

The undervalued set piece: Analysis of Soccer Throw-ins during the English Premier League 2018-2019 Season

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The undervalued set piece: Analysis of Soccer Throw-ins during the English Premier League 2018-2019 Season

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- 19 The datasets generated during and/or analysed during the current study are not publicly
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29 The undervalued set piece: Analysis of Soccer Throw-ins during the

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English Premier League 2018-2019 Season

32 Set pieces in soccer (i.e., free kicks and corners) have been examined in detail and are a 33 common focus for coaches during training and performance preparation. However, 34 limited evidence is available on the impact of throw-ins on soccer performance and if 35 coaches should dedicate time in training towards this specific set piece. Therefore, this 36 research aimed to firstly examine if throw-in performance is linked with soccer 37 performance, and secondly the effect throw-in direction and length has on first contact 38 success rate, possession retention, mean time in possession and shot creation. 16,154 39 throw-ins from 380 English Premier League matches during the 2018-2019 season were 40 analysed. Higher final league position was correlated to increased throw-in first contact 41 success and possession retention. 83% of throw-in's resulted in a successful first contact, 42 54% resulted in possession being retained and 8.8% of throw-ins led to a shot at goal 43 from the possession achieved after a successful first contact. Throw-in's which went 44 backwards or laterally in direction resulted in increased first contact success, retaining of 45 possession, and shot creation. The least efficient throw-in was forwards and long, which 46 resulted in both reduced first contact success and possession retention. Findings 47 highlight, that throwing the ball laterally or backwards should be a focus for coaches and 48 players during attacking training. In contrast, a team's defensive strategy should reduce 49 the opportunities to throw backwards or laterally with a higher press and look to force a 50 long forward throw-in, therefore, increasing the likelihood of winning possession and 51 counter attacking.

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- 57 Key Words: Football; Performance Analysis; Set Pieces; Soccer; Throw-in.
- 58 Introduction

59 Performance analysis is now a central element of sport science support for soccer 60 coaches and therefore research has undergone rapid expansion over recent years, with studies 61 investigating performance indicators related to possession, tactical behaviour, positional demands and the match location.¹⁻⁴ Furthermore, with set pieces accounting for 30% to 40% 62 of goals scored in elite soccer⁵ recent research has focused on set piece examination of corner 63 kicks⁶, free kicks⁷⁻⁸, and penalty kicks⁹. Findings highlight these set piece game events as 64 65 critical components of successful offensive performance in soccer and hence form a key focus 66 area during professional soccer training and performance preparation. However, one set piece 67 which has had limited investigation is the throw-in and therefore it is unknown if coaches 68 should dedicate time in training towards this specific set piece. A throw-in is awarded to the 69 opponents of the player who last touched the ball when the whole of the ball passes over the touchline, on the ground or in the air (¹⁰Law 15). Recently, McKinley¹¹ highlighted in the 70 71 Major League Soccer (MLS) between 2015 and 2019 almost 64,000 throw-ins were 72 taken. This results in an average of 44 throw-ins occurring each game, accounting for 73 almost 5% of all passes. This means throw-ins occur more frequently per match than corner kicks $(10)^{6,12}$, free kicks $(25-35)^{7-8,13}$ and goal kicks $(17)^{14}$. This highlights the 74 importance throw-ins may have on a team's possession and the outcome of matches. 75

Research on throw-ins has typically focused on a biomechanical analysis of throwing
the ball as long as possible¹⁵ with the notion of creating a similar goal scoring opportunity to a
corner kick (i.e. the ability to deliver the ball into the 18-yard box with pre-plan routines).¹⁶⁻¹⁷
Yet, long throws into the 18-yard box are likely to be a small proportion of the total (approx.
44 per match) throw-ins taken per match.^{11,18} Rather, throw-ins are more commonly used to
restart a team's possession¹¹. With the importance of ball possession and shot creation being

demonstrated as two factors that can discriminate between winning, drawing, and losing
teams², throw-in strategy could therefore directly influence a team's ability to retain possession
and build goal scoring opportunities.

85 The location of the throw-in has been showed to influence game tactics, with throw-ins in the defensive area of the pitch taking longer to take (i.e. increased game interruption) than 86 in other areas of the pitch.¹⁴ Despite not examining the actions of the resulting throw-in, Siegle 87 and Lames¹⁴ suggested as the team not in ball possession frequently sees a throw-in in the 88 89 defensive area as an opportunity to conquer the ball, they create pressure that might lead to a 90 longer throw-in duration. This fits with anecdotal evidence from soccer coaches that suggests 91 throw-ins in defensive areas have traditionally been taught to "work the line" and "play in their 92 half". The emphasis being to throw the ball as long as possible in the forward direction ("down 93 the line") away from the teams' own goal. However, empirical evidence is required to support 94 the effectiveness of this strategy and help inform coaches tactics. Furthermore, the potential 95 importance of the throw-in on soccer matches was recently highlighted in practice by professional soccer teams starting to hire coaches specialising in throw-in strategy¹⁹. Yet with 96 the very limited research to date (for an exception see McKinley¹¹ online article) empirical 97 98 understanding on how throw-ins could affect soccer performance is needed to aid with future 99 coaching practice. Therefore, this research aimed to firstly examine if throw-in performance is 100 linked with soccer performance, and secondly the effect throw-in direction and length has on 101 first contact success rate, possession retention, mean time in possession, and shot creation 102 during the English Premier League 2018-2019 season.

103 Method

104 *Sample*

105 The 20 English Premier League teams were included in the sample. Raw coded data on 106 throw-in phases of play was exported from each of the 380 games during the 2018/2019 English 107 Premier League season from the Statsbomb database (https://statsbomb.com). Permission to 108 use the data was granted by Statsbomb. This resulted in a sample of 16380 phases of play 109 starting from a throw-in. After excluding throws-ins from injury clearances (i.e. possession 110 freely given back to the opposition following the ball being kicked out of play due to an injury) 111 a total of 16154 throw-in's were included in the sample (see table 1) and resulted on average 112 of 808 throw-in's per team (range 716-912 throw-ins). The Local University ethics committee 113 granted approval for the study.

114

Table 1

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116 Measures and Procedures

117 Raw data from each throw-ins phase of play was exported from the Statsbomb database (www.statsbomb.com). The phase of play was defined from the start of the throw-in action, to 118 119 the point the team which threw the ball lost possession of the ball. Raw data included, the team, 120 opposition team, throw in location (x, y), outcome of the throw, throw-in outcome location (x, 121 y), angle of throw in, length of throw-in, time in the match, actions during the possession from 122 the throw-in, and the outcome of possession from the throw-in. Microsoft Office Excel 123 (Version 14.7.1, Microsoft Cooperation, United States) was used to calculate performance indicators from the raw files for each of the 20 teams. Based on the performance indicators, 124 125 three independent variables were examined, length (short, medium, long), direction 126 (backwards, lateral, forwards) and pitch location (4 areas, see figure 1). The effect of these independent variables was examined via four dependant variables, first contact success, 127

possession retention success, mean time in possession, and shot creation (See table 2 and figure1 for categories and definitions).

Figure 1

131

Statsbomb are one of the leading suppliers of statistical data in professional football clubs, media outlets, and broadcasters. However, to ensure the reliability of the data set, three randomly selected matches were independently coded by the lead author using a NacSport (NacSport Elite, Las Palmas de Gran Canaria, Spain) custom-notational analysis system examining throw-in location, length, direction and outcome (i.e. first contact succuss and possession retention). Cohen's kappa coefficient was calculated, based on analysis of 106 throw-ins, with a kappa value of k = 0.97 representing excellent reliability.²⁰

139 Data Analysis

140 Descriptive analyses was employed in Microsoft Office Excel to calculate relative 141 frequencies for each variable and the calculation of performance mean success values for each 142 team, (based on each teams 38 games) for each variable. The data was then transferred to SPSS 143 (Version 24.00 SPSS Inc., USA) to perform statistical analysis. First to establish if a relationship existed between overall team performance and throw-ins, separate spearman 144 145 correlation coefficients were performed between final league position (ranked 1-20) and first 146 contact success, possession retention success, mean time in possession, and throw-ins resulting 147 in a shot from the possession achieved after a successful first contact. Second, to test the 148 relationship between league position and throw-in strategy, separate spearman correlation 149 coefficients were performed between final league position, and percentage of throw-ins 150 (directions and lengths). Due to the low number of throw-ins taken in the defensive 18-yard 151 area, and the expectation of throw-ins in the attacking 18-yard area to have more of an emphasis 152 on direct set pieces and not possession retention, these two zones were excluded from further 153 analysis. Data was examined between the two remaining locations (rest of the defensive half, and rest of the attacking half) to examine the influence of specific throw-in strategies on 154 155 performance (examined via first contact success, possession retention and shot creation). The 156 majority of data was normally distributed, examined via Shapiro-wilk tests (p > .05), therefore parametric analysis was employed. Separate Three-way (Location, Direction and Length) 157 158 repeated measure Analysis of Variances (ANOVA) were used to examined first contact 159 success, possession retention, and mean time in possession with pairwise post-hoc testing using 160 a Bonferroni correction. Finally, due to the lower number of shots being created, the two 161 locations were combined and a Two-way (Direction and Length) ANOVA was employed for 162 shot creation. If the assumption of sphericity was violated, a Greenhouse-Geisser correction 163 was used. Partial Eta Squared (ηp^2) is presented for effect size estimations of main effects on 164 ANOVAs.

165

166 **Results**

Descriptive analysis is presented in table 3. A total of 16154 throw-in's were taken during the 2018-2019 season (excluding injury clearances), in which 83% (13376 throws) resulted in a successful first contact, 54% (8847 throws) resulted in possession being retained for 7 seconds or longer, with 8.8% (1422) of throw-ins resulting in a shot from the possession achieved after a successful first contact. The most common direction of throw was forwards (41.3%) with 78.5% of throw-ins taken in the rest of the attacking and defensive areas.

173

Table 3

174

175 Relationship between throw-ins and final league position

176 There was a relationship between league position and first contact success (r_s (20) = -177 .868, p < 0.001), possession retention success (r_s (20) = -.768, p < 0.001), mean time in

178	possession after the throw-in ($r_s(20) =738$, $p < 0.001$) and throw-ins resulting in a shot from
179	the possession achieved after a successful first contact ($r_s(20) =640$, $p < 0.05$) (see figure 2).
180	The higher ranked teams had greater success rates in all four variables.
181 182	**Figure 2**
183	Final league position was correlated with percentage of throw-ins performed backwards
184	$(r_s (20) =662, p = 0.001)$, forwards $(r_s (20) = .767, p < 0.001)$ and lateral $(r_s (20) =474, p = 0.001)$
185	= 0.035) (figure 3). Higher ranked teams performed more backwards throw-ins, whereas lower
186	ranked teams favoured a forward direction. No relationship was shown between league
187	position and lengths of throw-in ($p > 0.05$).
188 189	**Figure 3**
190 191	First Contact Success
192 193	The three-way repeated measure ANOVA showed an interaction for
194	direction*length*location for first contact success $F(2.623, 49.830) = 20.773, p < 0.001, \eta p^2 =$
195	.522. There was also a two-way interaction for direction*length $F(4, 76) = 125.534$, $p < 0.001$,
196	ηp^2 = .869 and location*direction <i>F</i> (1.708, 32.452) = 38.617, <i>p</i> < 0.001, ηp^2 = .670 for first
197	contact success. But location*length was not significant $F(1.5, 28.504) = 1.964, p > 0.05, \eta p^2 =$
198	.094.
199	There was a main effects for direction $F(1.6, 20.397) = 537.408, p < 0.001, \eta p^2 = .966$
200	and length $F(1.599, 30.384) = 218.496$, $p > 0.001$, $\eta p^2 = .920$, but no main effect for location
201	$F(1, 19) = 2.562, p < 0.05, \eta p^2 = .119$. Post-hoc tests showed differences between all lengths
202	(all $p < 0.05$) of the throw-in, with first contact success rate decreasing as throw-in length
203	increased. Post-hoc tests showed a significant difference between the three direction (all $p <$
204	0.05) with throwing the ball backwards (99.5%) resulting in the highest first contact success
205	rate with a 24.9% increase compared to throwing the ball forwards (74.6%). Hence, as figure

206 4 demonstrates, when throwing backwards, length of throw-in did not affect success rates 207 regardless of location. However, when throwing forwards, as the length increased, there was a reduction in success, with the lowest success rate being forwards and long in the rest of the 208 209 defensive half.

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Figure 4

Retaining Possession from a Throw-In 212

213 The three-way repeated measure ANOVA showed an interaction for direction*length*location for possession retention success $F(2.647, 50.292) = 4.02, p < 0.05, \eta p^2 = .175$ (see figure 5). 214 There was also a two-way interactions for possession retention for direction*length F(2.428,215 $46.130 = 21.365, p < 0.001, \eta p^2 = .529$ and location*direction $F(2, 38) = 4.221, p < 0.05, \eta p^2 = .529$ 216 .182. However, location*length was not significant F(2, 38) = 2.069, p > 0.05, $\eta p^2 = .098$. 217

There was a main effect for direction F(2, 38) = 309.484, p < 0.001, $\eta p^2 = .942$. Post-218 hoc tests showed a difference between the three direction (all p < 0.05) with throwing 219 220 backwards (83.0%) having higher success rates than lateral (67.7%) and forwards (50.3%). There was also a main effect for length $F(1.418, 26.934) = 9.90, p > 0.05, \eta p^2 = .343)$. Post-hoc 221 tests showed a difference between Short (70.5%) compared to medium (66.2%) and long 222 (64.3%) (p < 0.05). The main effect for location was not significant F(1, 19) = 0.406, p > 0.05, 223 $\eta p^2 = .021.$ 224

225 The three-way repeated measure ANOVA interaction for direction*length*location was non-significant for mean time in possession F(2.428, 46.139) = 2.72, p = 0.066, $\eta p^2 = .125$. 226 227 However, there was an interaction for mean time in possession for direction*length F(2.013,38.25 = 12.886, p < 0.001, ηp^2 = .404, location*length F(2, 38) = 5.154, p < 0.05, $\eta p^2 = .213$, 228 and location*direction $F(2, 38) = 3.687, p < 0.05, \eta p^2 = .163$. 229

There was a main effect for direction F(2, 38) = 257.798, p < 0.001, $\eta p^2 = .931$. Post hoc 230 231 analysis showed throwing backwards (24s) had a longer mean possession than forwards (13s p < 0.001) or laterally (19s p < 0.001). Laterally also had a longer mean time than forwards (p 232

< 0.001). The main effect for length was significant F(2, 38) = 8.381, p > 0.05, $\eta p^2 = .306$. Post 233 234 hoc analysis showed longer time for short (20.0secs) compared to long (17.8secs) (p < 0.005). There was also a main effect for location F(1, 19) = 6.861, p > 0.05, $\eta p^2 = .265$ with longer time 235 236 in possession in the defensive half (19.4 secs) compared to the attacking half (18.4 sec). 237 238 **Figure 5** 239 240 Throw-in resulting in a Shot 241 242 1053 throw-ins resulted in a shot originating from the rest of the attacking and defensive 243 area of the pitch after a first contact was won. Based on all throw-ins taken in the rest of the 244 attacking and defensive half, an interaction for direction*length for shot creation was shown $F(4, 76) = 3.230, p = 0.029, \eta p^2 = .145$. The main effect of direction affected shot creation $F(2, 76) = 0.029, \eta p^2 = .145$. 245 $(38) = 29.080, p < 0.001 \eta p^2 = .605$. Post-hoc analysis showed backwards (11.2%) and lateral 246 247 (12.2%) throws were more likely to produce shots than forwards throws (6.6%). The main effect for length was not significant F(2, 38) = 3.054, p < 0.05, $\eta p^2 = .138$. 248

249

251

250 Discussion

252 This research firstly examined if throw-in performance was correlated to final league position, and then how throw-in direction and length affected first contact success rate, 253 possession retention, and shot creation during the English Premier league 2018-2019 season. 254 On average 43 throw-ins were taken per match, meaning throw-ins occur more frequently than 255 corner kicks⁶, free kicks⁷⁻⁸ and goal kicks¹⁴ highlighting the influence throw-ins could have on 256 257 professional soccer and a need for coaches to focus on this set piece. The importance throw-258 ins could have on performance was indicated via significant correlations with teams ranked 259 highest in the final league position having increased first contact success, possession retention and shot creation. These correlations suggest either first contact success, possession retention 260 261 and shot creation results in teams winning or drawing more matches (i.e. gaining more points

to be ranked higher in the league), or higher ranked teams use more effective throw-in strategy resulting in greater success. To explore this further, initial data, suggested the differences in success rate were due to changes in throw-in strategy, with higher ranked teams utilising backwards and lateral throw-ins more often, in comparison to lower ranked teams favouring a forward throw-in.

267 To negate the effect increased *skill level* of higher ranked teams may have on throw-in 268 outcome, we utilised a repeated measure design to examine how specific throw-in strategies 269 influence success rates. From the 16154 throw-ins, 83% of throws resulted in a successful first 270 contact, 54% resulted in the team retaining possession for 7 seconds or longer, with a shot 271 being achieved 8.8% of the time from throw-ins after a successful first contact. This is in line 272 with previous data analysing throw-ins from the MSL.¹¹ The attention of throw-in analysis has 273 typically focused on long throw-ins within the attacking 18-yard box due to similarities with corner kick set pieces¹⁶. However, the results here show 78.5% of throws come from the rest 274 275 of the attacking and defensive areas of the pitch. This highlights the importance throw-ins have 276 on restarting, and then building a team's possession in open play and hence, we further explored 277 these specific pitch locations in more detail.

278 When exploring the throw-in strategies used in the rest of the attacking and defensive areas 279 a clear pattern of findings emerged. The data here empirically supports anecdotal evidence that a common strategy is to throw the ball forwards and long¹⁵ with the most common direction of 280 281 throw being forwards, at either medium (10-20 yards) or long (20+ yards) distances. However, 282 the data suggested this throw-in strategy, although being the most common, is also the least 283 effective at both achieving a successful first contact and retaining possession. As Siegle and Lames¹⁴ suggested, the team not in ball possession frequently sees a throw-in in the defensive 284 285 area as an opportunity to conquer the ball and create pressure. A possible explanation is when 286 throwing the ball forwards, the opposition are set up in a compact shape, outnumbering the 287 attacking team with defensive players. This results in a 'fight ball' being thrown down the line 288 into an unfavourable situation and therefore in a loss of first contact and ball possession 289 retention. Furthermore, when throwing forwards the aim might be for players to head/flick the ball onto a teammate, however, as Szczepański and McHale²¹ demonstrate headed passes are 290 291 less accurate and have a negative effect of the following pass, in comparison to those passed 292 from the ground, hence might lead to a loss of possession. The results here, suggest the common 293 coaching principle of throwing the ball forwards and long away from the goal in the defensive 294 half is an ineffective tactic.

295 In comparison when throwing backwards or laterally, the length of the throw did not affect 296 first contact success rate. Results here demonstrate one way to relieve pressure in the rest of 297 the defensive half is to throw the ball long backwards with a 99.9% first contact success rate, 298 this is over double the success rate compared to throwing long and forwards (47.4%). A key 299 element after a successful first contact, is the team's ability to retain possession within the 300 central areas of the pitch. This allows them to build either a successful attack or negate 301 conceding possession and defending a fast counter attacking situation from the opposition.¹ In 302 line with first contacts, throwing the ball backwards had the highest association with retaining 303 possession. In the rest of the defensive half throw-ins that went backwards or laterally had the 304 greatest success at retaining possession when thrown long and decreased from medium to short 305 length. Furthermore, examining the length of possession (of those throws with possession 306 retained for a minimum of 7 seconds) shows mean time in possession was longest when 307 throwing backwards (24s) compared to forwards (13s). It's suggested when throwing 308 backwards or laterally, compared to throwing forwards, teams may not apply pressure high up 309 the pitch allowing the receiver to secure possession with time and space to build an effective 310 attack. From an opposition perspective, this highlights the importance of applying pressure 311 high up the pitch, preventing the backwards or lateral throw-in. Therefore, reducing the 312 likelihood of longer possessions and increasing the rate of turnovers from a forward 'fight ball'313 throw-in.

314 In the rest of the attacking half, when throwing backwards, the length of throw did not 315 affect first contacts. Laterally, when throwing long, there was a reduction in success rate. When 316 throwing forwards, there was a reduction in success from (94.2%) a short length, compared to 317 (59.3%) a long length. Hence, if teams want to increase their chance of achieving a successful 318 first contact, they should throw backwards, or laterally, not forwards in the rest of the attacking 319 half. After first contact success, in the rest of the attacking half, there was also a significant 320 association between the combined direction and length of throw on retaining possession. 321 Throw-ins that went backwards had the greatest success when thrown longer, however, length 322 did not affect possession retained rates when throw-ins went laterally. Forward throw-ins again 323 had the lowest success rates and decreased as the throw-in length increased. There was also 324 significant interaction of mean time in possession for direction and length. The direction 325 showed throwing backwards (24s) had a longer mean possession than forwards (13s) or 326 laterally (18s). With both first contact success and retaining of possession demonstrating clear 327 advantages for throwing backwards or laterally, finally it was explored if these possessions 328 resulted in more successful outcomes (i.e. shots being created).

329 When examining shot creation, after a successful first contact, throw-ins which went 330 backwards or laterally had more chance of creating shots than throwing forwards. This provides 331 further evidence to emphasise the importance of teams needing to show the composure to throw 332 backwards and go against the common coached principles of throwing forwards down the line 333 towards the opposition's half. Therefore, increasing both their time in possession but also a 334 chance of creating a shot. From a defensive perspective, the common coached strategy has been 335 to drop off and allow the opposition to throw the ball backwards or laterally to a position which 336 is perceived to be a less threatening area away from their own goal. However, with the finding's presented here, coaches should examine their own strategy to consider if a different defensive strategy might be more effective. One possible approach could look to force the opposition into throwing the ball long and forwards which may result in regaining possession quicker allowing a counterattack while also potentially conceding less shooting opportunities.

341 The findings here provide a starting point to support the importance of coaches focusing 342 on the use of throw-in strategy to increase possession and chance creations within professional 343 soccer. However, with limited published data, and one season's data examined here, the 344 findings should be interpreted with caution and there are many future areas of research that 345 should be examined to explore if similar patterns emerge. Further comparison within and 346 between soccer leagues will enable a greater understanding on the importance throw-ins have 347 on team performance. Furthermore, with backwards and lateral throw-ins appearing to show 348 an advantageous tactic in this data set, further exploration to explain why throwing in these 349 directions has greater success rates should be explored in more detail. For example, lower 350 ranked teams may be willing to concede possession against a higher ranked team, so they 351 remain in a compact defensive shape and do not overcommit players with their set up on the 352 throw-in. Hence, further evaluation on what constitutes a successful throw-in needs 353 investigating. Finally, investigating if score line, or individual match outcome is influenced 354 by throw-in strategy will aid future coaching practice.

355

356 Conclusion

In conclusion, results here suggest throw-in success may be associated with final league performance. This data highlights to coaches how throw-in tactics might affect first contact success rates, possession retention and shot creation in professional soccer. Findings demonstrate, throwing the ball laterally or backwards can increase throw-in success rates in comparison to throwing the ball forwards. Furthermore, higher ranked teams utilised this

362	strategy more often and coaches could examine their current throw-in strategies to see in			
363	impler	nenting changes may link to an overall improved team performance.		
364	Ackno	owledgement		
365	The au	athors would like to thank Dougie Wright for his help during the collection of the raw		
366	data p	resented within this manuscript.		
367				
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449 450 451 452	
453 454 455 456 457 458 459 460	

Table 1. Total number of throw-ins and mean throw-ins per match during the 2018-2019

462 English Premier League Season

Team	Throw-ins meeting	Mean throw-in's		
	inclusion criteria	per match		
AFC Bournemouth	804	21		
Arsenal	804	21		
Brighton & Hove Albion	831	22		
Burnley	867	23		
Cardiff City	768	20		
Chelsea	734	19		
Crystal Palace	800	21		
Everton	902	24		
Fulham	741	20		
Huddersfield Town	912	24		
Leicester City	841	22		
Liverpool	884	23		
Manchester City	716	19		
Manchester United	825	22		
Newcastle United	805	21		
Southampton	764	20		
Tottenham Hotspur	810	21		
Watford	737	19		
West Ham United	792	21		
Wolverhampton Wanderers	817	22		

Table 2. Operational definitions for throw-in lengths, directions and outcome variables
493 (based on Statsbomb and McKinley, 2018).

Category	Operational Definition
First Contact	 Successful: A player from the same team which throws the ball into play makes first contact with the ball post throw-in without an opposition player making contact. Unsuccessful: A player from the opposition team which throws the ball into play makes first contact with the ball post throw-in. Success percentage: Calculated by dividing the number of successful first contacts in a category (i.e. short) by the total number of actions (Successful + Unsuccessful) performed in that category and multiplying by 100
Time in Possession	The time (seconds) from the throw-in action to the end of possession. A possession was defined as a passage of play during which one team is largely in control of the ball. This may involve that team temporarily being dispossessed, but a new possession will only start if the opposing team is then able to demonstrate that they are fully in control of the ball (www.Stasbomb.co.uk).
Possession Retention	Successful: The ball is retained in possession (as defined above) for 7 seconds from the point in which the ball is thrown. Unsuccessful: The ball possession is lost (as defined above) with in 7 seconds from the point in which the ball is thrown. Success percentage: Calculated using only the throw-ins which achieved a successful first contact ($n = 13376$). Calculated by dividing the number of successful possessions retained in a category (i.e. short) by the total number of actions (excluding those this did not achieve a successful first contact) performed in that category and multiplying by 100
Throw-in resulting in a shot	Shot Creation: A shot was recorded when a player attempted a shot at goal which resulted from the throw-in possession Success percentage: Calculated based on all throw-ins taken with throw ins in each category resulting in a shot divided by total number of throws in that category, multiplied by 100.
Throw in Length	 Short: The ball was thrown a distance between 0-10 yards (0-9.1meters) Medium: The ball was thrown a distance between 10-20 yards (9.1-18.2m). Long: The ball was thrown a distance of 20 yards or longer (18.2m).
Throw in Direction	 Forward: The ball is thrown between 0-60 degrees in reference to the sideline towards the offensive goal. Lateral: The ball is thrown between 60-120 degrees in reference to the sideline. Backward: The ball is thrown between 120-180 degrees in reference to the sideline towards the defensive goal.

Table 3. Descriptive analysis of Throw-in strategy (n = 16154), first contact success (n = 13376) and possession retained (n = 8847) in relation to throw-in length, direction, and pitch location.

	Throw-in Strategy		First Contact Success		Possession Retained	
	Percentage	Number of Throws	Mean Percentage	Number of Throws	Mean Percentage	Number of Throws
Throw in Length						
Short	19.40%	3134	97.3%	3050	62.8%	1920
Medium	41.70%	6736	89.3%	6020	64.0%	3859
Long	38.90%	6284	69.5%	4306	70.6%	3068
Direction						
Backwards	29.70%	4805	99.5%	4781	83.5%	4044
Lateral	29.00%	4677	89.2%	4165	64.0%	2687
Forwards	41.30%	6672	67.6%	4430	48.3%	2116
Pitch Location						
Attacking 18 Yard	15.00%	2419	86.0%	2077	62.8%	1311
Rest of Attacking Half	42.10%	6793	87.7%	5942	69.6%	4140
Rest of Defensive Half	36.40%	5873	78.3%	4612	65.0%	3034
Defensive 18 Yard	6.60%	1069	69.0%	745	48.5%	362

- 531 Figure 1. Definitions of pitch location, direction of throw-in, and length of throw-in (adapted 532 from Siegle & Lames 2012; McKinley, 2018).
- 533 Figure 2. Correlations between final league position and first contact success (a), possession
- retention for 7 seconds (b), mean time in possession from the throw-in (c), and (d) throw-ins 534 535 resulting in a shot from the possession achieved after a successful first contact.
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- 537 Figure 3. Correlations between final league position and percentage of throw-ins performed
- in the backwards (a), forwards (b) and lateral (c) direction. 538
- 539 Figure 4. First contact success rate (percentage and absolute values) based on pitch location, 540 throw-in direction and throw-in length.
- 541 Figure 5. Possession retained success based on pitch location, throw-in direction and throw-in
- 542 length. Percentage success, absolute values and mean time in possession.
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