08:18:50 | Stray | Adoption | 2019-02-03 00:00:00 | NaN | 11 years 5 months. |

Same same but with different data

CHALLENGES

| id | intakedate | intakereason | movementtype | movementdate | returndate | animalage |
|-------|---------------------|-----------------------------------|--------------|---------------------|---------------------|-------------------|
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Adoption | 2018-01-19 00:00:00 | 2018-02-18 00:00:00 | 2 years 4 months. |
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Foster | 2018-03-11 00:00:00 | 2018-04-06 00:00:00 | 2 years 4 months. |
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Foster | 2018-04-08 00:00:00 | 2018-04-13 00:00:00 | 2 years 4 months. |
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Foster | 2018-04-16 00:00:00 | 2018-05-12 00:00:00 | 2 years 4 months. |
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Foster | 2018-05-14 00:00:00 | 2018-05-24 00:00:00 | 2 years 4 months. |
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Foster | 2018-05-28 00:00:00 | 2018-06-21 00:00:00 | 2 years 4 months. |
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Adoption | 2018-06-21 00:00:00 | 2018-07-09 00:00:00 | 2 years 4 months. |
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Foster | 2018-07-09 00:00:00 | 2018-07-13 00:00:00 | 2 years 4 months. |
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Foster | 2018-07-15 00:00:00 | 2018-07-20 00:00:00 | 2 years 4 months. |
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Foster | 2018-07-23 00:00:00 | 2018-07-24 00:00:00 | 2 years 4 months. |
| 58510 | 2018-01-13 12:20:49 | Incompatible with owner lifestyle | Adoption | 2018-07-24 00:00:00 | NaN | 2 years 4 months. |

HOW

- Attempt AUTO ML with TPOT -> save me all the trouble of doing it manually -> Risk of highly overfitted data
- Also manually do it
- Mutli-class label -> AUC OVO &/or AUC OVR (Might need to manually call it for use in LAzyPredict)
- Hypertune the parameters and test on another dataset.
- Mitigate any under/overfitting.

Sub-goals:

- Do more Fostering sessions improve adoption rates and reduce adoption returns.
- Does animal age affect adoption rates &/or return rates
- is there a common reason for returns
- is there a common reason for abandonment
- Does the shelter itself actually affect the rate of adoption?
- will a binary label be easier for the machine to learn? Will consider it
- explain the bias variance trade off for models used.