

Steps In Order

I. CAMS as Real Hazardous Data

1. Import whole CAMS data

```
In[1]:= CAMS = Import["/Users/muxiliu/Downloads/CAMS-v3-2010to2016 .xlsx"]
```

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```
In[2]:= Length[CAMS[[1]]]
```

Out[2]= 471 587

2. Selecting relevant columns, only keeping 6 orbital elements and their uncertainties

```
In[3]:= CAMS0 = Table[{CAMS[[1]][[i]][[60]], CAMS[[1]][[i]][[61]], CAMS[[1]][[i]][[64]],
  CAMS[[1]][[i]][[65]], CAMS[[1]][[i]][[66]], CAMS[[1]][[i]][[67]],
  CAMS[[1]][[i]][[68]], CAMS[[1]][[i]][[69]], CAMS[[1]][[i]][[70]],
  CAMS[[1]][[i]][[71]], CAMS[[1]][[i]][[72]]}, {i, 4, 471587}]
```

```
Out[3]= { {q, ±, a, e, ±, i, ±, w, ±, Node, ±},
  { (AU), (AU), (AU), , , (°, J2000), , (°), , (°), (°) },
  ... 471580 ... , {0.5499, 0.0101, 11.59, 0.9525, 0.0195, 137.66,
  0.64, 84.46, 1.58, 100.423, 0.001}, {0.6611, 0.01194, 11.65,
  0.9433, 0.0297, 147.49, 0.89, 71.04, 1.92, 100.429, 0.002} }
```

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```
In[4]:= Length[CAMS0]
```

```
Out[4]= 471584
```

3. Change the title

```
In[4]:= CAMS1 = PrependTo[Table[CAMS0[[i]], {i, 3, 471584}], {"q(AU)", "qerror", "a(AU)", "e",
  "error", "i(°,J2000)", "ierror", "w(°)", "werror", "Node(°)", "Nodeerror"}]
```

... Set: Tag Table in Table[CAMS0[[i]], {i, 3, 471584}] is Protected.

```
Out[4]= { {q(AU), qerror, a(AU), e, error,
  i(°,J2000), ierror, w(°), werror, Node(°), Nodeerror},
  {0.9713, 0.0007, 2.85, 0.65907, 0.007, 22.16, 0.11, 159.82, 0.36, 207.481, 0.},
  {0.2584, 0.0023, 1.85, 0.8601, 0.002, 3.14, 0.24, 306.95, 0.4, 207.497, 0.003},
  {0.7837, 0.0147, 1.69, 0.536, 0.066, 11.23, 2.65, 247.03, 4.44, 207.543, 0.007},
  ... 471576 ... , {0.21646, 0.00489, 5.79, 0.9626, 0.0041, 152.12,
  0.94, 306.17, 0.65, 280.425, 0.001}, {0.5499, 0.0101, 11.59, 0.9525,
  0.0195, 137.66, 0.64, 84.46, 1.58, 100.423, 0.001}, {0.6611, 0.01194,
  11.65, 0.9433, 0.0297, 147.49, 0.89, 71.04, 1.92, 100.429, 0.002} }
```

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```
In[91]:= Mean[Table[CAMS1[[i]][[3]], {i, 2, Length[CAMS1]}]]
```

```
Out[91]= 127.502
```

```
In[64]:= Length[CAMS1]
Out[64]= 471583
```

10. Stuff for adjusting the amount and feature values of CAMS data to meet those of NEOs. Amount: similar “0”/all ratio with that in NEOs. Feature values: not too divergent from those of NEOs (through mean, max, and standard deviation).

```
In[ ]:= NEOsForTesting1 = {};
i = 1;
While[i < Length[NEOsForTesting] + 1, If[NEOsForTesting[[i]][[12]] == 1,
    NEOsForTesting1 = Append[NEOsForTesting1, NEOsForTesting[[i]]];
    i++];
Length[NEOsForTesting1]
```

```
Out[ ]:= 405
```

```
In[ ]:= StandardDeviation[Table[NEOs1[[i]][[6]], {i, 2, Length[NEOs1]}]]
Out[ ]:= 12.8141
```

```
In[ ]:= NEOsStat = {};
i = 1;
While[i < Length[NEOs1] + 1,
    If[NEOs1[[i]][[6]] > 80, NEOsStat = Append[NEOsStat, NEOs1[[i]]];
    i++];
Length[NEOsStat]
```

```
Out[ ]:= 5
```

```
In[354]:= N[
$$\frac{\text{Length[NEOsForTesting]} - \text{Length[NEOsForTesting1]}}{\text{Length[NEOsForTesting]}}$$
]
```

```
Out[354]= 0.780011
```

```
In[71]:= NumberOfNeeded1 =
    Round[
$$\frac{\text{Length[NEOsForTesting1]}}{\text{Length[NEOsForTesting]} - \text{Length[NEOsForTesting1]}} * \text{Length[NEOsForTraining1]}$$
]
```

```
Out[71]= 1609
```

```
In[330]:= CAMSForTraining0 = RandomSample[Delete[CAMS1, 1], Round[2.2 * NumberOfNeeded1]]
```

```
Out[330]:= {{0.45148, 0.00737, 4.88, 0.9074, 0.0044, 54.4, 0.3, 277.99, 0.98, 253.27, 0.},
 {0.24487, 0.00146, 2.5, 0.9019, 0.0015, 2.43, 0.22, 306.37, 0.21, 24.221, 0.008},
 ... 3536 ..., {0.70496, 0.03965, 9.06, 0.9222,
 0.1682, 120.11, 2.9, 111.35, 8.48, 132.56, 0.002},
 {0.67591, 0.02243, 1.91, 0.6464, 0.0205, 136.89, 1.57, 279.45, 3.1, 350.57, 0.}}
```

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```
In[331]:= CAMSForTrainingNE0 = {};
```

```
  i = 1;
```

```
  While[i < Length[CAMSForTraining0] + 1, If[CAMSForTraining0[[i]][[3]] < 10,
    CAMSForTrainingNE0 = Append[CAMSForTrainingNE0, CAMSForTraining0[[i]]];
```

```
    i++];
```

```
  Length[CAMSForTrainingNE0]
```

```
Out[333]= 2601
```

```
In[342]:= StandardDeviation[
```

```
  Table[CAMSForTrainingNE01[[i]][[6]], {i, 1, Length[CAMSForTrainingNE01]}]]
```

```
Out[342]= 20.0144
```

```
In[344]:= CAMSForTrainingNE01
```

```
Out[344]:= {{0.45148, 0.00737, 4.88, 0.9074, 0.0044, 54.4, 0.3, 277.99, 0.98, 253.27, 0.},
 {0.24487, 0.00146, 2.5, 0.9019, 0.0015, 2.43,
 0.22, 306.37, 0.21, 24.221, 0.008}, ... 1682 ...,
 {0.08904, 0.0027, 2.11, 0.9578, 0.0019, 25.04, 0.66, 149.82, 0.5, 320.95, 0.},
 {0.14865, 0.00097, 1.3, 0.8854, 0.0009, 22.63, 0.19, 323.9, 0.14, 261.318, 0.}}
```

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```
In[334]:= CAMSForTrainingNE01 = {};
```

```
  i = 1;
```

```
  While[i < Length[CAMSForTrainingNE0] + 1, If[CAMSForTrainingNE0[[i]][[6]] < 80,
    CAMSForTrainingNE01 = Append[CAMSForTrainingNE01, CAMSForTrainingNE0[[i]]];
```

```
    i++];
```

```
  Length[CAMSForTrainingNE01]
```

```
Out[336]= 1686
```

11. This is the CAMs data ready to go.

```
In[345]:= CAMST = Transpose[  
  Append[Transpose[CAMSTForTrainingNE01], Table[1, Length[CAMSTForTrainingNE01]]]]
```

Out[345]=

```
{ {0.45148, 0.00737, 4.88, 0.9074, 0.0044,  
  54.4, 0.3, 277.99, 0.98, 253.27, 0., 1}, ... 1684 ... ,  
  {0.14865, 0.00097, 1.3, 0.8854, 0.0009, 22.63, 0.19, 323.9, 0.14, 261.318, 0., 1} }
```

large output

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II. NEOs for training mixing and for prediction.

4. Import NEOs with PHA-defined and $H \leq 22$

In[6]:= `NEOs = Import[\"/Users/muxiliu/Downloads/results (12).csv\"]`

Out[6]= `{ {id, pha, neo, e, a, q, i, om, w, sigma_e, sigma_q, sigma_i, sigma_om, sigma_w}, ... 920`

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In[21]:= `NEOs[[1]]`

Out[21]= `{id, pha, neo, e, a, q, i, om, w, sigma_e, sigma_q, sigma_i, sigma_om, sigma_w}`

5. reordering the columns to match the CAMS data.

In[22]:= `NEOs0 = Table[
 {NEOs[[i]][[6]], NEOs[[i]][[11]], NEOs[[i]][[5]], NEOs[[i]][[4]], NEOs[[i]][[10]],
 NEOs[[i]][[7]], NEOs[[i]][[12]], NEOs[[i]][[9]], NEOs[[i]][[14]],
 NEOs[[i]][[8]], NEOs[[i]][[13]], NEOs[[i]][[2]]}, {i, 1, Length[NEOs]}`

Out[22]= `{ {q, sigma_q, a, e, sigma_e, i, sigma_i, w, sigma_w, om, sigma_om, pha},
 ... 9205 ... , {0.950941, 1.6871 × 10-7, 2.81715, 0.662446, 6.6368 × 10-8,
 4.67928, 0.000018533, 234.895, 0.000089692, 182.983, 0.000056917, Y}}`

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6. Change Y and N in the 'pha' column to 1 and 0.

In[24]:= **NEOs05 = NEOs0 / . "Y" → 1**

Out[24]=

```
{ {q, sigma_q, a, e, sigma_e, i, sigma_i, w, sigma_w, om, sigma_om, pha},
  {1.13297, 2.6168 × 10-10, 1.45805, 0.222951, 1.2856 × 10-10, 10.8305,
   4.0878 × 10-8, 178.882, 2.4392 × 10-7, 304.299, 2.1639 × 10-7, N},
  ... 9203 ... , {0.544439, 0.0038723, 1.72447, 0.684286, 0.0044412,
   12.774, 0.059463, 290.259, 0.7191, 316.946, 0.2133, N},
  {0.950941, 1.6871 × 10-7, 2.81715, 0.662446, 6.6368 × 10-8, 4.67928,
   0.000018533, 234.895, 0.000089692, 182.983, 0.000056917, 1}}
```

large output

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In[25]:= **NEOs09 = NEOs05 / . "N" → 0**

Out[25]=

```
{ {q, sigma_q, a, e, sigma_e, i, sigma_i, w, sigma_w, om, sigma_om, pha},
  {1.13297, 2.6168 × 10-10, 1.45805, 0.222951, 1.2856 × 10-10, 10.8305,
   4.0878 × 10-8, 178.882, 2.4392 × 10-7, 304.299, 2.1639 × 10-7, 0},
  ... 9203 ... , {0.544439, 0.0038723, 1.72447, 0.684286, 0.0044412,
   12.774, 0.059463, 290.259, 0.7191, 316.946, 0.2133, 0},
  {0.950941, 1.6871 × 10-7, 2.81715, 0.662446, 6.6368 × 10-8, 4.67928,
   0.000018533, 234.895, 0.000089692, 182.983, 0.000056917, 1}}
```

large output

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7. Shuffle

In[52]:= **NEOs1 = RandomSample[Delete[NEOs09, 1]]**

Out[52]=

```
{ {0.917364, 0.0029289, 1.55211, 0.408956, 0.00031644,
   51.9561, 0.31745, 14.0655, 0.16341, 36.9336, 0.0063784, 0},
  {1.28547, 1.4921 × 10-7, 2.63296, 0.511775, 5.6799 × 10-8, 24.4952,
   0.000016742, 259.886, 0.000031075, 234.322, 0.000016709, 0},
  ... 9203 ... , {1.08734, 2.19 × 10-7, 2.43474, 0.553408, 8.4299 × 10-8,
   8.8995, 0.000012923, 355.094, 0.00007692, 308.935, 0.000080209, 0}}
```

large output

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In[54]:= **Length[NEOs1]**

Out[54]= 9206

8. splitting the data into 80/20.

In[55]:= **NEOsForTraining0** = Table[NEOs1[[i]], {i, 1, Round[0.8 * Length[NEOs1]]}]

Out[55]=

```
{ {0.917364, 0.0029289, 1.55211, 0.408956, 0.00031644,
  51.9561, 0.31745, 14.0655, 0.16341, 36.9336, 0.0063784, 0},
  {1.28547, 1.4921 × 10-7, 2.63296, 0.511775, 5.6799 × 10-8, 24.4952,
  0.000016742, 259.886, 0.000031075, 234.322, 0.000016709, 0},
  {0.740625, 5.6513 × 10-7, 1.05216, 0.296088, 6.2608 × 10-7, 7.90666,
  0.000013751, 242.303, 0.000072207, 128.827, 0.000090308, 1},
  {1.0416, 0.086431, 1.88992, 0.448866, 0.066854, 5.85772,
  0.67616, 125.012, 13.813, 179.696, 1.054, 0}, ... 7358 ...
  {0.923016, 1.3566 × 10-6, 2.73496, 0.662511, 0.00001386, 18.6341,
  0.00029696, 227.212, 0.000055958, 207.613, 0.00005802, 1},
  {0.481869, 7.6377 × 10-7, 1.04021, 0.536756, 7.7467 × 10-7, 17.462,
  0.000018609, 149.892, 0.000036816, 48.2625, 0.000018833, 0},
  {1.20602, 3.4805 × 10-6, 1.48899, 0.190039, 9.8539 × 10-6, 4.89264,
  0.000093718, 138.429, 0.00068154, 115.819, 0.00057095, 0} }
```

large output

[show less](#)

[show more](#)

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[set size limit...](#)

In[56]:= **Length[NEOsForTraining0]**

Out[56]= 7365

In[65]:= **NEOsForTesting** = Table[NEOs1[[i]], {i, Length[NEOsForTraining0] + 1, Length[NEOs1]}]

Out[65]=

```
{ {0.785601, 5.3672 × 10-7, 1.4678, 0.464776, 3.53 × 10-7,
  2.34153, 0.000013635, 3.3017, 0.00058664, 271.825, 0.00058532, 1},
  {0.963866, 8.0274 × 10-8, 2.07328, 0.535102, 3.8658 × 10-8, 1.43065,
  6.4926 × 10-6, 123.068, 0.00047759, 235.392, 0.00047768, 1},
  ... 1838 ...
  {1.08734, 2.19 × 10-7, 2.43474, 0.553408, 8.4299 × 10-8,
  8.8995, 0.000012923, 355.094, 0.00007692, 308.935, 0.000080209, 0} }
```

large output

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In[66]:= **Length[NEOsForTesting]**

Out[66]= 1841

9. only keep those with pha=0 to form the really non-hazardous data set

In[62]:=

```
NEOsForTraining1 = {};
i = 1;
While[i < Length[NEOsForTraining0] + 1, If[NEOsForTraining0[[i]][[12]] == 0,
  NEOsForTraining1 = Append[NEOsForTraining1, NEOsForTraining0[[i]]];
  i++];
Length[NEOsForTraining1]
```

Out[62]= 5706

In[63]:= NEOsForTraining1

Out[63]=

```
{ {0.917364, 0.0029289, 1.55211, 0.408956, 0.00031644,
  51.9561, 0.31745, 14.0655, 0.16341, 36.9336, 0.0063784, 0},
  ... 5704 ..., {1.20602, 3.4805 × 10-6, 1.48899, 0.190039, 9.8539 × 10-6,
  ... 2 ..., 138.429, 0.00068154, 115.819, 0.00057095, 0}}
```

large output

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III. Final Combination

12. Combine CAMS-ready-to-go with non-hazardous NEOs for training

In[346]:= **ToGo0 = Join[NEOsForTraining1, CAMST]**

Out[346]= $\left\{ \left\{ 0.917364, 0.0029289, 1.55211, 0.408956, 0.00031644, 51.9561, \right. \right.$
 $\left. 0.31745, 14.0655, 0.16341, 36.9336, 0.0063784, 0 \right\}, \dots 7390 \dots,$
 $\left\{ 0.14865, 0.00097, 1.3, 0.8854, 0.0009, 22.63, 0.19, 323.9, 0.14, 261.318, 0., 1 \right\} \right\}$

large output

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In[347]:= **Length[ToGo0]**

Out[347]= 7392

13. Add the column names.

In[348]:= **ToGo = Prepend[RandomSample[ToGo0], {"q(AU)", "qerror", "a(AU)", "e", "eerror", "i(°,J2000)", "ierror", "w(°)", "werror", "Node(°)", "Nodeerror", "danger"}]**

Out[348]= $\left\{ \left\{ q(AU), qerror, a(AU), e, eerror, i(°,J2000), \right. \right.$
 $ierror, w(°), werror, Node(°), Nodeerror, danger \right\}, \dots 7391 \dots,$
 $\left\{ 1.27412, 2.8991 \times 10^{-6}, 1.87435, 0.320232, 2.0461 \times 10^{-6}, 38.8307, \right.$
 $\left. 0.00011544, 161.867, 0.00020762, 253.256, 0.00013577, 0 \right\} \right\}$

large output

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14. Add the column names for the prediction data set.

In[351]:= **Testing = Prepend[RandomSample[NEOsForTesting], {"q(AU)", "qerror", "a(AU)", "e", "eerror", "i(°,J2000)", "ierror", "w(°)", "werror", "Node(°)", "Nodeerror", "danger"}]**

Out[351]= $\left\{ \left\{ q(AU), qerror, a(AU), e, eerror, i(°,J2000), \right. \right.$
 $ierror, w(°), werror, Node(°), Nodeerror, danger \right\}, \dots 1840 \dots,$
 $\left\{ 1.023, 2.2228 \times 10^{-7}, 2.23032, 0.541322, 9.9818 \times 10^{-8}, 39.6477, \right.$
 $\left. 0.000014079, 4.61201, 0.000015518, 267.205, 0.000013838, 1 \right\} \right\}$

large output

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In[349]:= **Length[ToGo]**

Out[349]= 7393

15. Finally, export the training and prediction data set.

```
In[350]:= Export["TrainingToGo.csv", ToGo]
```

```
Out[350]= TrainingToGo.csv
```

```
In[352]:= Export["TestingToGo.csv", Testing]
```

```
Out[352]= TestingToGo.csv
```