

# 分析 NBA 各隊伍是否存在主場優勢

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## 壹、緒論

平常就有在關注 NBA 的例行賽事，最近衛冕軍金州勇士隊於客場苦吞十連敗，卻在其主場贏得八連勝。大眾普遍認為在實力相當的情況下，主場的隊伍會有更高的機率取勝，勇士隊在本季例行賽中，如此懸殊的差距讓我們感到非常詫異，並好奇是否真的是因為主場優勢，才使勇士隊拿下勝利。

主場優勢的定義為，在有主客場的比賽中，主場勝率超過五成的現象，並主要受到群眾、旅行、熟悉度和規則影響。(Courneya amp; Carron, 1992) 我們將在此報告中客觀探討 NBA 主場優勢的存在與否，並且進一步量化主場及其相關因素（如：對比賽場地的熟悉度、觀眾的呼聲、裁判判決的公平性、罰球數）在比賽得分上所造成的影響，判斷真正影響主場優勢的因素為何。

## 貳、文獻回顧

### 2.1 觀眾呼聲

- a. Enrique Alonso曾針對疫情對歐洲職籃主客場隊伍勝率做實證研究，使用Wilcoxon和Mann-Whitney U測試，透過疫情前和疫情比賽之間的主場勝率差，來識別主場優勢，並指出實力較差的隊伍更受主場優勢的影響。
- b. Kai Fischer和Justus Haucap將上座率作為主場優勢的關鍵要素，於2019至2020年期間，德國足球聯賽曾出現沒有觀眾的「ghost games」，並發現一級聯賽的主場優勢確實減少，而二、三級則沒有變化，因此判定，對於經常出現低上座率的隊伍而言，較不受主場優勢的變化影響。

### 2.2 裁判判決的公平性

- a. 利用裁判判決數據的資料：<https://www.oddsshark.com/nba/referee-handicapping-statistics>  
主要會使用到 'Home Wins' , 'Home Losses' , 'Away Wins' , 'Away Losses' , 'Home Fouls' , and 'Away Fouls' 這幾筆變數資料，分析此變數實際影響比賽的程度。

## 2.3 主場優勢

- a. Austin R. Harris在"NBA team home advantage: Identifying key factors using an artificial neural network"的研究方法指出定義主場優勢有多種方式，對於頻率較高的資料，point differential為有效的方式；對頻率較低的資料，win share為有效的方式。最常見的定義為

$$\text{Home Advantage} := \frac{\text{Home Wins}}{\text{Total Games Played}}$$

然而其缺點為當分母較小時，可能因分子差值波動而過於敏感。因此他提出了下列等式

$$\text{Home Advantage} := \left( \frac{\text{Home Wins} - \text{Away Wins}}{\text{Total Games Played}} \right) \leftarrow$$

## 參、研究資料與方法

### 3.1 研究期間及資料選擇

本研究採用針對NBA的30支球隊作為研究對象，研究的樣本期間為2013至2022年，近10年之panel data。我們將分析各年度例行賽球隊主場勝率與各項比賽數據的線性回歸關係，另外再加入上座率（觀賽人數/座位數）等變數，以此觀察對主場勝率的影響。此外，由於裁判對於比賽的影響重大，因此透過主隊的罰球數作為判罰次數的代理變數，判斷裁判的判決是否也會影響主場優勢的形成。

我們將建立模型並觀察 (1) 觀眾的影響（上座率）(2) 裁判判決經驗（罰球數）這兩個因素是否會對球隊表現，也就是主場勝率造成影響，以此，將在3.2節描述此模型的設計以及變數。

### 3.2 模型設計：

- a. 各變數代號與對應之定義：

| 變數代號       | 變數定義 |
|------------|------|
| <i>PTS</i> | 得分差  |

|                        |                   |
|------------------------|-------------------|
| <i>WL_HOME</i>         | 主場是否獲勝(虛擬變數)      |
| <i>TEAM</i>            | 隊伍(虛擬變數)          |
| <i>ATTENDENCE</i>      | 觀眾人數              |
| <i>DISTANCE</i>        | 客場、主場球隊各自主場館距離    |
| <i>ALT_DIFF</i>        | 客場、主場球隊各自主場館海拔差   |
| <i>ACROSS</i>          | 是否跨越時區(虛擬變數)      |
| <i>FG_PC</i>           | 整體命中率差            |
| <i>FT_PCT</i>          | 罰球命中率差            |
| <i>AST</i>             | 助攻數差              |
| <i>REB</i>             | 籃板數差              |
| <i>OP_AWAY_WIN</i>     | 對手球隊之客場勝率         |
| <i>FTA</i>             | 罰球次數              |
| <i>AVG.PTS</i>         | 平均得分差             |
| <i>AVG.WL_HOME</i>     | 主場獲勝率             |
| <i>AVG.ATTENDENCE</i>  | 平均觀眾人數            |
| <i>AVG.DISTANCE</i>    | 平均客場、主場球隊各自主場館距離  |
| <i>AVG.ALT_DIFF</i>    | 平均客場、主場球隊各自主場館海拔差 |
| <i>AVG.OP_AWAY_WIN</i> | 平均對手球對於客場勝率       |
| <i>AVG.FTA</i>         | 平均罰球次數            |
| <i>AVG.FG_PCT</i>      | 平均整體命中率差          |
| <i>AVG.FT_PCT</i>      | 平均罰球命中率差          |
| <i>AVG.AST</i>         | 平均助攻數差            |
| <i>AVG.REB</i>         | 平均籃板數差            |

b. 隊伍代號

|     |         |
|-----|---------|
| ATL | 亞特蘭大老鷹  |
| BKN | 布魯克林籃網  |
| BOS | 波士頓塞爾蒂克 |
| CHA | 夏洛特黃蜂   |
| CHI | 芝加哥公牛   |
| CLE | 克里夫蘭騎士  |
| DAL | 達拉斯獨行俠  |
| DEN | 丹佛金塊    |
| DET | 底特律活塞   |
| GSW | 金洲勇士    |
| HOU | 休士頓火箭   |
| IND | 印第安那溜馬  |
| LAC | 洛杉磯快艇   |
| LAL | 洛杉磯湖人   |
| MEM | 曼斐斯公熊   |
| MIA | 邁阿密熱火   |
| MIL | 密爾瓦基公鹿  |
| MIN | 明尼蘇打灰狼  |
| NOP | 紐奧良鵜鶘   |
| NYK | 紐約尼克    |
| OKC | 奧克拉荷馬雷霆 |
| ORL | 奧蘭多魔術   |
| PHI | 費城76人   |

|     |         |
|-----|---------|
| PHX | 鳳凰城太陽   |
| POR | 波特蘭拓荒者  |
| SAC | 沙加緬度國王  |
| SAS | 聖安東尼奧馬刺 |
| TOR | 多倫多暴龍   |
| UTA | 猶他爵士    |
| WAS | 華盛頓巫師   |

系列一：NBA各隊主場優勢

模型型式: LSDV model

變數足標: i: 不同比賽場次; t: 不同季度

變數分類:

| 基礎變數   | 各隊所對應之虛擬變數                                      |
|--------|---|
| 地理相關變數 | 觀眾人數、客場主場球隊各自主場館距離、客場、主場球隊各自主場館海拔差、是否跨越時區(虛擬變數) |
| 比賽參數   | 整體命中率差、罰球命中率差、助攻數差、籃板數差、對手球隊之客場勝率、罰球次數          |

模型一: 以各隊伍之虛擬變數分析得分差

$$PTS_{it} = \beta_0 + \beta_i(Team_i) + \varepsilon_{it} \leftarrow$$

模型二: 以各隊伍之虛擬變數分析勝率

$$wl\_home_{it} = \beta_0 + \beta_i(Team_i) + \varepsilon_{it} \leftarrow$$

模型三: 以各隊伍之虛擬變數與顯著之地理相關變數分析 **得分差**

$$PTS_{it} = \beta_0 + \beta_1(attendance_{it}) + \beta_i(Team_i) + \varepsilon_{it} \leftarrow$$

模型四: 以各隊伍之虛擬變數與顯著之地理相關變數分析 **勝率**

$$wl\_home_{it} = \beta_0 + \beta_1(attendance_{it}) + \beta_2(distance_{it}) \leftarrow \\ + \beta_i(Team_i) + \varepsilon_{it} \leftarrow$$

模型五: 以各隊伍之虛擬變數與顯著之比賽相關變數分析 **得分差**

$$PTS_{it} = \beta_0 + \beta_1(fg\_pct_{it}) + \beta_2(ft\_pct_{it}) + \beta_3(ast_{it}) + \beta_4(reb) + \beta_5(fa_{it}) \leftarrow \\ + \beta_6(op\_away\_win_{it}) + \beta_7(attendance_{it}) + \beta_8(fa_{it} * attendance) \leftarrow \\ + \beta_i(team_i) + \varepsilon_{it} \leftarrow$$

模型六: 以各隊伍之虛擬變數與顯著之比賽相關變數分析 **勝率**

系列二：平均主場優勢：將各個隊伍的比賽表現取季平均，觀察不同季度下的表現

$$wl\_home_{it} = \beta_0 + \beta_1(fg\_pct_{it}) + \beta_2(ft\_pct_{it}) + \beta_3(ast_{it}) + \beta_4(reb) + \beta_5(fa_{it}) \leftarrow \\ + \beta_6(op\_away\_win_{it}) + \beta_i(team_i) + \varepsilon_{it} \leftarrow$$

模型型式: Fixed-Effect model, Random Effect model

變數足標: i: 不同 **隊伍**; t: 不同 **季度**

模型七: 以地理相關變數、比賽相關變數均值分析 **平均得分差** (Fixed-Effect model)

$$\overline{pts}_{it} = \beta_{0_i} + \beta_1(\overline{fgpct}_{it}) + \beta_2(\overline{ftpct}_{it}) + \beta_3(\overline{ast}_{it}) + \beta_4(\overline{reb}) \leftarrow \\ + \beta_5(\overline{Attendance}_{it}) + \beta_6(\overline{Distance}_{it}) + \beta_7(\overline{Alt\_diff}_{it}) \leftarrow \\ + \beta_8(\overline{Op\_away\_win}_{it}) + \beta_9(\overline{Fta}_{it}) + \varepsilon_{it} \leftarrow$$

模型八: 以地理相關變數、比賽相關變數均值分析 **平均勝率** (Fixed-Effect model)

$$\overline{wl\_home}_{it} = \beta_{0_i} + \beta_1(\overline{fgpct}_{it}) + \beta_2(\overline{ftpct}_{it}) + \beta_3(\overline{ast}_{it}) + \beta_4(\overline{reb}) \leftarrow \\ + \beta_5(\overline{Attendance}_{it}) + \beta_6(\overline{Distance}_{it}) + \beta_7(\overline{Alt\_diff}_{it}) \leftarrow \\ + \beta_8(\overline{Op\_away\_win}_{it}) + \beta_9(\overline{Fta}_{it}) + \varepsilon_{it} \leftarrow$$

模型九: 以地理相關變數、比賽相關變數均值分析平均得分差 (Random Effect model)

$$\overline{pts_{it}} = \beta_{0_i} + \beta_1(\overline{fgpct_{it}}) + \beta_2(\overline{ftpct_{it}}) + \beta_3(\overline{ast_{it}}) + \beta_4(\overline{reb}) \leftarrow \\ + \beta_5(\overline{Attendance_{it}}) + \beta_6(\overline{Distance_{it}}) + \beta_7(\overline{Alt\_diff_{it}}) \leftarrow \\ + \beta_8(\overline{Op\_away\_win_{it}}) + \beta_9(\overline{Fta_{it}}) + \varepsilon_{it} \leftarrow$$

模型十: 以地理相關變數、比賽相關變數均值分析平均勝率 (Random Effect model)

$$\overline{wl\_home_{it}} = \beta_{0_i} + \beta_1(\overline{fgpct_{it}}) + \beta_2(\overline{ftpct_{it}}) + \beta_3(\overline{ast_{it}}) + \beta_4(\overline{reb}) \leftarrow \\ + \beta_5(\overline{Attendance_{it}}) + \beta_6(\overline{Distance_{it}}) + \beta_7(\overline{Alt\_diff_{it}}) \leftarrow \\ + \beta_8(\overline{Op\_away\_win_{it}}) + \beta_9(\overline{Fta_{it}}) + \varepsilon_{it} \leftarrow$$

#### 肆、實證研究

以下均使用95%顯著性作為假設檢定之依據。以下數據及Forward Selection過程詳見  
[https://drive.google.com/drive/folders/1YWW2QEX\\_rGS5o5HlpO4rOmkDRo5MXQHq?usp=sharing](https://drive.google.com/drive/folders/1YWW2QEX_rGS5o5HlpO4rOmkDRo5MXQHq?usp=sharing)

系列一: base group 為 ALT。

模型一:

| Predictors  | Estimates | CI              | p     |
|-------------|-----------|-----------------|-------|
| (Intercept) | 2.6646    | 1.1361 - 4.1930 | 0.001 |

|                                 |         |                   |        |
|---------------------------------|---------|-------------------|--------|
| team abbreviation home<br>[BKN] | -2.9193 | -5.0774 - -0.7612 | 0.008  |
| team abbreviation home<br>[BOS] | 1.5053  | -0.6529 - 3.6634  | 0.172  |
| team abbreviation home<br>[CHA] | -1.2013 | -3.3680 - 0.9654  | 0.277  |
| team abbreviation home<br>[CHI] | -2.1804 | -4.3419 - -0.0189 | 0.048  |
| team abbreviation home<br>[CLE] | -1.4539 | -3.6120 - 0.7042  | 0.187  |
| team abbreviation home<br>[DAL] | 0.5698  | -1.5849 - 2.7246  | 0.604  |
| team abbreviation home<br>[DEN] | 0.4765  | -1.6799 - 2.6329  | 0.665  |
| team abbreviation home<br>[DET] | -2.6677 | -4.8310 - -0.5045 | 0.016  |
| team abbreviation home<br>[GSW] | 5.9335  | 3.7720 - 8.0951   | <0.001 |
| team abbreviation home<br>[HOU] | 0.2757  | -1.8824 - 2.4338  | 0.802  |
| team abbreviation home<br>[IND] | 1.4046  | -0.7535 - 3.5627  | 0.202  |
| team abbreviation home<br>[LAC] | 4.4078  | 2.2497 - 6.5659   | <0.001 |



|                                 |         |                   |        |
|---------------------------------|---------|-------------------|--------|
| team abbreviation home<br>[LAL] | -3.7434 | -5.9032 - -1.5836 | 0.001  |
| team abbreviation home<br>[MEM] | 0.1191  | -2.0373 - 2.2756  | 0.914  |
| team abbreviation home<br>[MIA] | 1.1090  | -1.0491 - 3.2671  | 0.314  |
| team abbreviation home<br>[MIL] | 1.2660  | -0.8938 - 3.4259  | 0.251  |
| team abbreviation home<br>[MIN] | -3.0531 | -5.2180 - -0.8881 | 0.006  |
| team abbreviation home<br>[NOP] | -1.6363 | -3.7944 - 0.5219  | 0.137  |
| team abbreviation home<br>[NYK] | -5.2931 | -7.4564 - -3.1299 | <0.001 |
| team abbreviation home<br>[OKC] | 0.3856  | -1.7708 - 2.5420  | 0.726  |
| team abbreviation home<br>[ORL] | -5.3964 | -7.5562 - -3.2366 | <0.001 |
| team abbreviation home<br>[PHI] | -2.8633 | -5.0231 - -0.7035 | 0.009  |
| team abbreviation home<br>[PHX] | -0.9075 | -3.0606 - 1.2455  | 0.409  |
| team abbreviation home<br>[POR] | 1.1593  | -0.9988 - 3.3175  | 0.292  |

|                                 |               |                   |        |
|---------------------------------|---------------|-------------------|--------|
| team abbreviation home<br>[SAC] | -4.2860       | -6.4458 - -2.1262 | <0.001 |
| team abbreviation home<br>[SAS] | 3.2943        | 1.1328 - 5.4558   | 0.003  |
| team abbreviation home<br>[TOR] | 2.9361        | 0.7780 - 5.0942   | 0.008  |
| team abbreviation home<br>[UTA] | 2.9916        | 0.8318 - 5.1514   | 0.007  |
| team abbreviation home<br>[WAS] | -0.7369       | -2.8950 - 1.4212  | 0.503  |
| Observations                    | 9519          |                   |        |
| R2 / R2 adjusted                | 0.037 / 0.034 |                   |        |

|     |     |
|-----|-----|
| BKN | NYK |
| CHI | ORL |
| DET | PHI |
| GSW | SAC |
| LAC | SAS |
| LAL | TOR |
| MIN | UTA |

(表格中為參數具顯著性之隊伍代號)

模型二:

| <i>Predictors</i>               | <i>Estimates</i> | <i>CI</i>         | <i>p</i> |
|---------------------------------|------------------|-------------------|----------|
| (Intercept)                     | 0.6076           | 0.5537 - 0.6615   | <0.001   |
| team abbreviation home<br>[BKN] | -0.0887          | -0.1648 - -0.0127 | 0.022    |
| team abbreviation home<br>[BOS] | 0.0150           | -0.0610 - 0.0911  | 0.698    |
| team abbreviation home<br>[CHA] | -0.0613          | -0.1376 - 0.0151  | 0.116    |
| team abbreviation home<br>[CHI] | -0.0696          | -0.1458 - 0.0065  | 0.073    |
| team abbreviation home<br>[CLE] | -0.0541          | -0.1302 - 0.0219  | 0.163    |
| team abbreviation home<br>[DAL] | -0.0107          | -0.0867 - 0.0652  | 0.782    |
| team abbreviation home<br>[DEN] | -0.0151          | -0.0911 - 0.0609  | 0.697    |

|                                 |         |                   |        |
|---------------------------------|---------|-------------------|--------|
| team abbreviation home<br>[DET] | -0.1378 | -0.2140 – -0.0615 | <0.001 |
| team abbreviation home<br>[GSW] | 0.1361  | 0.0599 – 0.2122   | <0.001 |
| team abbreviation home<br>[HOU] | -0.0070 | -0.0830 – 0.0691  | 0.858  |
| team abbreviation home<br>[IND] | 0.0088  | -0.0673 – 0.0848  | 0.821  |
| team abbreviation home<br>[LAC] | 0.1031  | 0.0270 – 0.1791   | 0.008  |
| team abbreviation home<br>[LAL] | -0.1533 | -0.2294 – -0.0772 | <0.001 |
| team abbreviation home<br>[MEM] | 0.0100  | -0.0660 – 0.0859  | 0.797  |
| team abbreviation home<br>[MIA] | 0.0245  | -0.0516 – 0.1005  | 0.528  |
| team abbreviation home<br>[MIL] | 0.0075  | -0.0686 – 0.0837  | 0.846  |
| team abbreviation home<br>[MIN] | -0.1649 | -0.2412 – -0.0886 | <0.001 |
| team abbreviation home<br>[NOP] | -0.0950 | -0.1711 – -0.0190 | 0.014  |
| team abbreviation home<br>[NYK] | -0.2012 | -0.2775 – -0.1250 | <0.001 |

|                                 |               |                   |        |
|---------------------------------|---------------|-------------------|--------|
| team abbreviation home<br>[OKC] | 0.0037        | -0.0723 – 0.0797  | 0.924  |
| team abbreviation home<br>[ORL] | -0.1754       | -0.2515 – -0.0993 | <0.001 |
| team abbreviation home<br>[PHI] | -0.0997       | -0.1758 – -0.0236 | 0.010  |
| team abbreviation home<br>[PHX] | -0.0936       | -0.1694 – -0.0177 | 0.016  |
| team abbreviation home<br>[POR] | 0.0402        | -0.0358 – 0.1163  | 0.300  |
| team abbreviation home<br>[SAC] | -0.1596       | -0.2358 – -0.0835 | <0.001 |
| team abbreviation home<br>[SAS] | 0.0791        | 0.0029 – 0.1553   | 0.042  |
| team abbreviation home<br>[TOR] | 0.0559        | -0.0201 – 0.1320  | 0.149  |
| team abbreviation home<br>[UTA] | 0.0296        | -0.0465 – 0.1057  | 0.445  |
| team abbreviation home<br>[WAS] | -0.0384       | -0.1145 – 0.0376  | 0.322  |
| Observations                    | 9519          |                   |        |
| R2 / R2 adjusted                | 0.029 / 0.026 |                   |        |

|     |     |
|-----|-----|
| BKN | NYK |
|-----|-----|

|     |     |
|-----|-----|
| DET | ORL |
| GSW | PHI |
| LAC | PHX |
| LAL | SAC |
| MIN | SAS |
| NOP | -   |

(表格中為參數具顯著性之隊伍代號)

模型三:

|                   |                  |           |          |
|-------------------|------------------|-----------|----------|
| <i>Predictors</i> | <i>Estimates</i> | <i>CI</i> | <i>p</i> |
|-------------------|------------------|-----------|----------|

|                                 |         |                   |        |
|---------------------------------|---------|-------------------|--------|
| (Intercept)                     | 1.0053  | -0.6540 – 2.6647  | 0.235  |
| team abbreviation home<br>[BKN] | -2.8843 | -5.0398 – -0.7289 | 0.009  |
| team abbreviation home<br>[BOS] | 1.3234  | -0.8332 – 3.4800  | 0.229  |
| team abbreviation home<br>[CHA] | -1.2463 | -3.4104 – 0.9177  | 0.259  |
| team abbreviation home<br>[CHI] | -2.6704 | -4.8377 – -0.5031 | 0.016  |
| team abbreviation home<br>[CLE] | -1.7611 | -3.9198 – 0.3977  | 0.110  |
| team abbreviation home<br>[DAL] | 0.1768  | -1.9808 – 2.3343  | 0.872  |
| team abbreviation home<br>[DEN] | 0.4868  | -1.6669 – 2.6405  | 0.658  |
| team abbreviation home<br>[DET] | -2.6162 | -4.7768 – -0.4557 | 0.018  |
| team abbreviation home<br>[GSW] | 5.6884  | 3.5274 – 7.8493   | <0.001 |
| team abbreviation home<br>[HOU] | 0.1543  | -2.0016 – 2.3102  | 0.888  |
| team abbreviation home<br>[IND] | 1.4147  | -0.7407 – 3.5700  | 0.198  |

|                                 |         |                   |        |
|---------------------------------|---------|-------------------|--------|
| team abbreviation home<br>[LAC] | 4.1890  | 2.0319 – 6.3461   | <0.001 |
| team abbreviation home<br>[LAL] | -4.0046 | -6.1641 – -1.8450 | <0.001 |
| team abbreviation home<br>[MEM] | 0.1463  | -2.0074 – 2.3001  | 0.894  |
| team abbreviation home<br>[MIA] | 0.8019  | -1.3569 – 2.9606  | 0.467  |
| team abbreviation home<br>[MIL] | 1.3079  | -0.8492 – 3.4651  | 0.235  |
| team abbreviation home<br>[MIN] | -2.9006 | -5.0636 – -0.7376 | 0.009  |
| team abbreviation home<br>[NOP] | -1.6357 | -3.7911 – 0.5197  | 0.137  |
| team abbreviation home<br>[NYK] | -5.6116 | -7.7757 – -3.4475 | <0.001 |
| team abbreviation home<br>[OKC] | 0.3066  | -1.8474 – 2.4605  | 0.780  |
| team abbreviation home<br>[ORL] | -5.4737 | -7.6310 – -3.3164 | <0.001 |
| team abbreviation home<br>[PHI] | -2.9176 | -5.0748 – -0.7604 | 0.008  |
| team abbreviation home<br>[PHX] | -0.9046 | -3.0550 – 1.2458  | 0.410  |



|                                 |               |                   |        |
|---------------------------------|---------------|-------------------|--------|
| team abbreviation home<br>[POR] | 0.9435        | -1.2136 - 3.1005  | 0.391  |
| team abbreviation home<br>[SAC] | -4.2867       | -6.4437 - -2.1296 | <0.001 |
| team abbreviation home<br>[SAS] | 3.1561        | 0.9966 - 5.3155   | 0.004  |
| team abbreviation home<br>[TOR] | 2.7532        | 0.5966 - 4.9097   | 0.012  |
| team abbreviation home<br>[UTA] | 2.7376        | 0.5782 - 4.8970   | 0.013  |
| team abbreviation home<br>[WAS] | -0.7745       | -2.9299 - 1.3810  | 0.481  |
| attendance                      | 0.0001        | 0.0001 - 0.0002   | <0.001 |
| Observations                    | 9519          |                   |        |
| R2 / R2 adjusted                | 0.040 / 0.037 |                   |        |

|     |     |
|-----|-----|
| BKN | NYK |
| CHI | ORL |
| DET | PHI |
| GSW | SAC |
| LAC | SAS |
| LAL | TOR |
| MIN | UTA |

(表格中為參數具顯著性之隊伍代號)

模型四:

| <i>Predictors</i>               | <i>Estimates</i> | <i>CI</i>         | <i>p</i> |
|---------------------------------|------------------|-------------------|----------|
| (Intercept)                     | 0.5824           | 0.5221 – 0.6426   | <0.001   |
| team abbreviation home<br>[BKN] | -0.0848          | -0.1608 – -0.0088 | 0.029    |
| team abbreviation home<br>[BOS] | 0.0164           | -0.0598 – 0.0926  | 0.673    |
| team abbreviation home<br>[CHA] | -0.0623          | -0.1386 – 0.0140  | 0.109    |
| team abbreviation home<br>[CHI] | -0.0836          | -0.1600 – -0.0072 | 0.032    |

|                                 |         |                   |        |
|---------------------------------|---------|-------------------|--------|
| team abbreviation home<br>[CLE] | -0.0629 | -0.1390 – 0.0132  | 0.105  |
| team abbreviation home<br>[DAL] | -0.0195 | -0.0955 – 0.0566  | 0.616  |
| team abbreviation home<br>[DEN] | -0.0112 | -0.0872 – 0.0648  | 0.772  |
| team abbreviation home<br>[DET] | -0.1378 | -0.2139 – -0.0616 | <0.001 |
| team abbreviation home<br>[GSW] | 0.1432  | 0.0662 – 0.2202   | <0.001 |
| team abbreviation home<br>[HOU] | -0.0076 | -0.0836 – 0.0684  | 0.845  |
| team abbreviation home<br>[IND] | 0.0070  | -0.0690 – 0.0830  | 0.857  |
| team abbreviation home<br>[LAC] | 0.1084  | 0.0318 – 0.1849   | 0.006  |
| team abbreviation home<br>[LAL] | -0.1489 | -0.2256 – -0.0722 | <0.001 |
| team abbreviation home<br>[MEM] | 0.0111  | -0.0648 – 0.0870  | 0.774  |
| team abbreviation home<br>[MIA] | 0.0267  | -0.0498 – 0.1033  | 0.494  |
| team abbreviation home<br>[MIL] | 0.0077  | -0.0683 – 0.0838  | 0.842  |

|                                 |         |                   |        |
|---------------------------------|---------|-------------------|--------|
| team abbreviation home<br>[MIN] | -0.1513 | -0.2280 – -0.0746 | <0.001 |
| team abbreviation home<br>[NOP] | -0.0924 | -0.1684 – -0.0164 | 0.017  |
| team abbreviation home<br>[NYK] | -0.2066 | -0.2830 – -0.1303 | <0.001 |
| team abbreviation home<br>[OKC] | 0.0022  | -0.0737 – 0.0781  | 0.954  |
| team abbreviation home<br>[ORL] | -0.1731 | -0.2493 – -0.0970 | <0.001 |
| team abbreviation home<br>[PHI] | -0.0990 | -0.1750 – -0.0229 | 0.011  |
| team abbreviation home<br>[PHX] | -0.0863 | -0.1624 – -0.0103 | 0.026  |
| team abbreviation home<br>[POR] | 0.0499  | -0.0272 – 0.1270  | 0.205  |
| team abbreviation home<br>[SAC] | -0.1566 | -0.2327 – -0.0805 | <0.001 |
| team abbreviation home<br>[SAS] | 0.0879  | 0.0111 – 0.1647   | 0.025  |
| team abbreviation home<br>[TOR] | 0.0558  | -0.0203 – 0.1319  | 0.151  |
| team abbreviation home<br>[UTA] | 0.0296  | -0.0467 – 0.1059  | 0.447  |

|                                 |               |                   |        |
|---------------------------------|---------------|-------------------|--------|
| team abbreviation home<br>[WAS] | -0.0384       | -0.1144 - 0.0376  | 0.322  |
| attendance                      | 0.0000        | 0.0000 - 0.0000   | <0.001 |
| distance                        | -0.0000       | -0.0000 - -0.0000 | 0.019  |
| Observations                    | 9519          |                   |        |
| R2 / R2 adjusted                | 0.031 / 0.028 |                   |        |

|     |     |
|-----|-----|
| BKN | NOP |
| CHI | NYK |
| DET | ORL |
| GSW | PHI |
| LAC | PHX |
| LAL | SAC |
| MIN | SAS |

(表格中為參數具顯著性之隊伍代號)

模型五:

| <i>Predictors</i>               | <i>Estimates</i> | <i>CI</i>         | <i>p</i> |
|---------------------------------|------------------|-------------------|----------|
| (Intercept)                     | 3.1886           | 2.2532 - 4.1240   | <0.001   |
| team abbreviation home<br>[BKN] | -2.0586          | -3.1243 - -0.9929 | <0.001   |
| team abbreviation home<br>[BOS] | 1.0774           | 0.0099 - 2.1449   | 0.048    |
| team abbreviation home<br>[CHA] | 0.5021           | -0.5688 - 1.5729  | 0.358    |
| team abbreviation home<br>[CHI] | -0.5929          | -1.6670 - 0.4811  | 0.279    |
| team abbreviation home<br>[CLE] | 0.0957           | -0.9742 - 1.1657  | 0.861    |
| team abbreviation home<br>[DAL] | 2.1749           | 1.1079 - 3.2418   | <0.001   |
| team abbreviation home<br>[DEN] | 0.1045           | -0.9629 - 1.1720  | 0.848    |
| team abbreviation home<br>[DET] | 1.4041           | 0.3318 - 2.4765   | 0.010    |

|                                 |         |                   |        |
|---------------------------------|---------|-------------------|--------|
| team abbreviation home<br>[GSW] | 0.5360  | -0.5361 - 1.6081  | 0.327  |
| team abbreviation home<br>[HOU] | 3.0664  | 1.9982 - 4.1347   | <0.001 |
| team abbreviation home<br>[IND] | -0.1873 | -1.2536 - 0.8790  | 0.731  |
| team abbreviation home<br>[LAC] | 1.6964  | 0.6288 - 2.7640   | 0.002  |
| team abbreviation home<br>[LAL] | -0.2259 | -1.2958 - 0.8441  | 0.679  |
| team abbreviation home<br>[MEM] | -0.0841 | -1.1497 - 0.9816  | 0.877  |
| team abbreviation home<br>[MIA] | -0.6187 | -1.6865 - 0.4491  | 0.256  |
| team abbreviation home<br>[MIL] | -0.2917 | -1.3595 - 0.7762  | 0.592  |
| team abbreviation home<br>[MIN] | -0.5309 | -1.6024 - 0.5405  | 0.331  |
| team abbreviation home<br>[NOP] | -0.8379 | -1.9049 - 0.2291  | 0.124  |
| team abbreviation home<br>[NYK] | -1.0780 | -2.1518 - -0.0041 | 0.049  |
| team abbreviation home<br>[OKC] | -0.0370 | -1.1050 - 1.0309  | 0.946  |

|                                 |          |                     |        |
|---------------------------------|----------|---------------------|--------|
| team abbreviation home<br>[ORL] | -1.5573  | -2.6254 - -0.4891   | 0.004  |
| team abbreviation home<br>[PHI] | -0.5854  | -1.6528 - 0.4821    | 0.282  |
| team abbreviation home<br>[PHX] | -0.0573  | -1.1219 - 1.0073    | 0.916  |
| team abbreviation home<br>[POR] | 1.5435   | 0.4751 - 2.6119     | 0.005  |
| team abbreviation home<br>[SAC] | -1.4560  | -2.5240 - -0.3880   | 0.008  |
| team abbreviation home<br>[SAS] | -0.1428  | -1.2113 - 0.9257    | 0.793  |
| team abbreviation home<br>[TOR] | 3.0483   | 1.9798 - 4.1167     | <0.001 |
| team abbreviation home<br>[UTA] | 0.3390   | -0.7319 - 1.4100    | 0.535  |
| team abbreviation home<br>[WAS] | -0.7311  | -1.7969 - 0.3348    | 0.179  |
| fg pct                          | 103.0645 | 100.7251 - 105.4038 | <0.001 |
| ft pct                          | 15.3789  | 14.4081 - 16.3497   | <0.001 |
| ast                             | 0.5461   | 0.5197 - 0.5726     | <0.001 |
| reb                             | 0.3043   | 0.2878 - 0.3208     | <0.001 |



|                  |               |                   |        |
|------------------|---------------|-------------------|--------|
| op away win      | -7.8501       | -8.8720 - -6.8281 | <0.001 |
| fta              | 0.2112        | 0.1705 - 0.2518   | <0.001 |
| attendance       | 0.0000        | -0.0000 - 0.0000  | 0.274  |
| fta × attendance | 0.0000        | 0.0000 - 0.0000   | 0.034  |
| Observations     | 9519          |                   |        |
| R2 / R2 adjusted | 0.766 / 0.765 |                   |        |

|     |     |
|-----|-----|
| BKN | NYK |
| BOS | ORL |
| DAL | POR |
| DET | SAC |
| HOU | TOR |
| LAC | -   |

(表格中為參數具顯著性之隊伍代號)

模型六:

| <i>Predictors</i> | <i>Estimates</i> | <i>CI</i>       | <i>p</i> |
|-------------------|------------------|-----------------|----------|
| (Intercept)       | 0.6836           | 0.6408 - 0.7263 | <0.001   |

|                                 |         |                   |       |
|---------------------------------|---------|-------------------|-------|
| team abbreviation home<br>[BKN] | -0.0644 | -0.1165 - -0.0122 | 0.016 |
| team abbreviation home<br>[BOS] | 0.0219  | -0.0303 - 0.0741  | 0.411 |
| team abbreviation home<br>[CHA] | -0.0246 | -0.0770 - 0.0278  | 0.358 |
| team abbreviation home<br>[CHI] | -0.0152 | -0.0675 - 0.0371  | 0.569 |
| team abbreviation home<br>[CLE] | -0.0129 | -0.0651 - 0.0394  | 0.630 |
| team abbreviation home<br>[DAL] | 0.0363  | -0.0158 - 0.0884  | 0.172 |
| team abbreviation home<br>[DEN] | -0.0095 | -0.0617 - 0.0427  | 0.721 |
| team abbreviation home<br>[DET] | -0.0197 | -0.0722 - 0.0328  | 0.462 |
| team abbreviation home<br>[GSW] | 0.0085  | -0.0439 - 0.0609  | 0.751 |
| team abbreviation home<br>[HOU] | 0.0534  | 0.0011 - 0.1057   | 0.045 |
| team abbreviation home<br>[IND] | -0.0297 | -0.0819 - 0.0225  | 0.264 |
| team abbreviation home<br>[LAC] | 0.0209  | -0.0313 - 0.0731  | 0.433 |

|                                 |         |                   |        |
|---------------------------------|---------|-------------------|--------|
| team abbreviation home<br>[LAL] | -0.0519 | -0.1042 - 0.0004  | 0.052  |
| team abbreviation home<br>[MEM] | 0.0160  | -0.0362 - 0.0681  | 0.548  |
| team abbreviation home<br>[MIA] | -0.0254 | -0.0775 - 0.0268  | 0.341  |
| team abbreviation home<br>[MIL] | -0.0391 | -0.0914 - 0.0132  | 0.142  |
| team abbreviation home<br>[MIN] | -0.0997 | -0.1522 - -0.0473 | <0.001 |
| team abbreviation home<br>[NOP] | -0.0666 | -0.1188 - -0.0144 | 0.012  |
| team abbreviation home<br>[NYK] | -0.0657 | -0.1182 - -0.0133 | 0.014  |
| team abbreviation home<br>[OKC] | -0.0076 | -0.0599 - 0.0446  | 0.775  |
| team abbreviation home<br>[ORL] | -0.0545 | -0.1067 - -0.0022 | 0.041  |
| team abbreviation home<br>[PHI] | -0.0259 | -0.0782 - 0.0263  | 0.331  |
| team abbreviation home<br>[PHX] | -0.0478 | -0.0999 - 0.0043  | 0.072  |
| team abbreviation home<br>[POR] | 0.0623  | 0.0101 - 0.1146   | 0.019  |

|                                 |               |                   |        |
|---------------------------------|---------------|-------------------|--------|
| team abbreviation home<br>[SAC] | -0.0799       | -0.1322 - -0.0277 | 0.003  |
| team abbreviation home<br>[SAS] | -0.0173       | -0.0696 - 0.0350  | 0.517  |
| team abbreviation home<br>[TOR] | 0.0545        | 0.0023 - 0.1068   | 0.041  |
| team abbreviation home<br>[UTA] | -0.0455       | -0.0979 - 0.0069  | 0.089  |
| team abbreviation home<br>[WAS] | -0.0286       | -0.0807 - 0.0236  | 0.283  |
| fg pct                          | 3.1339        | 3.0194 - 3.2484   | <0.001 |
| ft pct                          | 0.4791        | 0.4316 - 0.5266   | <0.001 |
| ast                             | 0.0133        | 0.0120 - 0.0146   | <0.001 |
| reb                             | 0.0070        | 0.0062 - 0.0078   | <0.001 |
| op away win                     | -0.3706       | -0.4206 - -0.3206 | <0.001 |
| fta                             | 0.0128        | 0.0120 - 0.0136   | <0.001 |
| Observations                    | 9519          |                   |        |
| R2 / R2 adjusted                | 0.544 / 0.542 |                   |        |

|     |     |
|-----|-----|
| BKN | ORL |
| HOU | POR |

|     |     |
|-----|-----|
| MIN | SAC |
| NOP | TOR |
| NYK | -   |

(表格中為參數具顯著性之隊伍代號)

系列二:

模型七:

| <i>Predictors</i>        | <i>Estimates</i> | <i>CI</i>           | <i>p</i> |
|--------------------------|------------------|---------------------|----------|
| ave fg pct               | 137.3240         | 117.5961 – 157.0520 | <0.001   |
| ave ft pct               | 17.5840          | 9.6050 – 25.5631    | <0.001   |
| ave ast                  | 0.3495           | 0.1527 – 0.5463     | 0.001    |
| ave reb                  | 0.3398           | 0.2190 – 0.4606     | <0.001   |
| ave attendance thousands | 0.0064           | -0.0492 – 0.0619    | 0.822    |

|                        |               |                   |              |
|------------------------|---------------|-------------------|--------------|
| ave distance thousands | 3.0794        | -2.4248 – 8.5836  | 0.271        |
| ave alt diff           | -0.0019       | -0.0099 – 0.0062  | 0.649        |
| ave fta                | 0.1881        | 0.0602 – 0.3160   | <b>0.004</b> |
| ave op away win        | -13.7848      | -28.2603 – 0.6907 | 0.062        |
| Observations           | 240           |                   |              |
| R2 / R2 adjusted       | 0.844 / 0.815 |                   |              |

由上表可見，在Fixed-Effect model 下，與地理相關的變數與對手球隊於客場勝率對平均得分無關。

模型八：

| <i>Predictors</i> | <i>Estimates</i> | <i>CI</i>       | <i>p</i>         |
|-------------------|------------------|-----------------|------------------|
| ave fg pct        | 4.8268           | 4.1447 – 5.5088 | <b>&lt;0.001</b> |

|                          |               |                   |        |
|--------------------------|---------------|-------------------|--------|
| ave ft pct               | 0.7878        | 0.5119 - 1.0636   | <0.001 |
| ave ast                  | 0.0071        | 0.0003 - 0.0139   | 0.041  |
| ave reb                  | 0.0066        | 0.0025 - 0.0108   | 0.002  |
| ave attendance thousands | -0.0011       | -0.0030 - 0.0008  | 0.258  |
| ave alt diff             | -0.0001       | -0.0003 - 0.0002  | 0.617  |
| ave distance thousands   | 0.0929        | -0.0974 - 0.2832  | 0.337  |
| ave fta                  | 0.0066        | 0.0022 - 0.0110   | 0.004  |
| ave op away win          | -0.7070       | -1.2075 - -0.2066 | 0.006  |
| Observations             | 240           |                   |        |
| R2 / R2 adjusted         | 0.820 / 0.785 |                   |        |

由上表可見，在Fixed-Effect model 下，與地理相關的變數對平均得分無關。

模型九:

| <i>Predictors</i>        | <i>Estimates</i> | <i>CI</i>           | <i>p</i> |
|--------------------------|------------------|---------------------|----------|
| (Intercept)              | 4.7619           | -1.8006 - 11.3244   | 0.154    |
| ave fg pct               | 137.0278         | 119.0783 - 154.9774 | <0.001   |
| ave ft pct               | 18.0984          | 10.4415 - 25.7553   | <0.001   |
| ave ast                  | 0.3404           | 0.1623 - 0.5185     | <0.001   |
| ave reb                  | 0.3280           | 0.2150 - 0.4410     | <0.001   |
| ave attendance thousands | 0.0075           | -0.0462 - 0.0612    | 0.783    |
| ave distance thousands   | 0.3174           | -0.8260 - 1.4608    | 0.585    |
| ave alt diff             | -0.0001          | -0.0007 - 0.0005    | 0.726    |
| ave fta                  | 0.2307           | 0.1137 - 0.3477     | <0.001   |
| ave op away win          | -12.6774         | -26.8027 - 1.4480   | 0.078    |
| Observations             | 240              |                     |          |
| R2 / R2 adjusted         | 0.839 / 0.833    |                     |          |

由上表可見，在Random Effect model 下，與地理相關的變數與對手球隊於客場勝率對勝率無關。除截距項外，顯著的變數均與Fixed-Effect model下相同。



模型十:

| <i>Predictors</i>        | <i>Estimates</i> | <i>CI</i>         | <i>p</i> |
|--------------------------|------------------|-------------------|----------|
| (Intercept)              | 0.8050           | 0.5813 - 1.0288   | <0.001   |
| ave fg pct               | 4.7999           | 4.1889 - 5.4109   | <0.001   |
| ave ft pct               | 0.8075           | 0.5447 - 1.0704   | <0.001   |
| ave ast                  | 0.0064           | 0.0004 - 0.0125   | 0.037    |
| ave reb                  | 0.0066           | 0.0028 - 0.0105   | 0.001    |
| ave attendance thousands | -0.0010          | -0.0028 - 0.0009  | 0.312    |
| ave alt diff             | -0.0000          | -0.0000 - 0.0000  | 0.323    |
| ave distance thousands   | -0.0027          | -0.0376 - 0.0322  | 0.880    |
| ave fta                  | 0.0081           | 0.0041 - 0.0120   | <0.001   |
| ave op away win          | -0.6691          | -1.1565 - -0.1818 | 0.007    |

|                  |               |
|------------------|---------------|
| Observations     | 240           |
| R2 / R2 adjusted | 0.817 / 0.809 |

由上表可見，在Random Effect model 下，與地理相關的變數對勝率無關。顯著的變數均與Fixed-Effect model下相同。

Hausman test:

a. 模型七與模型九:

```
Hausman Test
data: full_model1
chisq = 6.3547, df = 9, p-value = 0.704
alternative hypothesis: one model is inconsistent
```

檢定結果為拒絕H0，故應採用Random Effect model，即模型七。

b. 模型八與模型十:

```
Hausman Test
data: full_model2
chisq = 7.8623, df = 9, p-value = 0.5481
alternative hypothesis: one model is inconsistent
```

檢定結果為拒絕H0，故應採用Random Effect model，即採用模型八。

## 伍、總結

### a. 系列一:

(i) 主場優勢確實存在於部分隊伍，且根據變數種類而有所不同。

(ii) 以分差或勝率而言，除隊伍外，觀眾數、罰球數差與對手球隊之客場勝率亦產生顯著影響。觀眾數的多寡可能會影響球員的心理，使主場球員打出更好的表現，同時也帶給客場球員壓力，讓客隊打得比較不好。罰球數代表裁判的判罰更偏袒主場隊伍，而造成裁判不公的原因可能是主場群眾對於裁判的心理壓力，這是一種從眾行為的心理，也就是人們的行為會不自覺受團體的影響。

(iii) 其中對手球隊客場勝率係數於系列一中的模型均為負值，亦即在客隊較強的情況下，對主場優勢不利。

### b. 系列二:

(i) 在「平均主場優勢」模型中，地理條件的均不顯著，與LSDV模型的結論不同，而在各項地理條件中，海拔高度又比距離因素對主場優勢的影響更不顯著一些，p-value較大。

在將各主場隊伍的變數取季平均之後，比賽場地在地理條件的差異對主場優勢的貢獻變得不明顯，我們推測是由於將變數取季平均的同時，模型的自由度降低，才導致此結果，若將比賽的季度拉長，能更準確的觀察出具體地理位置在平均模型中的表現。

(ii) 就Hausman test的結果而言，應採用Random Effect model。

## 陸、參考資料

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