

# Sean Doolittle

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## Imports

```
In [1]: import math
import matplotlib.patches as mpatches
from matplotlib.patches import Rectangle
from matplotlib.colors import ListedColormap
import warnings
warnings.filterwarnings('ignore')
```

## Data

```
In [2]: doolittle = pd.read_csv('../data/sean-doolittle.csv')
doolittle.drop(columns = ['Unnamed: 0'], inplace = True)
doolittle.dropna(subset = ['pitch_type'], inplace = True)
```

```
# Font Dictionary
font_title = {
    'size': 14,
    'weight': 'bold',
    'verticalalignment': 'center_baseline',
    'horizontalalignment': 'center'
}
```

```
pd.set_option('max_columns', None)
print(doolittle.shape)
doolittle.head(2)
```

```
Out[2]:
```

	pitch_type	game_date	release_speed	release_pos_x	release_pos_y	player_name	batter	pitcher	events	description	zone
0	FF	2021-07-27	94.7	2.07	5.79	Doolittle, Sean	519203	448281	out	hit_into_play	14

```
1
```

1	FF	2021-07-27	95.3	2.09	5.83	Doolittle, Sean	592178	448281	walk	ball	12
---	----	------------	------	------	------	-----------------	--------	--------	------	------	----

```
In [3]: gen_data = doolittle[['pitch_type', 'release_speed', 'release_spin_rate',
                             'is_strike', 'release_pos_x', 'release_pos_y', 'batter_units']]
col_dict = {
    'release_speed': 'velo', 'release_spin_rate': 'spin', 'pitch_type': 'pitch_type', 'batter_units': 'batter_units',
    'is_strike': 'strike', 'release_pos_x': 'r_side', 'release_pos_y': 'r_height'
}
gen_data.rename(columns = col_dict, inplace = True)
```

```
hit_labels = [1, 2, 3, 4, 5]
doolittle['hard_hit_summary'] = pd.qcut(doolittle['launch_speed'], [0, .5262, .617, .7283, .8278, 1],
                                       labels = hit_labels)
```

## Index DataFrame to Get Pitch Types

```
In [4]: # doolittle.pitch_type.value_counts(normalize=True)
r_doolittle = doolittle.loc[doolittle['stand'] == 'R']
l_doolittle = doolittle.loc[doolittle['stand'] == 'L']
# all hitters
ff = doolittle.loc[doolittle['pitch_type'] == 'FF']
cu = doolittle.loc[doolittle['pitch_type'] == 'CU']
sl = doolittle.loc[doolittle['pitch_type'] == 'SL']
fs = doolittle.loc[doolittle['pitch_type'] == 'FS']
```

```
# LH
r_ff = r_doolittle.loc[r_doolittle['pitch_type'] == 'FF']
r_cu = r_doolittle.loc[r_doolittle['pitch_type'] == 'CU']
r_sl = r_doolittle.loc[r_doolittle['pitch_type'] == 'SL']
r_fs = r_doolittle.loc[r_doolittle['pitch_type'] == 'FS']
```

```
# RH
l_ff = l_doolittle.loc[l_doolittle['pitch_type'] == 'FF']
l_cu = l_doolittle.loc[l_doolittle['pitch_type'] == 'CU']
l_sl = l_doolittle.loc[l_doolittle['pitch_type'] == 'SL']
l_fs = l_doolittle.loc[l_doolittle['pitch_type'] == 'FS']
order = ['FF', 'CU', 'SL', 'FS']
```

```
ff_tilt = ff['phi'].mean()
cu_tilt = cu['phi'].mean()
sl_tilt = sl['phi'].mean()
fs_tilt = fs['phi'].mean()
```

## Pitcher Overview

### General Pitch Data

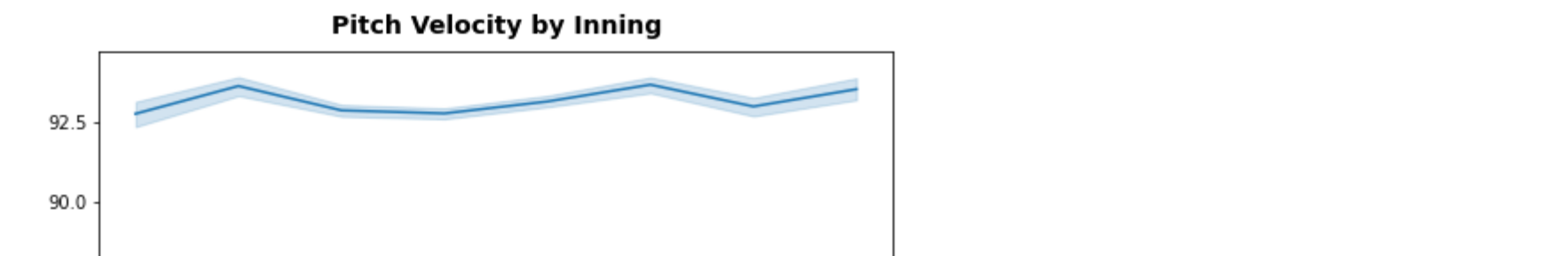
```
In [5]: gen_data.groupby(['pitch_type'], sort = False).mean()
```

```
Out[5]:
```

	velo	spin	true_spin	spin_off	spin_axis	hb	vb	strike	r_side	r_height	bauer
pitch_type											
FF	93.082454	2260.75489	1836.341299	0.810455	165.846154	20.023248	-3.623077	0.703704	1.757863	6.082806	24.26
SL	84.180051	2260.042533	319.597273	0.143030	218.484848	5.956596	2.872340	0.674468	2.021915	6.078085	30.86
CU	79.782055	2405.307692	356.355789	0.149474	267.316789	0.967692	7.756923	0.651282	2.093462	5.903590	26.19
FS	80.420513	992.230769	666.579310	0.702414	149.968750	9.603077	-6.750769	0.461538	1.972821	5.942821	12.15

### Pitch Usage

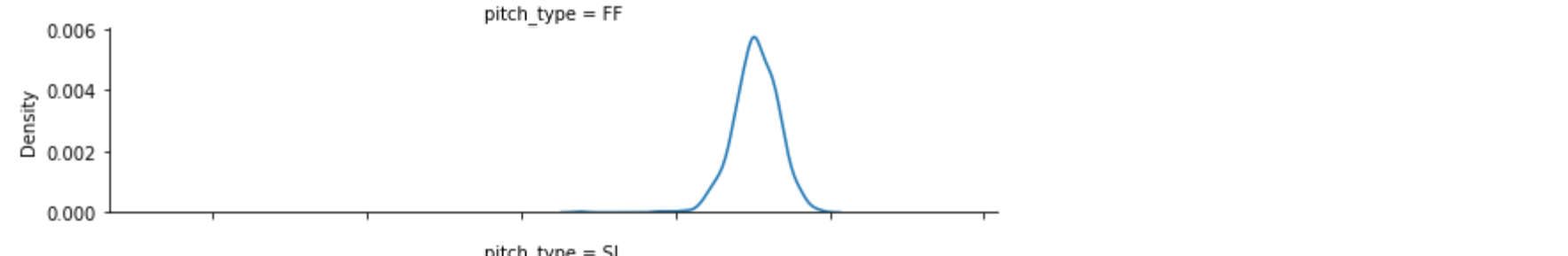
```
In [6]: plt.figure(figsize = (8, 6))
dist = round(doolittle.pitch_type.value_counts(normalize = True), 2)
color = sns.color_palette('coolwarm_r')
plt.pie(dist, labels = order, colors = color, autopct = '%.0f%%')
plt.title('Distribution of Pitch Types - Sean Doolittle', fontdict = font_title, pad = 15);
```



### Pitch Usage by Batter Handedness

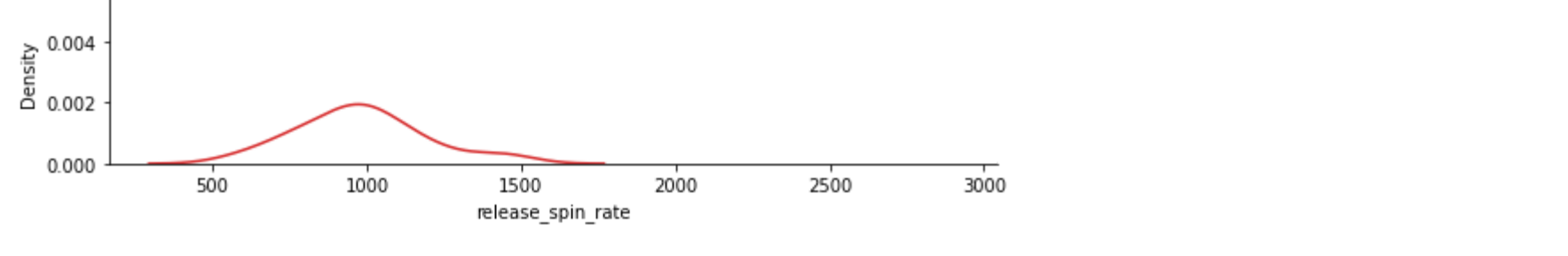
```
In [7]: blue = '#002072'
red = '#D62728'
fig, axs = plt.subplots(1, 2, figsize = (20, 6))
fig.suptitle('Pitch Usage by Batter Handedness', fontsize = 16, fontweight = 'bold')
axs[0].hist(dist_r, weights = np.ones(len(dist_r)) / len(dist_r), color = blue)
axs[0].yaxis.set_major_formatter(PercentFormatter(1))
axs[0].set_title('Distribution of Pitch Types - RH', fontdict = font_title, pad = 15)
```

```
axs[1].hist(dist_l, weights = np.ones(len(dist_l)) / len(dist_l), color = red)
axs[1].yaxis.set_major_formatter(PercentFormatter(1))
axs[1].set_title('Distribution of Pitch Types - LH', fontdict = font_title, pad = 15);
```



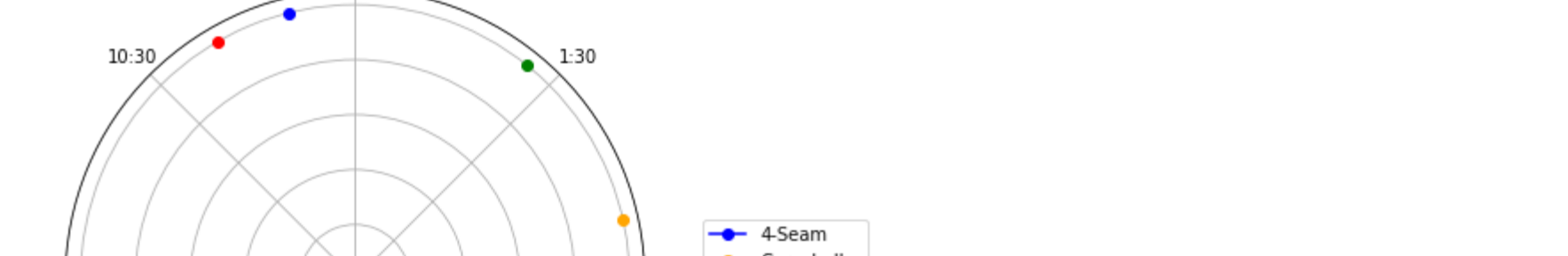
### Velocity by Pitch Type

```
In [8]: plt.figure(figsize = (8, 6))
ax = sns.kdeplot(data = doolittle, x = 'release_speed', shade = 'fill', hue = 'pitch_type',
                 order = order, palette = 'tab10')
sns.move_legend(ax, 'upper left')
plt.title('Distribution of Velocity by Pitch Type - Sean Doolittle', fontdict = font_title, pad = 12);
```



### Pitch Velocity by Inning

```
In [9]: sns.lineplot(data = doolittle, x = 'inning', y = 'release_speed', hue = 'pitch_type',
                  hue_order = order, palette = 'tab10')
plt.title('Pitch Velocity by Inning', fontdict = font_title, pad = 15);
```



## Pitcher Stuff

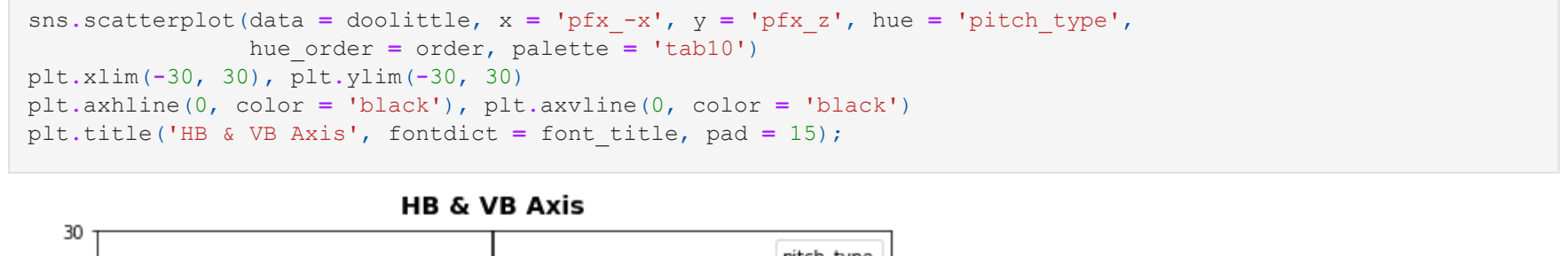
### Spin Rate by Pitch Type

```
In [10]: g = sns.FacetGrid(doolittle, row = 'pitch_type', hue = 'pitch_type', hue_order = order, palette = 'tab10',
                        height = 4, aspect = 4)
g.map(sns.kdeplot, 'release_spin_rate', palette = 'tab10')
```



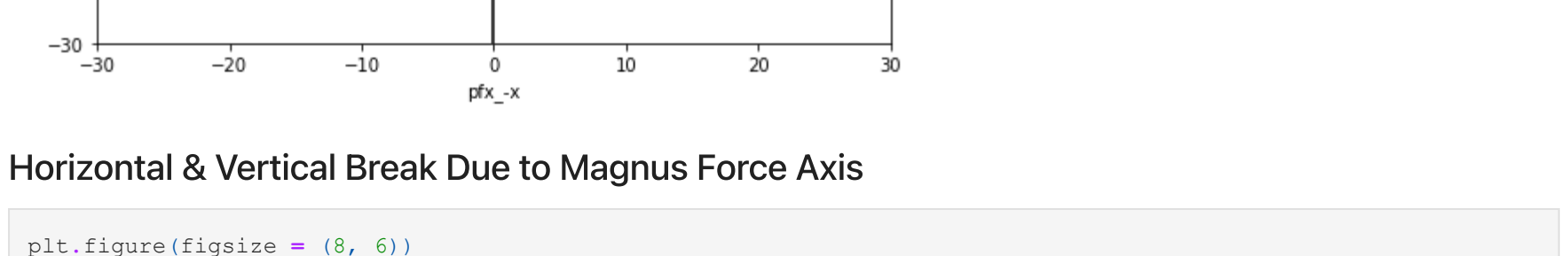
### Spin Axis

```
In [11]: ax = plt.figure(figsize = (8, 6))
ax = plt.subplot(polar = True, theta direction = 1)
ax.plot(math.radians(ff_tilt), 1, color = 'blue', marker = 'o', label = '4-Seam')
ax.plot(math.radians(cu_tilt), 1, color = 'orange', marker = 'o', label = 'Curveball')
ax.plot(math.radians(sl_tilt), 1, color = 'green', marker = 'o', label = 'Slider')
ax.plot(math.radians(fs_tilt), 1, color = 'red', marker = 'o', label = 'Split-Finger')
ticks = ['15:30', '7:30', '9:00', '10:30', '12:00', '1:30', '3:00', '4:30', '6:00', '7:30', '9:00', '10:30']
ax.set_xticklabels(ticks, ax.legend(loc = 'right', bboxtoanchor = (1.4, .52)), ax.set_theta_zero_location('R'))
ax.set_title('Spin Axis', fontdict = font_title, pad = 15);
```



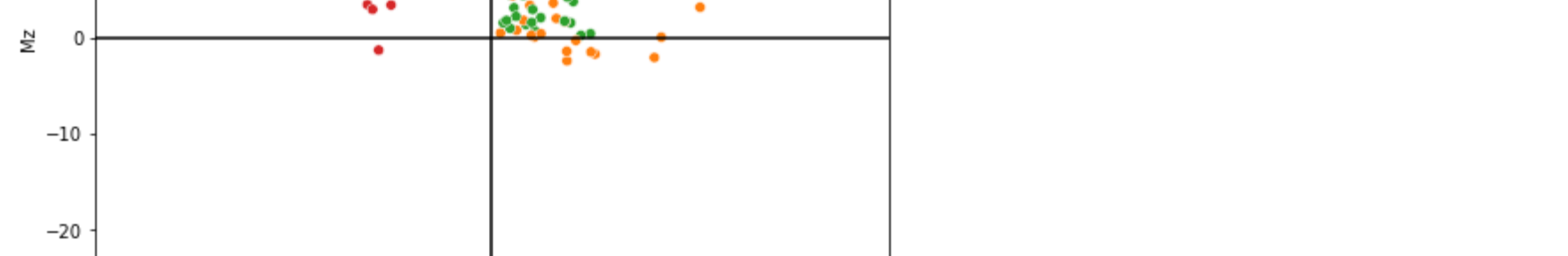
### Spin Efficiency

```
In [12]: sns.catplot(data = doolittle, x = 'spin_eff', y = 'pitch_type', kind = 'violin', hue = 'pitch_type',
                  fontdict = font_title, pad = 15);
```



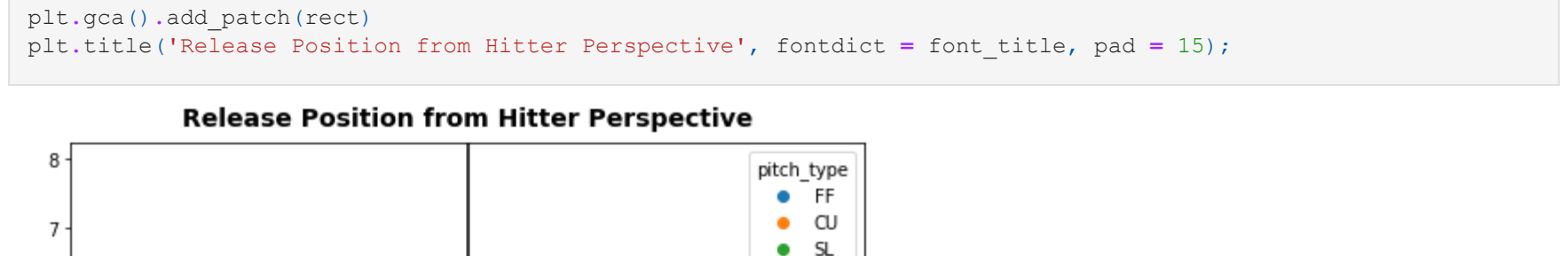
### Horizontal & Vertical Break Axis

```
In [13]: plt.figure(figsize = (8, 6))
sns.scatterplot(data = doolittle, x = 'pfx_x', y = 'pfx_z', hue = 'pitch_type',
                hue_order = order, palette = 'tab10')
plt.xlim(-30, 30), plt.ylim(-30, 30)
sns.axline(0, color = 'black', plt.axline(0, color = 'black')
plt.title('HB & VB Axis', fontdict = font_title, pad = 15);
```



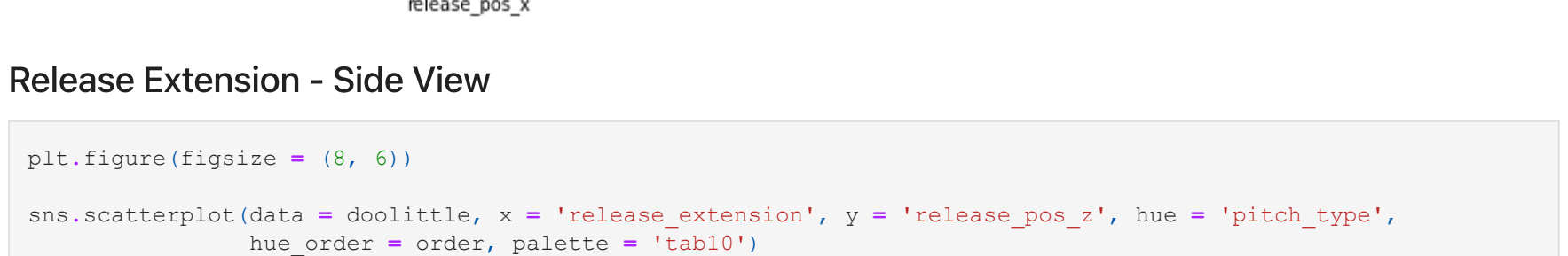
### Horizontal & Vertical Break Due to Magnus Force Axis

```
In [14]: plt.figure(figsize = (8, 6))
sns.scatterplot(data = doolittle, x = 'Mx', y = 'Mz', hue = 'pitch_type',
                hue_order = order, palette = 'tab10')
plt.xlim(-30, 30), plt.ylim(-30, 30)
sns.axline(0, color = 'black', plt.axline(0, color = 'black')
plt.title('HB & VB from Magnus Force Axis', fontdict = font_title, pad = 15);
```



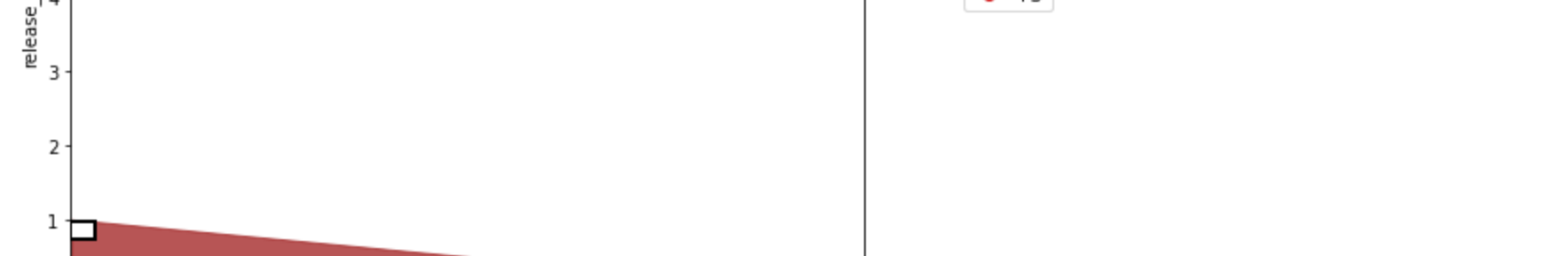
### Release Postion

```
In [15]: plt.figure(figsize = (8, 6))
sns.scatterplot(data = doolittle, x = 'release_pos_x', y = 'release_pos_y', hue = 'pitch_type',
                hue_order = order, palette = 'tab10')
plt.xlim(-5, 5), plt.ylim(0.25, 8.25)
plt.axline(0, color = 'black', plt.axline(0, color = 'black')
left, bottom, width, height = (-83, 1.59, 1.66, 1.82)
rect = mpatches.Rectangle((left, bottom), width, height,
                           fill = False, color = 'black', linewidth = 2)
plt.gca().add_patch(rect)
plt.title('Release Position from Hitter Perspective', fontdict = font_title, pad = 15);
```



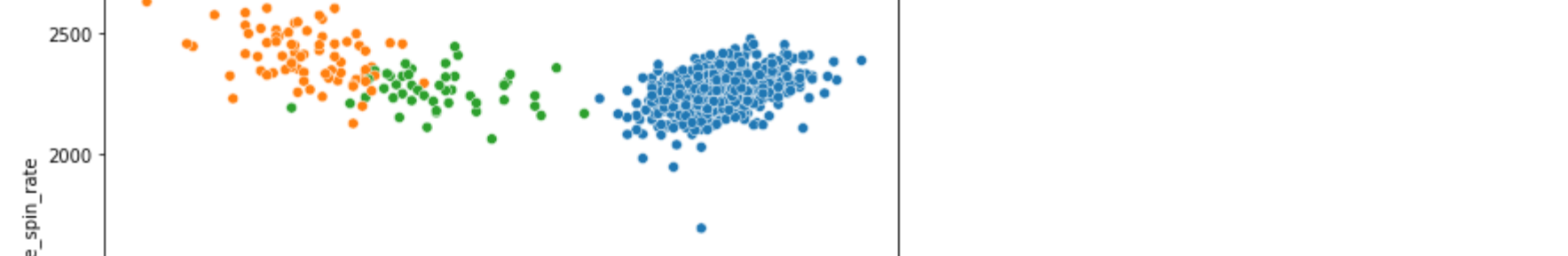
### Release Extension - Side View

```
In [16]: plt.figure(figsize = (8, 6))
sns.scatterplot(data = doolittle, x = 'release_extension', y = 'release_pos_z', hue = 'pitch_type',
                hue_order = order, palette = 'tab10')
plt.xlim(0, 7.75), plt.ylim(0, 7.75)
sns.axline(0, color = 'black', plt.axline(0, color = 'black')
plt.fill_between((1.75, 0), (0, 1), color = 'brown', alpha = .8)
plt.legend(bboxtoanchor = (1.25, .77))
plt.title('Release Extension - Side View', fontdict = font_title, pad = 15);
```



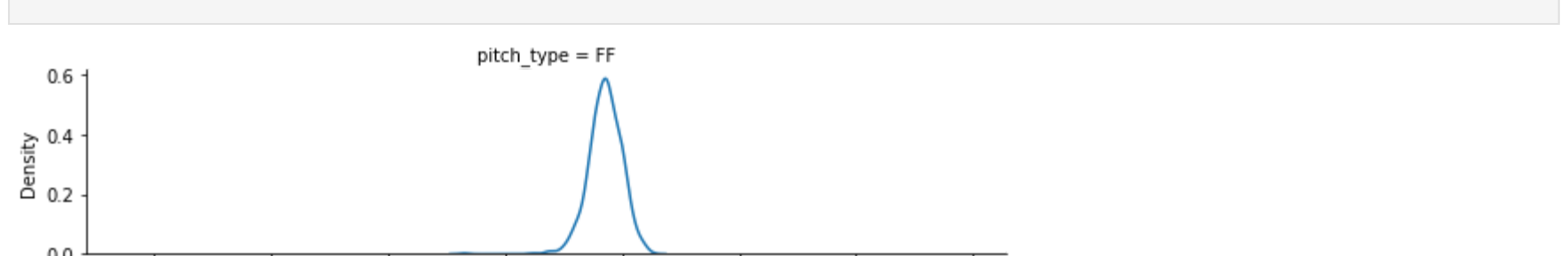
### Velocity & Spin Rate

```
In [17]: plt.figure(figsize = (8, 6))
sns.scatterplot(data = doolittle, x = 'release_speed', y = 'release_spin_rate', hue = 'pitch_type',
                hue_order = order, palette = 'tab10')
plt.title('Speed vs Spin Rate - By Pitch Type', fontdict = font_title, pad = 15);
```



### Bauer Units

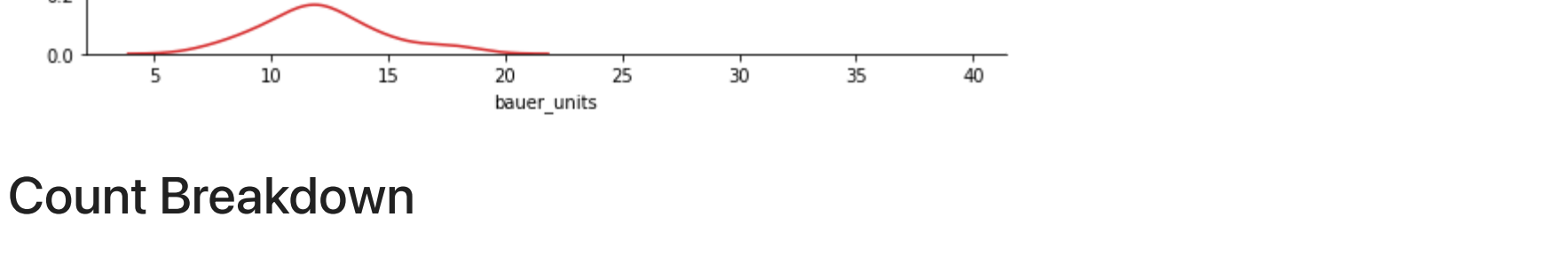
```
In [18]: g = sns.FacetGrid(doolittle, row = 'pitch_type', hue = 'pitch_type', height = 2, aspect = 4, hue_order = order)
g.map(sns.kdeplot, 'bauer_units', palette = 'tab10')
```



## Count Breakdown

### Pitch Usage by Count

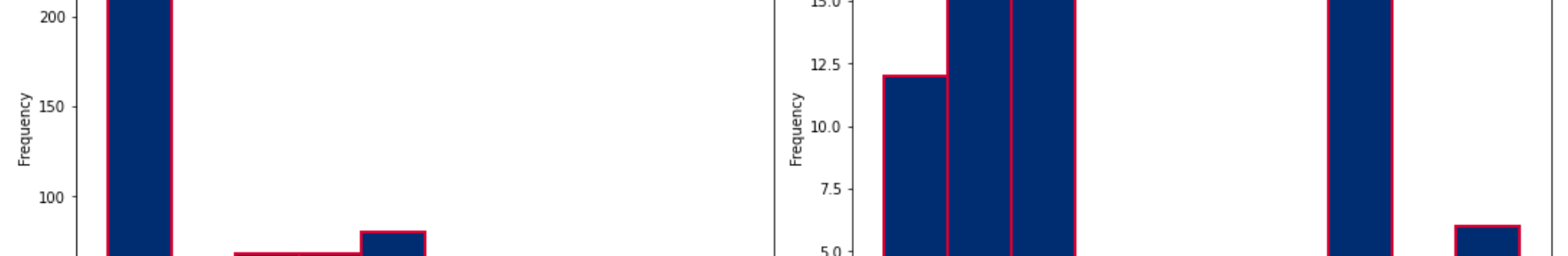
```
In [19]: fig, axs = plt.subplots(2, 2, figsize = (15, 12))
fig.suptitle('Pitch Usage by Count', fontsize = 16, fontweight = 'bold')
plt.setp(axs[0, :], xlabel = 'Count', plt.setp(axs[0, 0], ylabel = 'frequency')
axs[0][0].hist(ff['pitch_count']).sort_values(ascending = True, color = blue, edgecolor = red, linewidth = 2)
axs[0][1].hist(sl['pitch_count']).sort_values(ascending = True, color = blue, edgecolor = red, linewidth = 2)
axs[0][2].hist(cu['pitch_count']).sort_values(ascending = True, color = blue, edgecolor = red, linewidth = 2)
axs[0][3].hist(fs['pitch_count']).sort_values(ascending = True, color = blue, edgecolor = red, linewidth = 2)
axs[1][0].hist(ff['pitch_count']).sort_values(ascending = True, color = blue, edgecolor = red, linewidth = 2)
axs[1][1].hist(sl['pitch_count']).sort_values(ascending = True, color = blue, edgecolor = red, linewidth = 2)
axs[1][2].hist(cu['pitch_count']).sort_values(ascending = True, color = blue, edgecolor = red, linewidth = 2)
axs[1][3].hist(fs['pitch_count']).sort_values(ascending = True, color = blue, edgecolor = red, linewidth = 2)
plt.tight_layout()
```



## Heatmaps

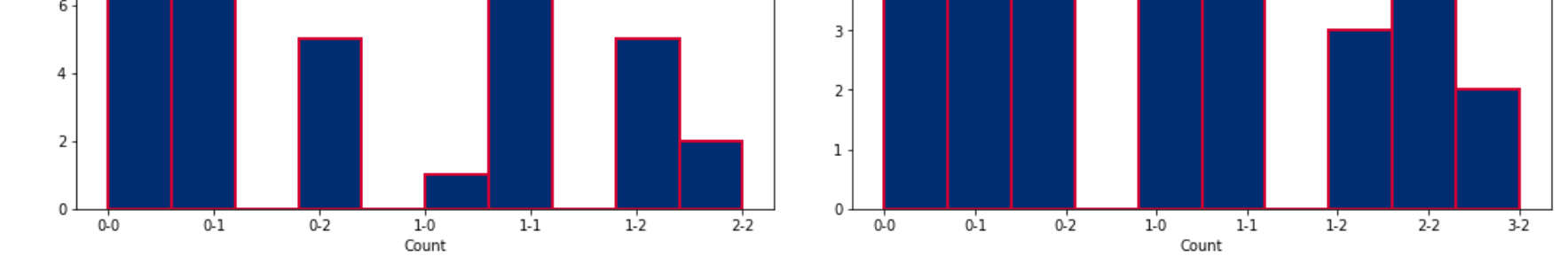
### Pitch Location by Pitch Type

```
In [20]: fig, axs = plt.subplots(2, 2, figsize = (15, 12), sharex = True, sharey = True)
fig.suptitle('Pitch Location by Pitch Type', fontsize = 16, fontweight = 'bold')
plt.axis(xmin = -3.5, xmax = 3.5, plt.axis(ymin = -1.5, ymax = 5.5)
sns.kdeplot(ax = axs[0][0], data = ff, plate_x, y = 'plate_z', fill = True, hue = 'is_strike', palette = 'coolwarm')
axs[0][0].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][1].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][2].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][3].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][0].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][1].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][2].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][3].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][4].set_title('Split-Finger Location vs All Hitters', fontsize = 14, pad = 15);
```

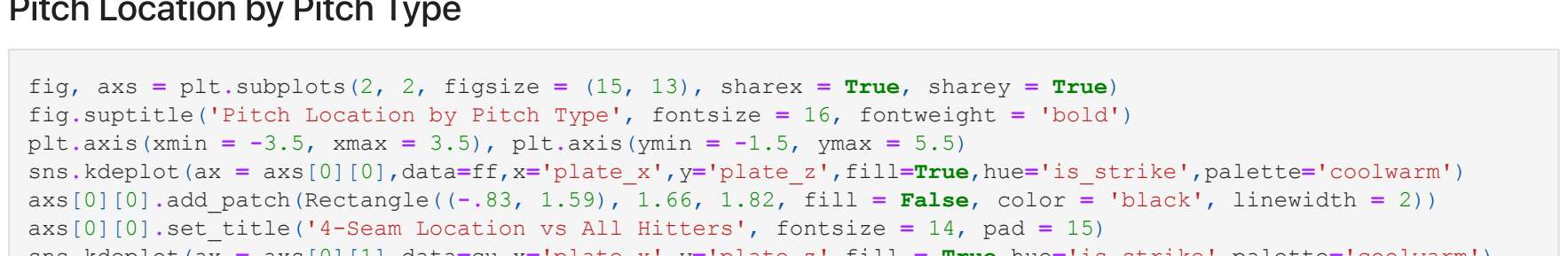


### Hard Hit Summary by Pitch Type

```
In [21]: fig, axs = plt.subplots(2, 2, figsize = (15, 12), sharex = True, sharey = True)
fig.suptitle('Hard Hit Summary by Pitch Type', fontsize = 16, fontweight = 'bold')
plt.axis(xmin = -3.5, xmax = 3.5, plt.axis(ymin = -1.5, ymax = 5.5)
sns.kdeplot(ax = axs[0][0], data = ff, plate_x, y = 'plate_z', fill = True, hue = 'hard_hit_summary', palette = 'coolwarm')
axs[0][0].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][1].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][2].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][3].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][0].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][1].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][2].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][3].add_patch(Rectangle((-83, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][4].set_title('Split-Finger Location vs All Hitters', fontsize = 14, pad = 15);
```



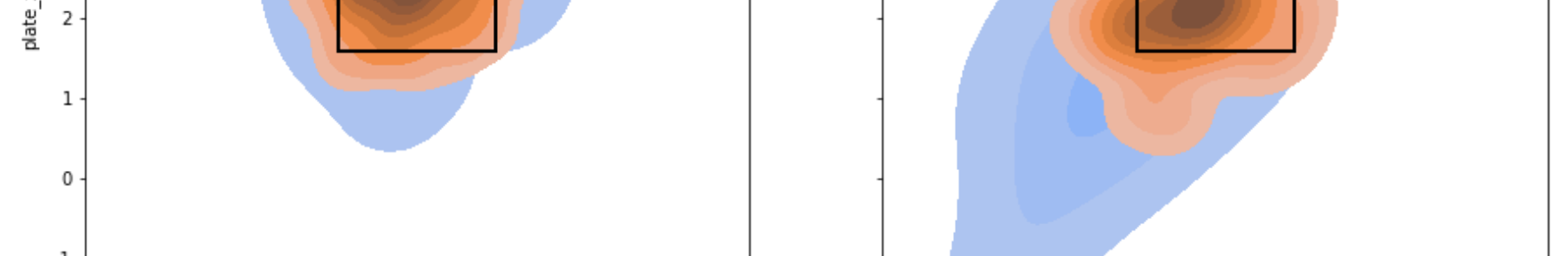
### 4-Seam Heatmaps



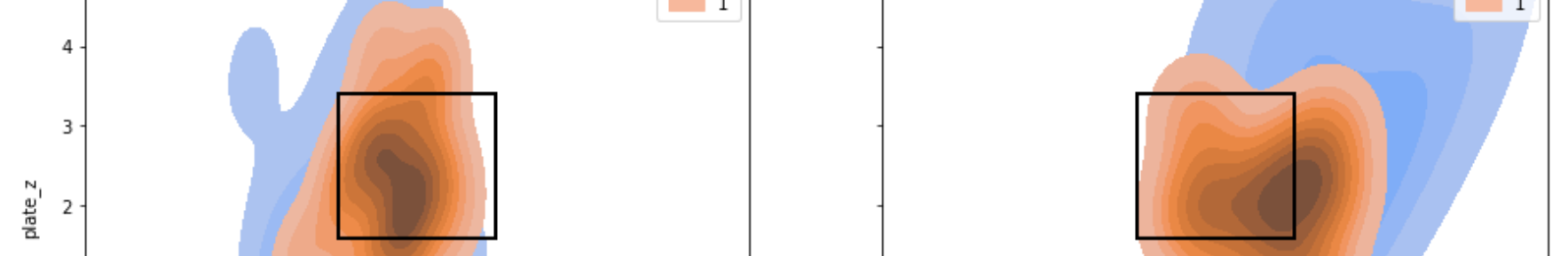
### Curveball Heatmaps



### Slider Heatmaps



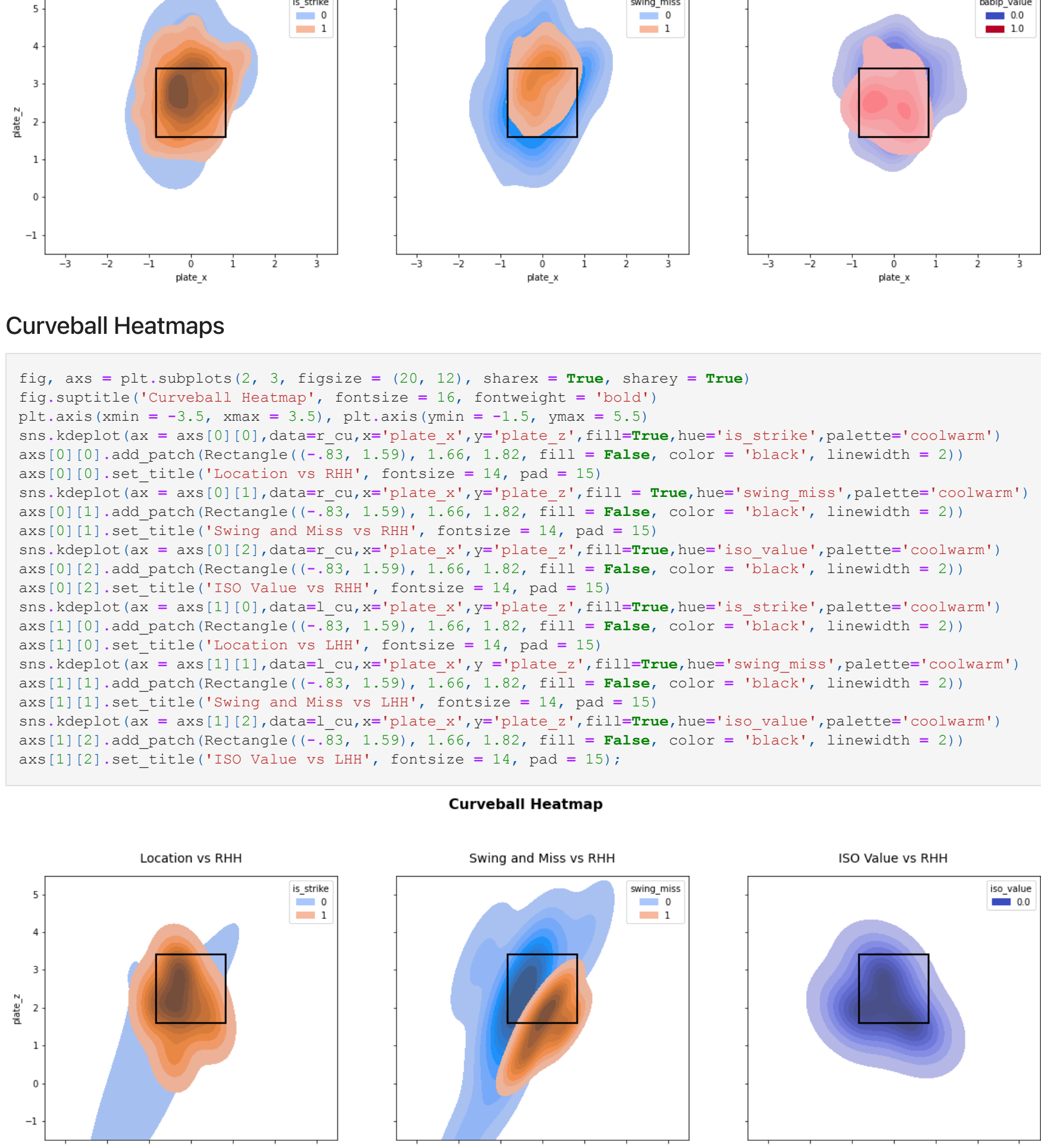
### Split-Finger Heatmaps





```
fig, axs = plt.subplots(2, 3, figsize = (20, 12), sharex = True, sharey = True)
fig.suptitle('4-Seam Heatmap', fontsize = 16, fontweight = 'bold')
plt.axis(xmin = -3.5, xmax = 3.5), plt.axis(ymin = -1.5, ymax = 5.5)
sns.kdeplot(ax = axs[0][0], data= df, x='plate_x', y='plate_z', fill=True, hue='is_strike', palette='coolwarm')
axs[0][0].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][0].set_title('Location vs RHH', fontsize = 14, pad = 15)
axs[0][1].set_title('Swing and Miss vs RHH', fontsize = 14, pad = 15)
axs[0][2].set_title('WOBA Value vs RHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[1][0], data= df, x='plate_x', y='plate_z', fill = True, hue='swing_miss', palette='coolwarm')
axs[1][0].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][1].set_title('Swing and Miss vs LHH', fontsize = 14, pad = 15)
axs[1][2].set_title('ISO Value vs RHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[0][1], data= df, x='plate_x', y='plate_z', fill=True, hue='iso_value', palette='coolwarm')
axs[0][1].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][2].set_title('ISO Value vs RHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[1][1], data= df, x='plate_x', y='plate_z', fill=True, hue='is_strike', palette='coolwarm')
axs[1][1].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][2].set_title('Swing and Miss vs LHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[0][2], data= df, x='plate_x', y='plate_z', fill=True, hue='habip_value', palette='coolwarm')
axs[0][2].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][2].set_title('BABIP Value vs LHH', fontsize = 14, pad = 15);
```

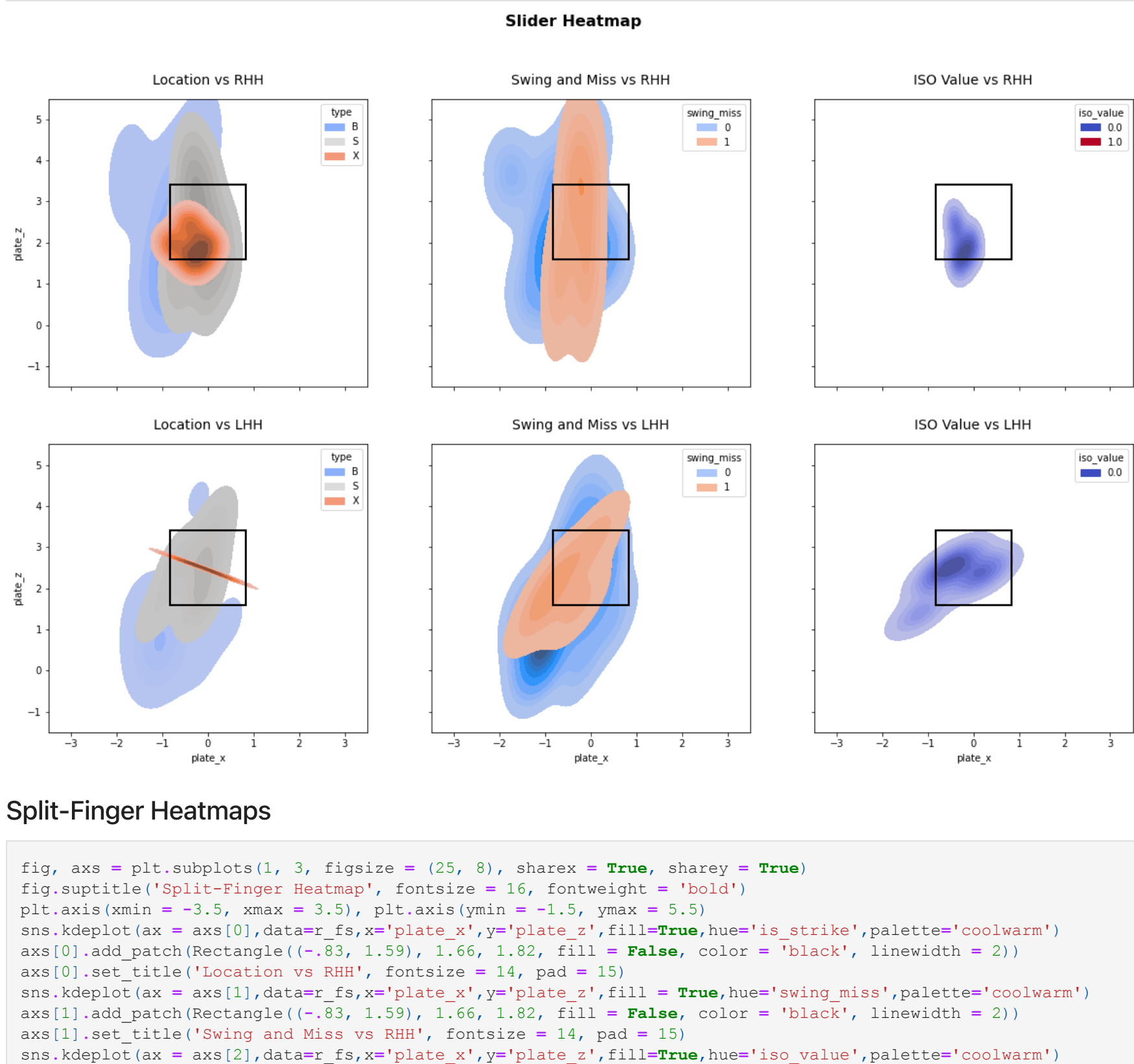
4-Seam Heatmap



Curveball Heatmaps

```
fig, axs = plt.subplots(2, 3, figsize = (20, 12), sharex = True, sharey = True)
fig.suptitle('Curveball Heatmap', fontsize = 16, fontweight = 'bold')
plt.axis(xmin = -3.5, xmax = 3.5), plt.axis(ymin = -1.5, ymax = 5.5)
sns.kdeplot(ax = axs[0][0], data= df, x='plate_x', y='plate_z', fill=True, hue='type', palette='coolwarm')
axs[0][0].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][0].set_title('Location vs RHH', fontsize = 14, pad = 15)
axs[0][1].set_title('Swing and Miss vs RHH', fontsize = 14, pad = 15)
axs[0][2].set_title('ISO Value vs RHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[1][0], data= df, x='plate_x', y='plate_z', fill=True, hue='type', palette='coolwarm')
axs[1][0].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][1].set_title('Swing and Miss vs LHH', fontsize = 14, pad = 15)
axs[1][2].set_title('ISO Value vs LHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[0][1], data= df, x='plate_x', y='plate_z', fill=True, hue='type', palette='coolwarm')
axs[0][1].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][2].set_title('ISO Value vs RHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[1][1], data= df, x='plate_x', y='plate_z', fill=True, hue='type', palette='coolwarm')
axs[1][1].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][2].set_title('ISO Value vs LHH', fontsize = 14, pad = 15);
```

Curveball Heatmap



Slider Heatmaps

```
fig, axs = plt.subplots(2, 3, figsize = (20, 12), sharex = True, sharey = True)
fig.suptitle('Slider Heatmap', fontsize = 16, fontweight = 'bold')
plt.axis(xmin = -3.5, xmax = 3.5), plt.axis(ymin = -1.5, ymax = 5.5)
sns.kdeplot(ax = axs[0][0], data= df, x='plate_x', y='plate_z', fill=True, hue='type', palette='coolwarm')
axs[0][0].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][0].set_title('Location vs RHH', fontsize = 14, pad = 15)
axs[0][1].set_title('Swing and Miss vs RHH', fontsize = 14, pad = 15)
axs[0][2].set_title('ISO Value vs RHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[1][0], data= df, x='plate_x', y='plate_z', fill=True, hue='type', palette='coolwarm')
axs[1][0].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][1].set_title('Swing and Miss vs LHH', fontsize = 14, pad = 15)
axs[1][2].set_title('ISO Value vs LHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[0][1], data= df, x='plate_x', y='plate_z', fill=True, hue='type', palette='coolwarm')
axs[0][1].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0][2].set_title('ISO Value vs RHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[1][1], data= df, x='plate_x', y='plate_z', fill=True, hue='type', palette='coolwarm')
axs[1][1].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1][2].set_title('ISO Value vs LHH', fontsize = 14, pad = 15);
```

Slider Heatmap



Split-Finger Heatmaps

```
fig, axs = plt.subplots(1, 3, figsize = (25, 8), sharex = True, sharey = True)
fig.suptitle('Split-Finger Heatmap', fontsize = 16, fontweight = 'bold')
plt.axis(xmin = -3.5, xmax = 3.5), plt.axis(ymin = -1.5, ymax = 5.5)
sns.kdeplot(ax = axs[0], data= df, x='plate_x', y='plate_z', fill=True, hue='is_strike', palette='coolwarm')
axs[0].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[0].set_title('Location vs RHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[1], data= df, x='plate_x', y='plate_z', fill = True, hue='swing_miss', palette='coolwarm')
axs[1].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[1].set_title('Swing and Miss vs RHH', fontsize = 14, pad = 15)
sns.kdeplot(ax = axs[2], data= df, x='plate_x', y='plate_z', fill=True, hue='iso_value', palette='coolwarm')
axs[2].add_patch(Rectangle((-3, 1.59), 1.66, 1.82, fill = False, color = 'black', linewidth = 2))
axs[2].set_title('ISO Value vs RHH', fontsize = 14, pad = 15);
```

