Three-input models

ADVANCED DEEP LEARNING WITH KERAS IN PYTHON

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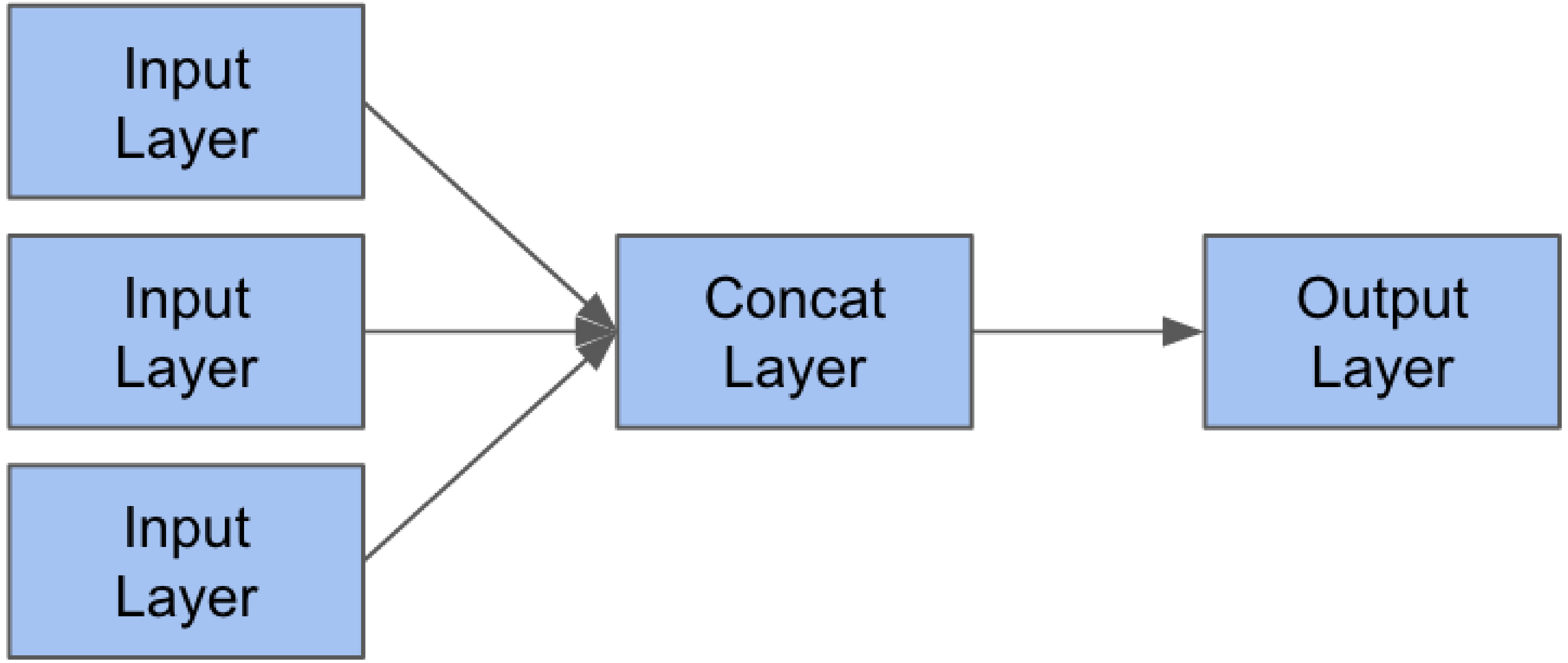
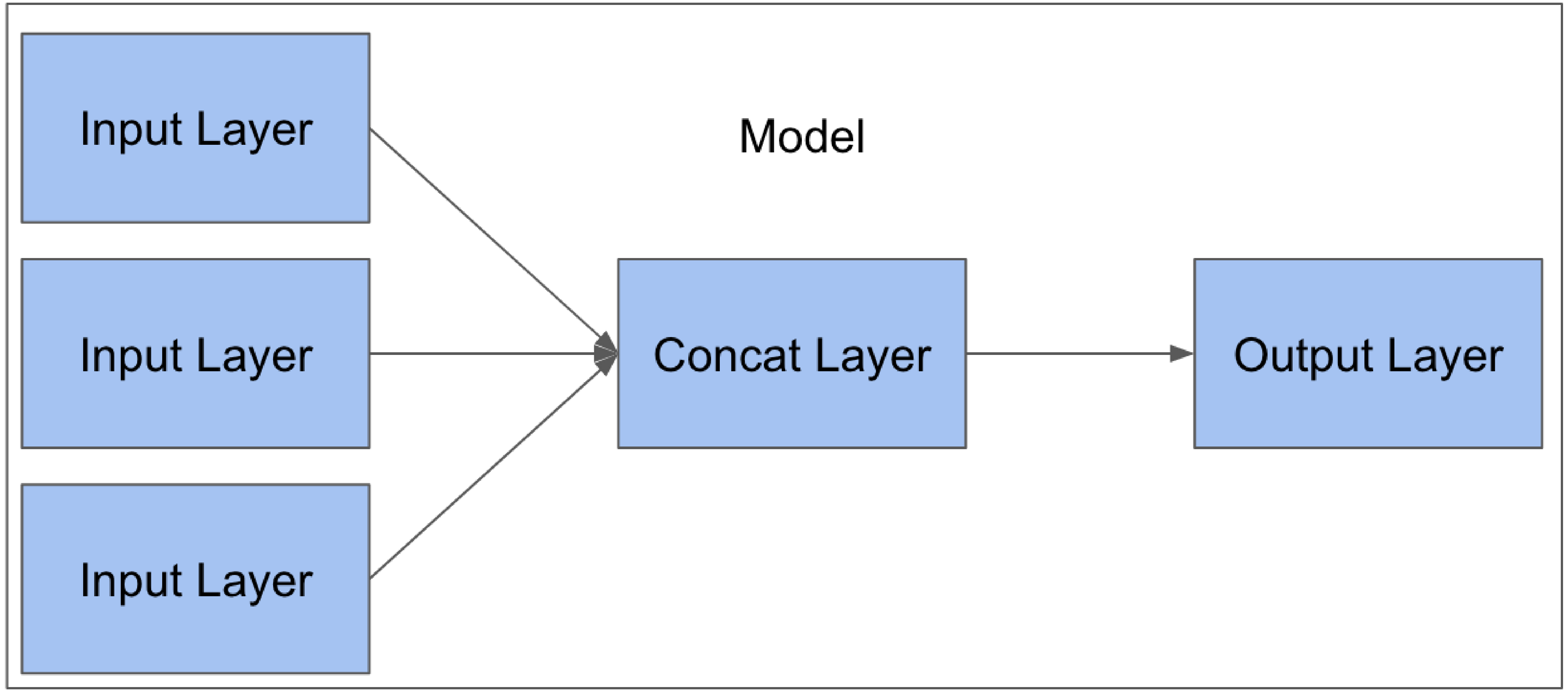
Simple model with 3 inputs

```
from keras.layers import Input, Concatenate, Dense
in_tensor_1 = Input(shape=(1,))
in_tensor_2 = Input(shape=(1,))
in_tensor_3 = Input(shape=(1,))
out_tensor = Concatenate()([in_tensor_1, in_tensor_2, in_tensor_3])
output_tensor = Dense(1)(out_tensor)
```



Simple model with 3 inputs

```
from keras.models import Model
model = Model([in_tensor_1, in_tensor_2, in_tensor_3], out_tensor)
```

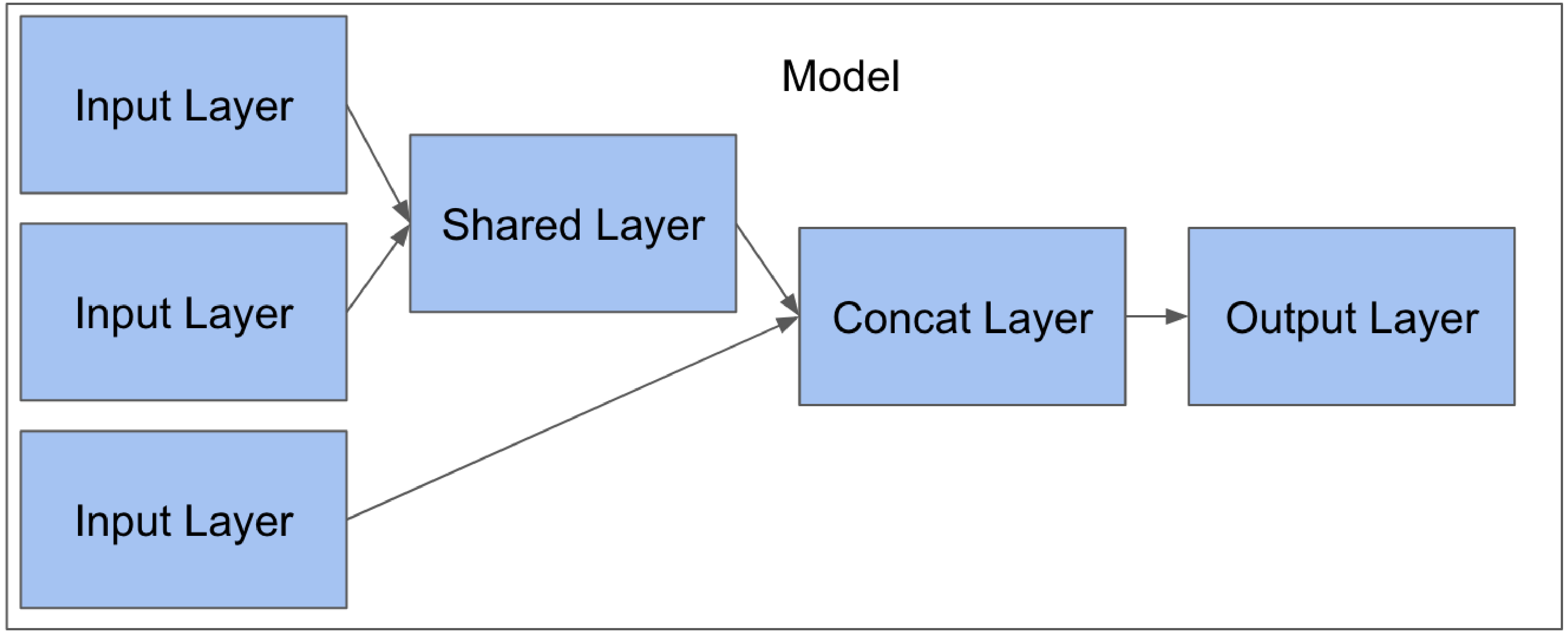


Shared layers with 3 inputs

```
shared_layer = Dense(1)
shared_tensor_1 = shared_layer(in_tensor_1)
shared_tensor_2 = shared_layer(in_tensor_1)
out_tensor = Concatenate()([shared_tensor_1, shared_tensor_2, in_tensor_3])
out_tensor = Dense(1)(out_tensor)
```

Shared layers with 3 inputs

```
from keras.models import Model
model = Model([in_tensor_1, in_tensor_2, in_tensor_3], out_tensor)
```



Fitting a 3 input model

```
from keras.models import Model
model = Model([in_tensor_1, in_tensor_2, in_tensor_3], out_tensor)
model.compile(loss='mae', optimizer='adam')
```

```
model.fit([[train['col1'], train['col2'], train['col3']],
          train_data['target'])
```

```
model.evaluate([[test['col1'], test['col2'], test['col3']],
               test['target'])
```

Let's practice

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Summarizing and plotting models

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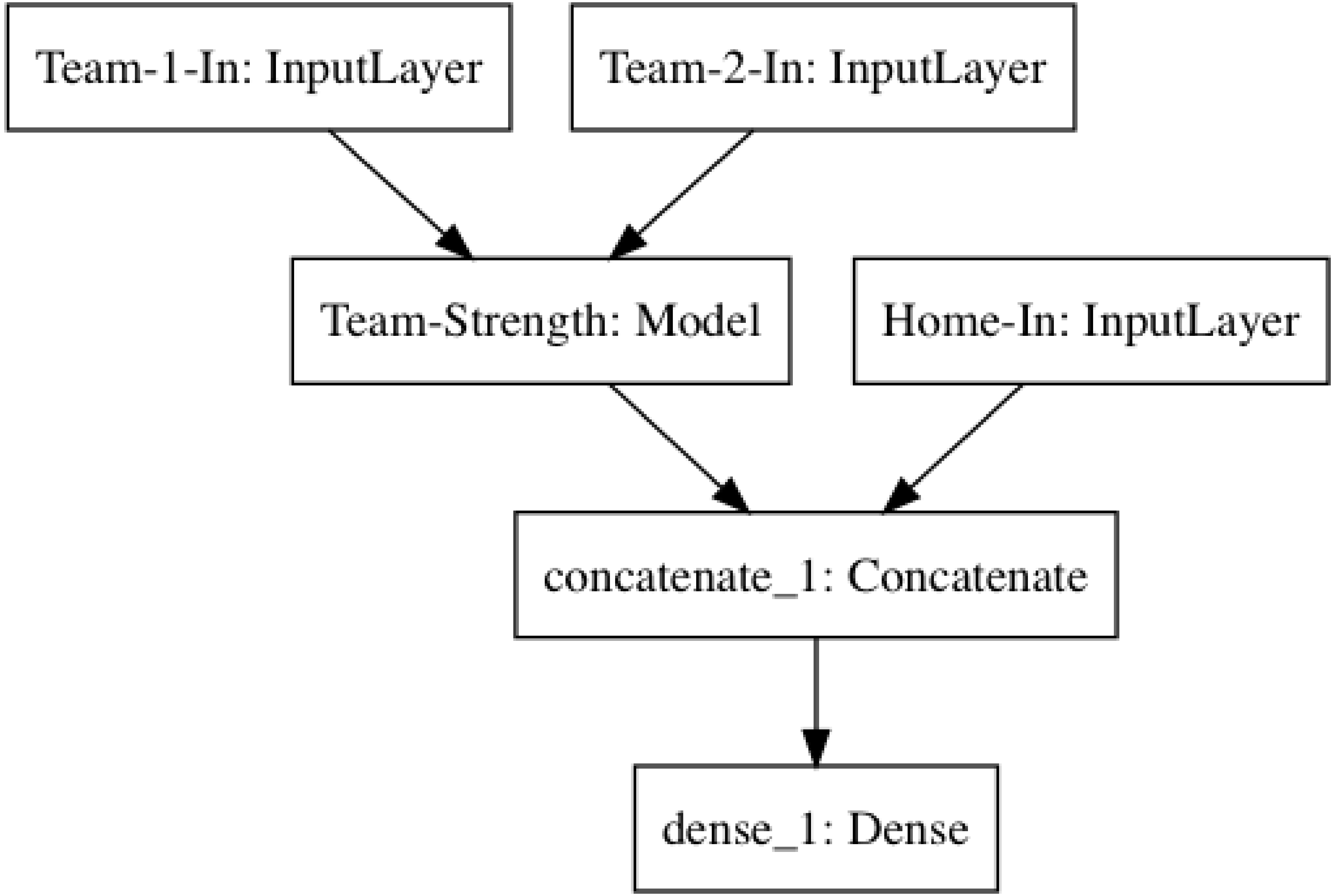
Understanding a model summary

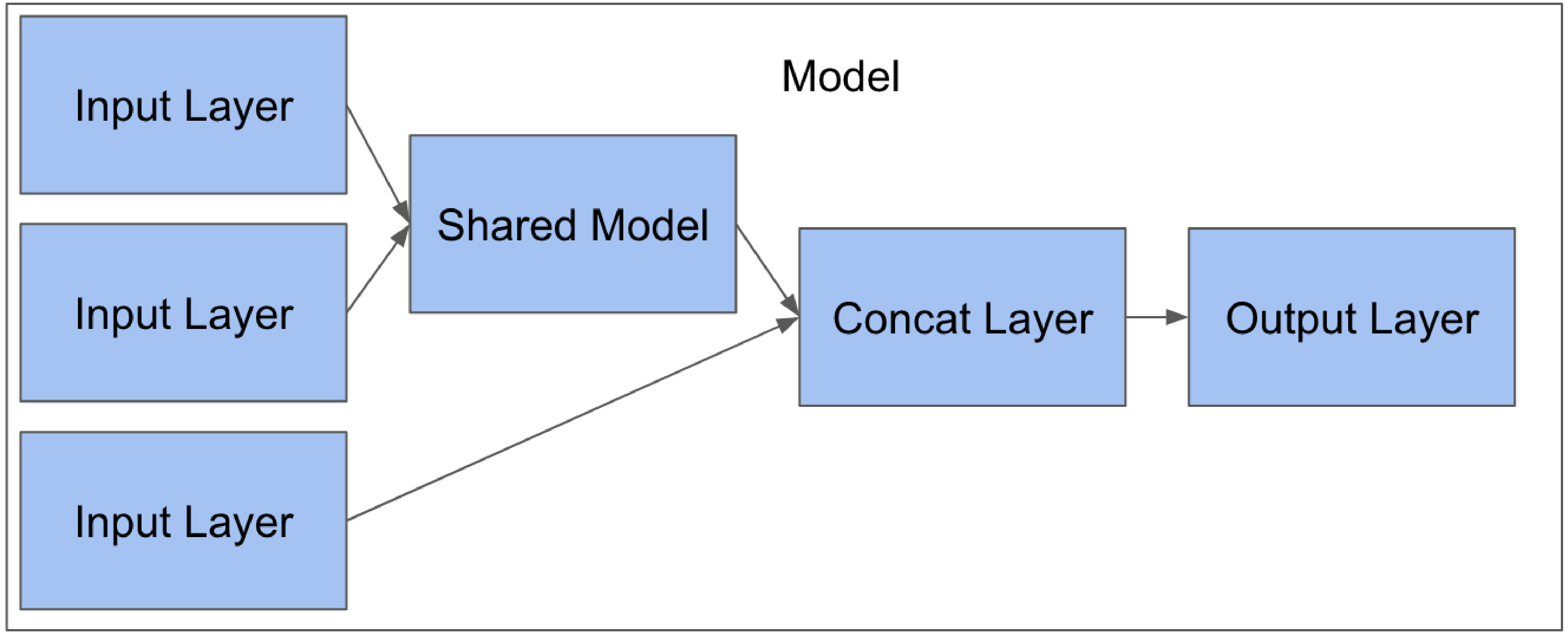
```
_______________________________________________________________________________________________
Layer (type)                    Output Shape         Param #     Connected to
===============================================================================================
input_1 (InputLayer)            (None, 1)            0
_______________________________________________________________________________________________
input_2 (InputLayer)            (None, 1)            0
_______________________________________________________________________________________________
input_3 (InputLayer)            (None, 1)            0
_______________________________________________________________________________________________
concatenate_1 (Concatenate)     (None, 3)            0           input_1[0][0]
                                                                 input_2[0][0]
                                                                 input_3[0][0]
_______________________________________________________________________________________________
dense_1 (Dense)                 (None, 1)            4           concatenate_1[0][0]
===============================================================================================
Total params: 4
Trainable params: 4
Non-trainable params: 0
_______________________________________________________________________________________________
```

Understanding a model summary

```
__________________________________________________________________________________________________
Layer (type)                    Output Shape         Param #     Connected to
==================================================================================================
input_1 (InputLayer)            (None, 1)            0
__________________________________________________________________________________________________
embedding_1 (Embedding)         (None, 1, 1)         10887       input_1[0][0]
__________________________________________________________________________________________________
flatten_1 (Flatten)             (None, 1)            0           embedding_1[0][0]
__________________________________________________________________________________________________
input_2 (InputLayer)            (None, 1)            0
__________________________________________________________________________________________________
input_3 (InputLayer)            (None, 1)            0
__________________________________________________________________________________________________
concatenate_1 (Concatenate)     (None, 3)            0           flatten_1[0][0]
                                                                 input_2[0][0]
                                                                 input_3[0][0]
__________________________________________________________________________________________________
dense_1 (Dense)                 (None, 1)            4           concatenate_1[0][0]
==================================================================================================
Total params: 10,891
Trainable params: 10,891
Non-trainable params: 0
```


Team-1-In: InputLayer
Team-2-In: InputLayer
Team-Strength: Model
Home-In: InputLayer
concatenate_1: Concatenate
dense_1: Dense

Understanding a model plot!



Let's Practice

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Stacking models

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Stacking models requires 2 datasets

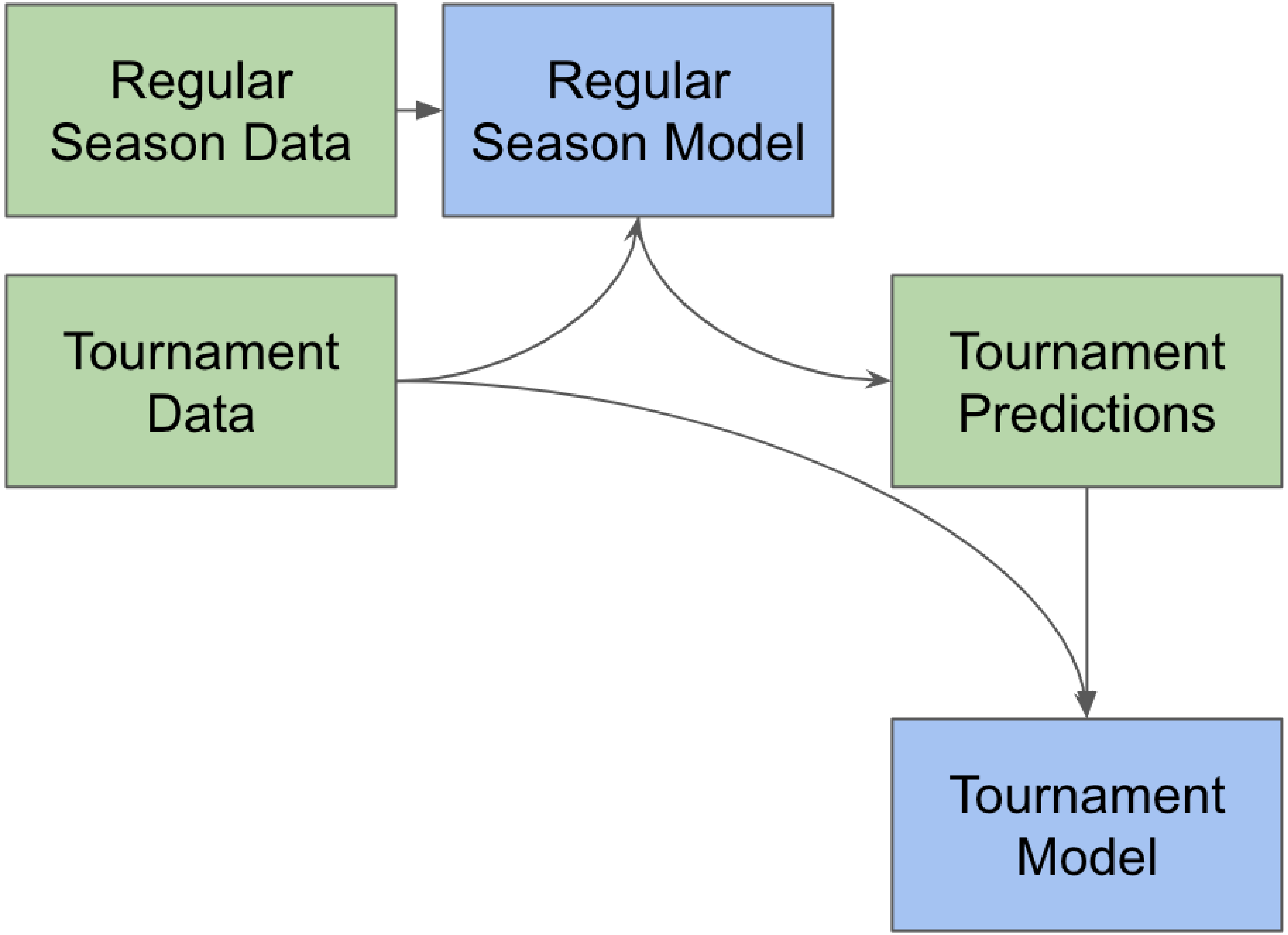
```
from pandas import read_csv
games_season = read_csv('datasets/games_season.csv')
games_season.head()

   team_1  team_2  home  score_diff
0    3745    6664     0          17
1     126    7493     1           7
2     288    3593     1           7
3    1846    9881     1          16
4    2675   10298     1          12
```

```
games_tourney = read_csv('datasets/games_tourney.csv')
games_tourney.head()

   team_1  team_2  home  seed_diff  score_diff
0     288      73     0         -3          -9
1    5929      73     0          4           6
2    9884      73     0          5          -4
3      73     288     0          3           9
4    3920     410     0          1          -9
```

Enrich the tournament data

```
in_data_1 = games_tourney['team_1']
in_data_2 = games_tourney['team_2']
in_data_3 = games_tourney['home']
pred = regular_season_model.predict([in_data_1, in_data_2, in_data_3
```

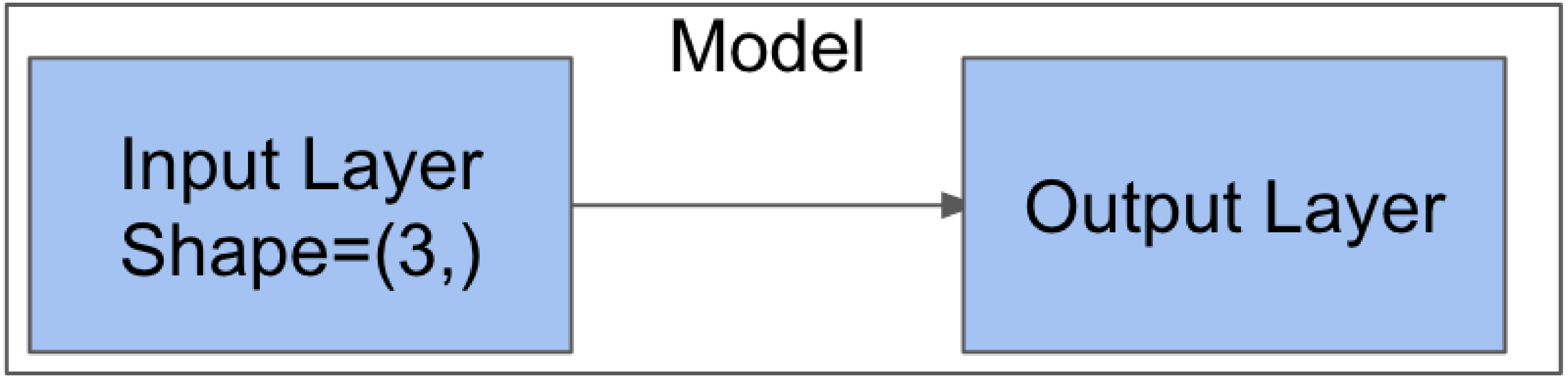
```
games_tourney['pred'] = pred
games_tourney.head()


   team_1  team_2  home  seed_diff      pred  score_diff
0     288      73     0         -3  0.582556          -9
1    5929      73     0          4  0.707279           6
2    9884      73     0          5  1.364844          -4
3      73     288     0          3  0.699145           9
4    3920     410     0          1  0.833066          -9
```


Regular Season Data
Regular Season Model
Tournament Data
Tournament Predictions
Tournament Model

3 input model with pure numeric data

```
games_tourney[['home','seed_diff','pred']].head()


   home  seed_diff      pred
0     0         -3  0.582556
1     0          4  0.707279
2     0          5  1.364844
3     0          3  0.699145
4     0          1  0.833066
```

3 input model with pure numeric data



3 input model with pure numeric data

```
from keras.layers import Input, Dense
in_tensor = Input(shape=(3,))
out_tensor = Dense(1)(in_tensor)
```

```
from keras.models import Model
model = Model(in_tensor, out_tensor)
model.compile(optimizer='adam', loss='mae')
train_X = train_data[['home','seed_diff','pred']]
train_y = train_data['score_diff']
model.fit(train_X,train_y, epochs=10, validation_split=.10)
```

```
test_X = test_data[['home','seed_diff','pred']]
test_y = test_data['score_diff']
model.evaluate(test_X, test_y)
1066/1066 [==============================] - 0s 14us/step
9.11321775461451
```

Let's practice!

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