

# NFL Decision-Making Under Pressure - Risk vs Reward in Critical Game Situations

December 19, 2025

```
[1]: import pandas as pd
      import numpy as np

      import matplotlib.pyplot as plt
      import seaborn as sns

      pd.set_option("display.max_columns", 200)
      pd.set_option("display.width", 140)

      sns.set_style("whitegrid")
```

```
[2]: df = pd.read_csv("/Users/diyasansi/Desktop/NFL Play by Play 2009-2018 (v5).
      ↪csv", low_memory=False)
df.head()
```

```
[2]:   play_id      game_id home_team away_team posteam posteam_type defteam
side_of_field  yardline_100    game_date \
0            46  2009091000        PIT       TEN       PIT      home     TEN
TEN           30.0  2009-09-10
1            68  2009091000        PIT       TEN       PIT      home     TEN
PIT           58.0  2009-09-10
2            92  2009091000        PIT       TEN       PIT      home     TEN
PIT           53.0  2009-09-10
3           113  2009091000        PIT       TEN       PIT      home     TEN
PIT           56.0  2009-09-10
4           139  2009091000        PIT       TEN       PIT      home     TEN
PIT           56.0  2009-09-10

quarter_seconds_remaining half_seconds_remaining game_seconds_remaining
game_half quarter_end drive sp qtr down goal_to_go \
0                  900.0                      1800.0                     3600.0
Half1             0      1  0     1   NaN          0.0
1                  893.0                      1793.0                    3593.0
Half1             0      1  0     1   1.0          0.0
2                  856.0                      1756.0                    3556.0
Half1             0      1  0     1   2.0          0.0
```

3		815.0		1715.0		3515.0
Half1	0	1 0	1 3.0	0.0		
4		807.0		1707.0		3507.0
Half1	0	1 0	1 4.0	0.0		
time yrdln ydstogo ydsnet						
desc play_type yards_gained shotgun no_huddle \						
0	15:00	TEN 30	0	0	R.Bironas kicks 67 yards from TEN 30 to PIT	
3...	kickoff		0.0	0	0	
1	14:53	PIT 42	10	5	(14:53) B.Roethlisberger pass short left to	
H...	pass		5.0	0	0	
2	14:16	PIT 47	5	2	(14:16) W.Parker right end to PIT 44 for -3	
ya...	run		-3.0	0	0	
3	13:35	PIT 44	8	2	(13:35) (Shotgun) B.Roethlisberger pass	
incomp...	pass		0.0	1	0	
4	13:27	PIT 44	8	2	(13:27) (Punt formation) D.Sepulveda punts 54	
...	punt		0.0	0	0	
qb_dropback qb_kneel qb_spike qb_scramble pass_length pass_location						
air_yards yards_after_catch run_location run_gap \						
0	0.0	0	0	0	NaN	NaN
NaN		NaN	NaN	NaN		
1	1.0	0	0	0	short	left
-3.0		8.0	NaN	NaN		
2	0.0	0	0	0	NaN	NaN
NaN		NaN	right	end		
3	1.0	0	0	0	deep	right
34.0		NaN	NaN	NaN		
4	0.0	0	0	0	NaN	NaN
NaN		NaN	NaN	NaN		
field_goal_result kick_distance extra_point_result two_point_conv_result						
home_timeouts_remaining away_timeouts_remaining timeout \						
0	NaN	67.0		NaN		NaN
3		3 0.0				
1	NaN		NaN	NaN		NaN
3		3 0.0				
2	NaN		NaN	NaN		NaN
3		3 0.0				
3	NaN		NaN	NaN		NaN
3		3 0.0				
4	NaN	54.0		NaN		NaN
3		3 0.0				
timeout_team td_team posteam_timeouts_remaining defteam_timeouts_remaining						
total_home_score total_away_score posteam_score \						
0	NaN	NaN	3.0		3.0	

0		0	NaN		
1	NaN	NaN		3.0	3.0
0		0	0.0		
2	NaN	NaN		3.0	3.0
0		0	0.0		
3	NaN	NaN		3.0	3.0
0		0	0.0		
4	NaN	NaN		3.0	3.0
0		0	0.0		
	defteam_score	score_differential	postteam_score_post	defteam_score_post	
	score_differential_post	no_score_prob	opp_fg_prob	\	
0	NaN	NaN		0.0	0.0
0.0	0.001506	0.179749			
1	0.0	0.0		0.0	0.0
0.0	0.000969	0.108505			
2	0.0	0.0		0.0	0.0
0.0	0.001057	0.105106			
3	0.0	0.0		0.0	0.0
0.0	0.001434	0.149088			
4	0.0	0.0		0.0	0.0
0.0	0.001861	0.213480			
	opp_safety_prob	opp_td_prob	fg_prob	safety_prob	td_prob
	extra_point_prob	two_point_conversion_prob		ep	epa \
0	0.006639	0.281138	0.213700	0.003592	0.313676
0.0		0.0	0.323526	2.014474	
1	0.001061	0.169117	0.293700	0.003638	0.423011
0.0		0.0	2.338000	0.077907	
2	0.000981	0.162747	0.304805	0.003826	0.421478
0.0		0.0	2.415907	-1.402760	
3	0.001944	0.234801	0.289336	0.004776	0.318621
0.0		0.0	1.013147	-1.712583	
4	0.003279	0.322262	0.244603	0.006404	0.208111
0.0		0.0	-0.699436	2.097796	
	total_home_epa	total_away_epa	total_home_rush_epa	total_away_rush_epa	
	total_home_pass_epa	total_away_pass_epa	air_epa	yac_epa \	
0	2.014474	-2.014474		0.00000	0.00000
0.000000		0.000000	NaN	NaN	
1	2.092381	-2.092381		0.00000	0.00000
0.077907		-0.077907	-0.938735	1.016643	
2	0.689621	-0.689621		-1.40276	1.40276
0.077907		-0.077907	NaN	NaN	
3	-1.022962	1.022962		-1.40276	1.40276
-1.634676		1.634676	3.412572	-5.125156	
4	1.074834	-1.074834		-1.40276	1.40276

-1.634676	1.634676	NaN	NaN	
comp_air_epa comp_yac_epa total_home_comp_air_epa total_away_comp_air_epa				
total_home_comp_yac_epa	total_away_comp_yac_epa \			
0 0.000000	0.000000	0.000000	0.000000	0.000000
0.000000	0.000000			
1 -0.938735	1.016643	-0.938735	0.938735	
1.016643	-1.016643			
2 0.000000	0.000000	-0.938735	0.938735	
1.016643	-1.016643			
3 0.000000	0.000000	-0.938735	0.938735	
1.016643	-1.016643			
4 0.000000	0.000000	-0.938735	0.938735	
1.016643	-1.016643			
total_home_raw_air_epa total_away_raw_air_epa total_home_raw_yac_epa				
total_away_raw_yac_epa wp def_wp home_wp away_wp \				
0 0.000000	0.000000	0.000000	0.000000	0.000000
0.000000 NaN NaN NaN NaN				
1 -0.938735	0.938735	0.938735	1.016643	
-1.016643 0.546433	0.453567	0.546433	0.453567	
2 -0.938735	0.938735	0.938735	1.016643	
-1.016643 0.551088	0.448912	0.551088	0.448912	
3 2.473837	-2.473837	-2.473837	-4.108513	
4.108513 0.510793	0.489207	0.510793	0.489207	
4 2.473837	-2.473837	-2.473837	-4.108513	
4.108513 0.461217	0.538783	0.461217	0.538783	
wpa home_wp_post away_wp_post total_home_rush_wpa				
total_away_rush_wpa total_home_pass_wpa total_away_pass_wpa air_wpa \				
0 NaN NaN NaN 0.000000				
0.000000 0.000000 0.000000 NaN				
1 0.004655 0.551088 0.448912 0.000000				
0.000000 0.004655 -0.004655 -0.028383				
2 -0.040295 0.510793 0.489207 -0.040295				
0.040295 0.004655 -0.004655 NaN				
3 -0.049576 0.461217 0.538783 -0.040295				
0.040295 -0.044921 0.044921 0.109925				
4 0.097712 0.558929 0.441071 -0.040295				
0.040295 -0.044921 0.044921 NaN				
yac_wpa ... assist_tackle lateral_reception lateral_rush lateral_return				
lateral_recovery passer_player_id passer_player_name \				
0 NaN ... 0.0 0.0 0.0 0.0				
0.0 NaN ... NaN NaN 0.0 0.0				
1 0.033038 ... 0.0 0.0 0.0 0.0				
0.0 00-0022924 B.Roethlisberger				

2	NaN	...	0.0	0.0	0.0	0.0
0.0		NaN		NaN		
3	-0.159501	...	0.0	0.0	0.0	0.0
0.0		00-0022924	B.Roethlisberger			
4	NaN	...	0.0	0.0	0.0	0.0
0.0		NaN		NaN		
			receiver_player_id receiver_player_name rusher_player_id			
			rusher_player_name lateral_receiver_player_id \			
0		NaN		NaN		NaN
NaN			NaN			
1		00-0017162		H.Ward		NaN
NaN			NaN			
2		NaN		NaN		00-0022250
W.Parker			NaN			
3		00-0026901		M.Wallace		NaN
NaN			NaN			
4		NaN		NaN		NaN
NaN			NaN			
			lateral_receiver_player_name lateral_rusher_player_id			
			lateral_rusher_player_name lateral_sack_player_id lateral_sack_player_name \			
0			NaN		NaN	
NaN			NaN			
1			NaN		NaN	
NaN			NaN			
2			NaN		NaN	
NaN			NaN			
3			NaN		NaN	
NaN			NaN			
4			NaN		NaN	
NaN			NaN			
			interception_player_id interception_player_name			
			lateral_interception_player_id lateral_interception_player_name \			
0		NaN		NaN		
NaN			NaN			
1		NaN		NaN		
NaN			NaN			
2		NaN			NaN	
NaN						
3		NaN			NaN	
NaN						
4		NaN			NaN	
NaN						
			punt_returner_player_id punt_returner_player_name			

	lateral_punt_returner_player_id	lateral_punt_returner_player_name	\	
0	NaN	NaN		
NaN		NaN		
1	NaN		NaN	
NaN		NaN		
2	NaN		NaN	
NaN		NaN		
3	NaN		NaN	
NaN		NaN		
4	NaN		NaN	
NaN		NaN		
	kickoff_returner_player_name	kickoff_returner_player_id		
	lateral_kickoff_returner_player_id	lateral_kickoff_returner_player_name	\	
0	S.Logan	00-0026491		
NaN		NaN		
1	NaN		NaN	
NaN		NaN		
2	NaN		NaN	
NaN		NaN		
3	NaN		NaN	
NaN		NaN		
4	NaN		NaN	
NaN		NaN		
	punter_player_id	punter_player_name	kicker_player_name	kicker_player_id
	own_kickoff_recovery_player_id	\		
0	NaN	NaN	R.Bironas	00-0020962
NaN				
1	NaN	NaN	NaN	NaN
NaN				
2	NaN	NaN	NaN	NaN
NaN				
3	NaN	NaN	NaN	NaN
NaN				
4	00-0025499	D.Sepulveda	NaN	NaN
NaN				
	own_kickoff_recovery_player_name	blocked_player_id	blocked_player_name	
	tackle_for_loss_1_player_id	tackle_for_loss_1_player_name	\	
0	NaN	NaN		NaN
NaN		NaN		
1	NaN		NaN	NaN
NaN		NaN		
2	NaN		NaN	NaN
00-0024331	S.Tulloch			
3	NaN	NaN		NaN

NaN		NaN	
4		NaN	
NaN		NaN	
	tackle_for_loss_2_player_id	tackle_for_loss_2_player_name	
	qb_hit_1_player_id	qb_hit_1_player_name	qb_hit_2_player_id \
0		NaN	NaN
NaN		NaN	
1		NaN	
NaN		NaN	
2		NaN	
NaN		NaN	
3		NaN	
NaN		NaN	
4		NaN	
NaN		NaN	
	qb_hit_2_player_name	forced_fumble_player_1_team	
	forced_fumble_player_1_player_id	forced_fumble_player_1_player_name \	
0	NaN		NaN
NaN		NaN	
1	NaN		NaN
NaN		NaN	
2	NaN		NaN
NaN		NaN	
3	NaN		NaN
NaN		NaN	
4	NaN		NaN
NaN		NaN	
	forced_fumble_player_2_team	forced_fumble_player_2_player_id	
	forced_fumble_player_2_player_name	solo_tackle_1_team \	
0		NaN	NaN
NaN	TEN		
1		NaN	
NaN	TEN		
2		NaN	
NaN	TEN		
3		NaN	
NaN	NaN		NaN
4		NaN	
NaN	NaN		
	solo_tackle_2_team	solo_tackle_1_player_id	solo_tackle_2_player_id
	solo_tackle_1_player_name	solo_tackle_2_player_name \	
0	NaN	00-0025406	
M.Griffin		NaN	

1	NaN	00-0021219	NaN
C.Hope	NaN	NaN	
2	NaN	00-0024331	NaN
S.Tulloch	NaN	NaN	
3	NaN	NaN	NaN
NaN	NaN	NaN	
4	NaN	NaN	NaN
NaN	NaN	NaN	
	assist_tackle_1_player_id	assist_tackle_1_player_name	assist_tackle_1_team
	assist_tackle_2_player_id	assist_tackle_2_player_name	\
0	NaN	NaN	NaN
NaN	NaN	NaN	
1	NaN	NaN	NaN
NaN	NaN	NaN	
2	NaN	NaN	NaN
NaN	NaN	NaN	
3	NaN	NaN	NaN
NaN	NaN	NaN	
4	NaN	NaN	NaN
NaN	NaN	NaN	
	assist_tackle_2_team	assist_tackle_3_player_id	assist_tackle_3_player_name
	assist_tackle_3_team	assist_tackle_4_player_id	\
0	NaN	NaN	NaN
NaN	NaN	NaN	
1	NaN	NaN	NaN
NaN	NaN	NaN	
2	NaN	NaN	NaN
NaN	NaN	NaN	
3	NaN	NaN	NaN
NaN	NaN	NaN	
4	NaN	NaN	NaN
NaN	NaN	NaN	
	assist_tackle_4_player_name	assist_tackle_4_team	pass_defense_1_player_id
	pass_defense_1_player_name	pass_defense_2_player_id	\
0	NaN	NaN	NaN
NaN	NaN	NaN	
1	NaN	NaN	NaN
NaN	NaN	NaN	
2	NaN	NaN	NaN
NaN	NaN	NaN	
3	NaN	NaN	NaN
NaN	NaN	NaN	
4	NaN	NaN	NaN
NaN	NaN	NaN	

	pass_defense_2_player_name	fumbled_1_team	fumbled_1_player_id	
0		NaN	NaN	NaN
NaN		NaN	NaN	
1		NaN	NaN	NaN
NaN		NaN	NaN	
2		NaN	NaN	NaN
NaN		NaN	NaN	
3		NaN	NaN	NaN
NaN		NaN	NaN	
4		NaN	NaN	NaN
NaN		NaN	NaN	

	fumbled_2_team	fumble_recovery_1_team	fumble_recovery_1_yards	
0		NaN	NaN	NaN
NaN			NaN	
1		NaN	NaN	NaN
NaN			NaN	
2		NaN	NaN	NaN
NaN			NaN	
3		NaN	NaN	NaN
NaN			NaN	
4		NaN	NaN	NaN
NaN			NaN	

	fumble_recovery_2_team	fumble_recovery_2_yards	fumble_recovery_2_player_id	
0		NaN	NaN	NaN
NaN	PIT	39.0		NaN
1		NaN	NaN	NaN
NaN		0.0		NaN
2		NaN	NaN	NaN
NaN		0.0		NaN
3		NaN	NaN	NaN
NaN		0.0		NaN
4		NaN	NaN	NaN
NaN		0.0		NaN

	penalty_team	penalty_player_id	penalty_player_name	penalty_yards	
0		NaN	NaN	NaN	NaN
0			NaN	NaN	
1		NaN	NaN	NaN	NaN
0			NaN	NaN	
2		NaN	NaN	NaN	NaN

```
0           NaN      NaN
3           NaN      NaN      NaN      NaN
0           NaN      NaN      NaN
4           NaN      NaN      NaN      NaN
0           NaN      NaN      NaN

  defensive_two_point_attempt  defensive_two_point_conv
defensive_extra_point_attempt  defensive_extra_point_conv
0                      0.0          0.0
0.0                     0.0
1                      0.0          0.0
0.0                     0.0
2                      0.0          0.0
0.0                     0.0
3                      0.0          0.0
0.0                     0.0
4                      0.0          0.0
0.0                     0.0

[5 rows x 255 columns]
```

```
[3]: df.shape
```

```
[3]: (449371, 255)
```

```
[4]: df.columns
```

```
[4]: Index(['play_id', 'game_id', 'home_team', 'away_team', 'posteam',
       'postteam_type', 'defteam', 'side_of_field', 'yardline_100', 'game_date',
       ...
       'penalty_player_id', 'penalty_player_name', 'penalty_yards',
       'replay_or_challenge', 'replay_or_challenge_result', 'penalty_type',
       'defensive_two_point_attempt', 'defensive_two_point_conv',
       'defensive_extra_point_attempt', 'defensive_extra_point_conv'],
       dtype='object', length=255)
```

```
[6]: wanted = [
    # identity
    "play_id", "game_id", "home_team", "away_team",
    "posteam", "defteam",

    # time / season
    "season", "week", "qtr",
    "game_seconds_remaining", "quarter_seconds_remaining", "time",

    # situation
    "down", "ydstogo", "yardline_100",
```

```

# play decision
"play_type", "shotgun", "no_huddle",
"pass_attempt", "rush_attempt",

# outcomes
"yards_gained", "first_down", "touchdown",
"interception", "fumble_lost",

# risk / value metrics
"epa", "wpa", "wp",

# score
"score_differential", "score_differential_post"
]

existing = [c for c in wanted if c in df.columns]
missing = [c for c in wanted if c not in df.columns]

print("Keeping:", len(existing), "columns")
print("Missing:", len(missing), "columns")

df_small = df[existing].copy()
df_small.head()

```

Keeping: 27 columns

Missing: 3 columns

```
[6]:    play_id      game_id home_team away_team postteam defteam qtr
game_seconds_remaining quarter_seconds_remaining time down ydstogo \
0          46  2009091000             PIT          TEN     PIT     TEN    1
3600.0                  900.0   15:00    NaN          0
1          68  2009091000             PIT          TEN     PIT     TEN    1
3593.0                  893.0  14:53    1.0          10
2          92  2009091000             PIT          TEN     PIT     TEN    1
3556.0                  856.0  14:16    2.0           5
3         113  2009091000             PIT          TEN     PIT     TEN    1
3515.0                  815.0  13:35    3.0           8
4         139  2009091000             PIT          TEN     PIT     TEN    1
3507.0                  807.0  13:27    4.0           8

    yardline_100 play_type shotgun no_huddle pass_attempt rush_attempt
yards_gained  touchdown interception fumble_lost          epa \
0            30.0    kickoff        0        0       0.0       0.0
0.0            0.0          0.0        0       0.0  2.014474
1            58.0      pass        0        0       1.0       0.0
5.0            0.0          0.0        0       0.0  0.077907
```

2	53.0	run	0	0	0.0	1.0
-3.0	0.0		0.0	0.0	-1.402760	
3	56.0	pass	1	0	1.0	0.0
0.0	0.0		0.0	0.0	-1.712583	
4	56.0	punt	0	0	0.0	0.0
0.0	0.0		0.0	0.0	2.097796	
	wpa	wp	score_differential	score_differential_post		
0	NaN	NaN		NaN	0.0	
1	0.004655	0.546433		0.0	0.0	
2	-0.040295	0.551088		0.0	0.0	
3	-0.049576	0.510793		0.0	0.0	
4	0.097712	0.461217		0.0	0.0	

This output confirms that the dataset has been successfully reduced from its original 255 columns to a focused subset of 27 columns that are directly relevant to analyzing game situations, decision-making, and outcomes. The retained columns capture essential context such as game state (quarter, time remaining, score differential), situational variables (down, yards to go, field position), decision indicators (play type, pass vs run), and outcome metrics (yards gained, EPA, WPA, turnovers, and win probability). A small number of columns were missing, but none are critical to the core analysis, indicating that the dataset still contains all necessary information to support risk and outcome evaluation. The previewed rows show play-level data where each row represents a single NFL play, validating that the data structure is suitable for event-by-event analysis of how decisions influence game outcomes under varying levels of pressure.

```
[7]: # Keep only run/pass plays and drop rows without team in possession
df_small = df_small[df_small["postteam"].notna()].copy()

if "play_type" in df_small.columns:
    df_small = df_small[df_small["play_type"].isin(["run", "pass"])].copy()

df_small.shape
```

```
[7]: (319369, 27)
```

```
[8]: # choosing the best available time-remaining column
time_col = "game_seconds_remaining" if "game_seconds_remaining" in df_small.
    ↴columns else \
        "quarter_seconds_remaining" if "quarter_seconds_remaining" in
            ↴df_small.columns else None

# late game: 4th quarter
df_small["late_game"] = df_small["qtr"].ge(4)

# close game: within 7 points (use whichever score differential is available)
score_col = "score_differential" if "score_differential" in df_small.columns
    ↴else \
```

```

        "score_differential_post" if "score_differential_post" in df_small.
columns else None

if score_col:
    df_small["close_game"] = df_small[score_col].abs().le(7)
else:
    df_small["close_game"] = False # fallback

df_small["high_pressure"] = df_small["late_game"] & df_small["close_game"]

# red zone + 3rd & long
df_small["red_zone"] = df_small["yardline_100"].le(20)
df_small["third_and_long"] = (df_small["down"].eq(3) & df_small["ydstogo"].
                             ge(7))

df_small[["late_game", "close_game", "high_pressure", "red_zone", "third_and_long"]].mean()

```

```
[8]: late_game      0.273968
close_game       0.626332
high_pressure    0.126111
red_zone         0.140706
third_and_long   0.101998
dtype: float64
```

This summary shows the proportion of plays that occur under different game situations and pressure conditions. Approximately 27% of all plays take place in the fourth quarter, while nearly 63% occur in games where the score differential is within one touchdown, indicating that a large portion of plays are relatively competitive. However, only about 13% of plays meet the criteria for high-pressure situations, defined as late-game plays in close contests, highlighting that truly critical moments are relatively rare. Red-zone plays account for roughly 14% of the data, and third-and-long situations represent about 10%, both of which are traditionally high-leverage scenarios. Together, these proportions demonstrate that while most plays happen in lower-pressure contexts, a meaningful subset occurs in situations where risk and decision-making have a disproportionate impact on game outcomes, making them a natural focus for deeper analysis.

```
[9]: df_small[['epa', 'wpa', 'wp']].describe().T if all(c in df_small.columns for c in
                                         ['epa', 'wpa', 'wp']) else df_small.describe(include='all').T.head(20)
```

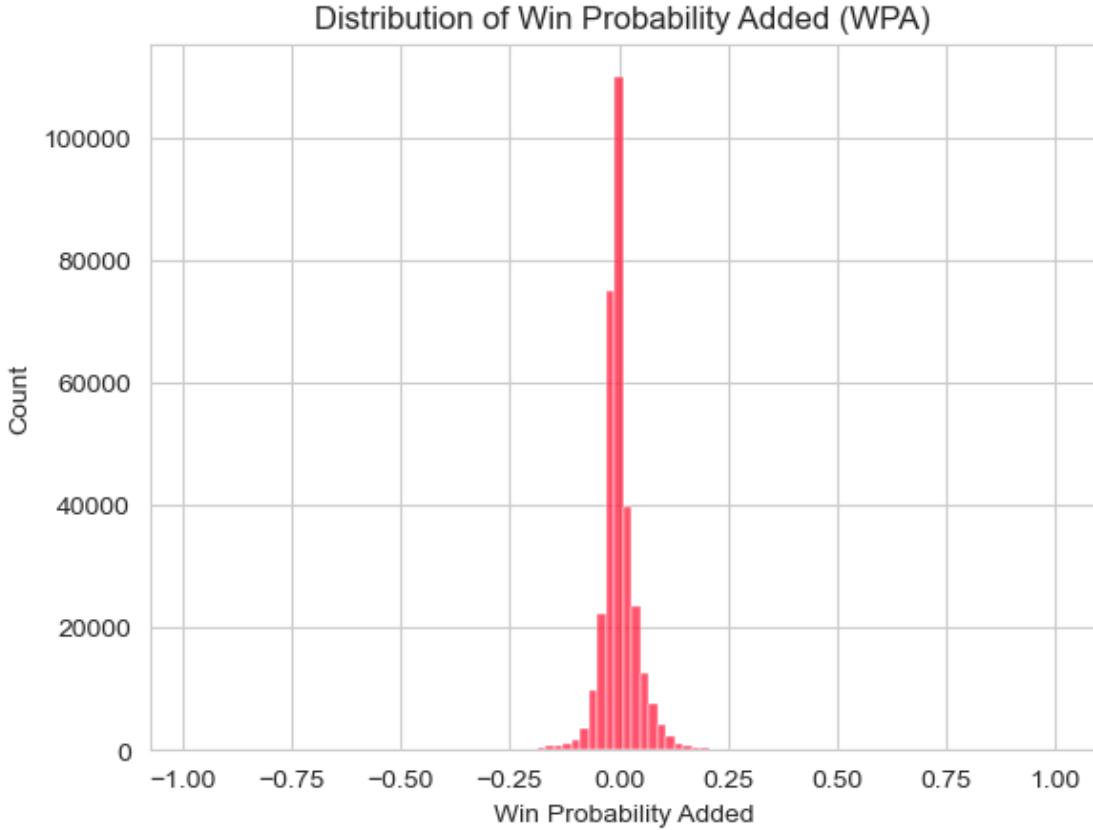
	count	mean	std	min	25%	50%	75%
max							
epa	318518.0	-0.001258	1.424975	-1.284959e+01	-0.683947	-0.218843	0.697286
wpa	318224.0	0.000871	0.045237	-9.750487e-01	-0.017587	-0.002464	0.015099
wp	319367.0	0.502457	0.285936	2.220446e-16	0.280221	0.511856	0.724366
	1.000000						

The descriptive statistics for expected points added (EPA), win probability added (WPA), and win probability (WP) provide insight into the overall distribution of value and risk across individual NFL plays. On average, both EPA and WPA are close to zero, indicating that most plays have a relatively small impact on expected scoring and game outcomes. However, the wide ranges and large standard deviations reveal substantial variability, with some plays resulting in significant negative or positive swings. EPA values range from large losses to high-gain plays, while WPA spans nearly the full range from close to  $-1$  to  $+1$ , reflecting rare but extremely high-impact moments that can dramatically alter a game's trajectory. The win probability distribution centers around 0.5, suggesting that many plays occur in relatively balanced game states, while the full 0 to 1 range confirms the presence of both dominant and desperate situations. Overall, these distributions highlight the inherently volatile nature of NFL games, where most plays are low-impact but a small number carry outsized risk and reward.

```
[12]: # Successful play: positive expected points
df_small["successful_play"] = df_small["epa"] > 0

# Turnover indicator
df_small["turnover"] = (
    (df_small["interception"] == 1) |
    (df_small["fumble_lost"] == 1)
).astype(int)
```

```
[33]: sns.histplot(df_small["wpa"].dropna(), bins=100, color ='#ff193c')
plt.title("Distribution of Win Probability Added (WPA)")
plt.xlabel("Win Probability Added")
plt.show()
```



This histogram illustrates the distribution of Win Probability Added (WPA) across all plays in the dataset. The distribution is highly concentrated around zero, indicating that the vast majority of plays result in only marginal changes to a team's chances of winning. This reflects the incremental nature of football, where most plays slightly nudge the game state rather than dramatically altering it. However, the presence of long tails on both the positive and negative sides shows that a small subset of plays produces substantial swings in win probability. These rare but impactful moments—such as turnovers, explosive plays, or late-game scoring events—are responsible for a disproportionate share of game outcomes. Overall, the distribution highlights the asymmetry of risk in NFL decision-making: while most choices carry limited immediate consequences, a few critical decisions can significantly shape the final result.

```
[14]: pressure_df = df_small[df_small["high_pressure"]]

decision_summary = (
    pressure_df
    .groupby("play_type")
    .agg(
        avg_epa=("epa", "mean"),
        success_rate=("successful_play", "mean"),
        turnover_rate=("turnover", "mean"),
        ...))
```

```

        avg_wpa=("wpa", "mean"),
        plays=("epa", "count")
    )
    .sort_values("avg_epa", ascending=False)
)

decision_summary

```

[14]:

	avg_epa	success_rate	turnover_rate	avg_wpa	plays
play_type					
pass	0.038539	0.427755	0.036779	0.002768	23725
run	-0.081337	0.351519	0.006873	0.001355	16244

This comparison highlights clear differences in risk and reward between passing and running plays. Passing plays generate a positive average EPA and higher win probability added, indicating greater potential upside and overall effectiveness when successful. They also exhibit a higher success rate than runs, suggesting that passing is generally more efficient at advancing the offense. However, this increased reward comes with significantly higher risk, as the turnover rate for passing plays is more than five times that of running plays. In contrast, running plays show a negative average EPA and lower success rate, reflecting their more conservative nature, but they carry substantially lower turnover risk. This trade-off underscores a central theme of NFL strategy: passing offers higher expected returns at the cost of increased volatility, while running provides stability and ball security with limited upside.

[28]:

```

import matplotlib.lines as mlines

plt.figure(figsize=(8, 6))

ax = sns.scatterplot(
    data=decision_summary.reset_index(),
    x="turnover_rate",
    y="avg_epa",
    hue="play_type",
    size="plays",
    sizes=(200, 800),
    palette={
        "pass": "#ffd0d7", # light pink
        "run": "#ff6a80" # darker pink
    },
    edgecolor="black",
    legend=False # turn off seaborn legend entirely
)

# Axis padding
plt.xlim(
    decision_summary["turnover_rate"].min() - 0.005,
    decision_summary["turnover_rate"].max() + 0.01
)

```

```

plt.ylim(
    decision_summary["avg_epa"].min() - 0.01,
    decision_summary["avg_epa"].max() + 0.01
)

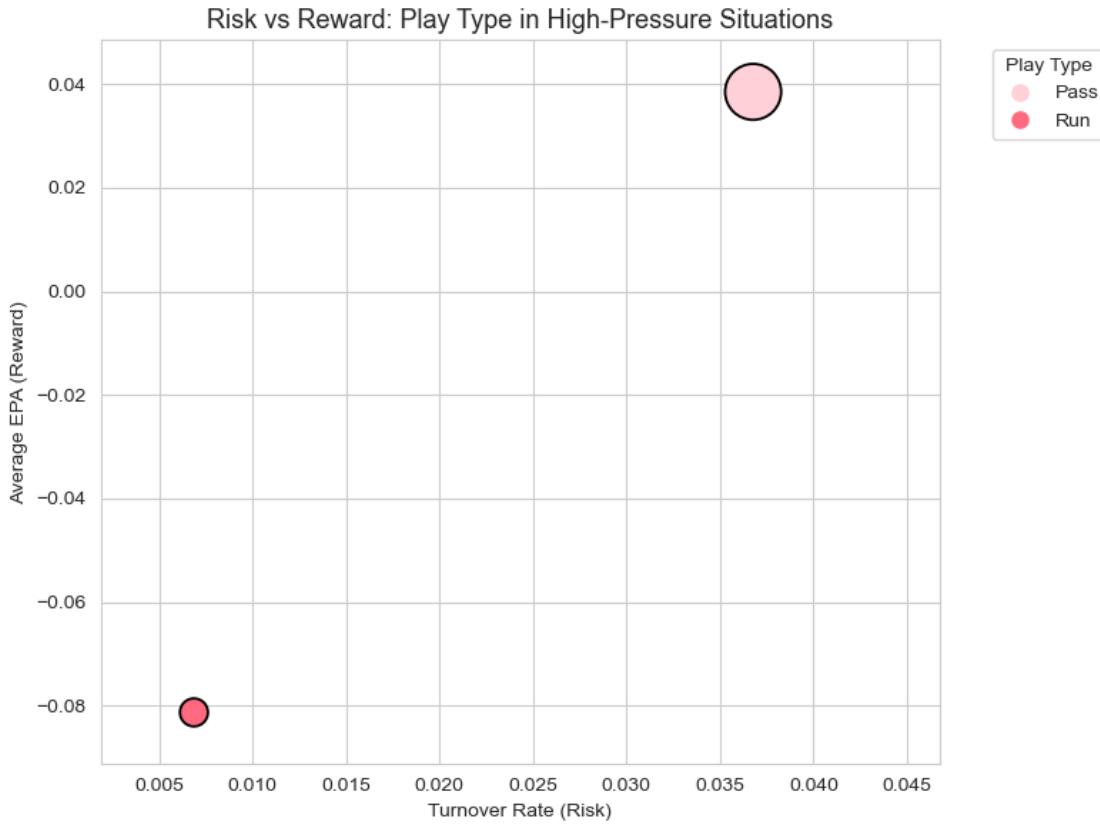
plt.title("Risk vs Reward: Play Type in High-Pressure Situations", fontsize=13)
plt.xlabel("Turnover Rate (Risk)")
plt.ylabel("Average EPA (Reward)")

pass_legend = mlines.Line2D(
    [], [], color="#ffd0d7", marker="o", linestyle="None",
    markersize=8, label="Pass"
)
run_legend = mlines.Line2D(
    [], [], color="#ff6a80", marker="o", linestyle="None",
    markersize=8, label="Run"
)

plt.legend(
    handles=[pass_legend, run_legend],
    title="Play Type",
    bbox_to_anchor=(1.05, 1),
    loc="upper left"
)

plt.tight_layout()
plt.show()

```



This chart compares the risk and reward of passing versus running plays in high-pressure situations in NFL games. The x-axis represents turnover risk, while the y-axis shows average expected points added (EPA), a measure of how much a play improves a team's scoring chances. Passing plays appear in the upper-right area of the chart, indicating that they generate higher average EPA but also come with a greater risk of turnovers. In contrast, running plays are positioned in the lower-left, showing lower turnover risk but negative average EPA, meaning they tend to reduce expected scoring outcomes in these situations. The size of each bubble reflects how frequently the play type is used, highlighting that teams still rely heavily on passing despite the increased risk, likely because of its higher potential reward.

```
[19]: situation_summary = (
    df_small
    .groupby(["high_pressure", "play_type"])
    .agg(
        avg_epa=("epa", "mean"),
        success_rate=("successful_play", "mean"),
        turnover_rate=("turnover", "mean"),
        avg_wpa=("wpa", "mean"),
        plays=("epa", "count")
    )
    .reset_index()
```

```
)  
situation_summary
```

```
[19]: high_pressure play_type avg_epa success_rate turnover_rate avg_wpa
plays
0 False pass 0.036004 0.443262 0.030910 0.001701
162396
1 False run -0.050285 0.378721 0.008093 -0.000746
116153
2 True pass 0.038539 0.427755 0.036779 0.002768
23725
3 True run -0.081337 0.351519 0.006873 0.001355
16244
```

This table compares the performance of passing and running plays across normal and high-pressure situations, revealing how context influences both risk and effectiveness. In non-high-pressure scenarios, passing plays already outperform runs, with higher average EPA and success rates, albeit with greater turnover risk. Under high-pressure conditions, this pattern becomes even more pronounced. Passing plays continue to generate positive average EPA and higher win probability added, while running plays become less effective, showing more negative EPA and lower success rates. At the same time, the turnover risk associated with passing increases further in high-pressure moments, whereas running remains comparatively safer. These results suggest that pressure amplifies the trade-off between risk and reward: aggressive strategies offer continued upside but at higher cost, while conservative strategies sacrifice effectiveness for stability. This highlights the strategic challenge teams face in critical moments—balancing the need to avoid costly mistakes against the potential value of impactful plays.

```
[20]: top_swings = (
    df_small[["game_id", "qtr", "game_seconds_remaining",
              "posteam", "play_type", "epa", "wpa"]]
    .dropna()
    .sort_values("wpa", ascending=False)
    .head(20)
)

top_swings
```

```
[20]: game_id qtr game_seconds_remaining posteam play_type epa
wpa
302509 2015120300 4 0.0 GB pass 5.846742
0.994848
30135 2009112908 4 6.0 TEN pass 4.522390
0.969944
166721 2012120205 4 3.0 IND pass 4.957004
0.965698
169368 2012120907 4 16.0 PHI pass 4.016595
0.940764
```

417626	2018093000	4		12.0	CIN	pass	4.010533
0.939864							
272868	2015091312	4		13.0	DAL	pass	4.123232
0.938929							
124776	2011121103	4		8.0	HOU	pass	3.065129
0.937393							
112059	2011110612	4		14.0	BAL	pass	4.928386
0.929190							
142985	2012092400	4		8.0	SEA	pass	5.371513
0.927971							
284329	2015101200	4		12.0	PIT	pass	3.297078
0.927864							
97401	2011092511	4		730.0	CHI	pass	2.327556
0.918401							
186320	2013092208	4		21.0	TEN	pass	5.228800
0.913717							
184191	2013091502	4		6.0	BUF	pass	3.301204
0.913285							
92523	2011091801	4		18.0	BUF	pass	4.692063
0.898732							
141894	2012092303	4		6.0	DET	pass	5.433296
0.881709							
195630	2013101310	4		10.0	NE	pass	4.167601
0.881440							
239590	2014101204	4		7.0	GB	pass	1.769711
0.878967							
184365	2013091503	4		16.0	CHI	pass	4.552177
0.871990							
334254	2016102302	4		22.0	DET	pass	4.602825
0.853578							
135821	2012090901	4		27.0	JAC	pass	4.785494
0.849983							

This table highlights the most impactful plays in the dataset based on win probability added (WPA), capturing extreme high-leverage moments late in games. All listed plays occur in the fourth quarter with only seconds remaining, where the outcome of a single decision can effectively decide the game. Notably, every play in this subset is a passing play, reinforcing earlier findings that teams rely on aggressive strategies in critical situations despite the increased risk. The exceptionally high EPA and WPA values indicate that these plays produced dramatic shifts in game outcomes, often swinging win probability by more than 90%. These moments represent the upper tail of decision impact in NFL games, illustrating how a small number of high-risk choices can overshadow thousands of routine plays. This reinforces the central insight of the analysis: while most decisions have marginal effects, success or failure in a few high-pressure moments can ultimately determine victory or defeat.

[ ]:

```
[30]: # Selecting columns needed for Tableau dashboards
tableau_cols = [
    "game_id",
    "qtr",
    "game_seconds_remaining",
    "posteam",
    "play_type",
    "down",
    "ydstogo",
    "yardline_100",
    "epa",
    "wpa",
    "wp",
    "score_differential",
    "score_differential_post",
    "high_pressure",
    "late_game",
    "close_game",
    "red_zone",
    "turnover"
]

tableau_df = df_small[tableau_cols].dropna(subset=["epa", "wpa", "wp"])

# Exporting to CSV for Tableau
tableau_df.to_csv(
    "/Users/diyasansi/Desktop/nfl_play_by_play_tableau.csv",
    index=False
)

print(" Tableau-ready dataset saved to Desktop")
```

Tableau-ready dataset saved to Desktop

```
[ ]:
```