

# World Cup Qatar 2022 predictions: Round of 16

Leonardo Egidi, Vasilis Palaskas - Mail: legidi@units.it, vasilis.palaskas94@gmail.com

3 December 2022

## Contents

The statistical model (in brief)	1
Round of sixteen predictions (3-6 December)	2

## The statistical model (in brief)

We use a **diagonal-inflated Bivariate-Poisson model with dynamic team-specific abilities** for the attack and the defence. Let  $(X_i, Y_i)$  denote the random number of goals scored by the home and the away team in the  $i$ -th game,  $i = 1, \dots, n$ , respectively. `ranking` denotes the Coca-Cola FIFA ranking at October 6th, 2022, whereas `att` and `def` denote the attack and the defence abilities, respectively.

$$(X_i, Y_i) \sim \begin{cases} (1-p)\text{BP}(x_i, y_i | \lambda_1, \lambda_2, \lambda_3) & \text{if } x \neq y \\ (1-p)\text{BP}(x_i, y_i | \lambda_1, \lambda_2, \lambda_3) + pD(x, \eta) & \text{if } x = y, \end{cases} \quad (1)$$

$$\log(\lambda_{1i}) = \text{att}_{h_i, t} + \text{def}_{a_i, t} + \frac{\gamma}{2}(\text{ranking}_{h_i} - \text{ranking}_{a_i}) \quad (2)$$

$$\log(\lambda_{2i}) = \text{att}_{a_i, t} + \text{def}_{h_i, t} - \frac{\gamma}{2}(\text{ranking}_{h_i} - \text{ranking}_{a_i}), \quad i = 1, \dots, n \text{ (matches)}, \quad (3)$$

$$\log(\lambda_{3i}) = \rho, \quad (4)$$

$$\text{att}_{k, t} \sim \mathcal{N}(\text{att}_{k, t-1}, \sigma^2), \quad (5)$$

$$\text{def}_{k, t} \sim \mathcal{N}(\text{def}_{k, t-1}, \sigma^2), \quad (6)$$

$$\rho, \gamma \sim \mathcal{N}(0, 1) \quad (7)$$

$$p \sim \text{Uniform}(0, 1) \quad (8)$$

$$\sum_{k=1}^{n_t} \text{att}_k = 0, \quad \sum_{k=1}^{n_t} \text{def}_k = 0, \quad k = 1, \dots, n_t \text{ (teams)}, \quad t = 1, \dots, T \text{ (times)}. \quad (9)$$

Lines (1) displays the likelihood's equations (diagonal inflated bivariate Poisson); lines (2)-(4) display the log-linear models for the scoring rates  $\lambda_1, \lambda_2$  and the covariance parameter  $\lambda_3$ ; lines (5)-(6) display the dynamic prior distributions for the attack and the defence parameters, respectively; lines (7)-(8) display prior distributions for the other model parameters; line (9) displays the sum-to-zero identifiability constraints. Model fitting has been obtained through the Hamiltonian Monte Carlo sampling, 2000 iterations, 4 chains using the `footBayes` R package (with the underlying `rstan` package). The historical data used to fit the models come from *all the international matches played during the years' range 2018-2022 additionally to the group-stage matches of World Cup 2022*.

The idea is to provide a dynamic predictive scenario: at the end of each match-day, the model will be refitted to predict the remaining matches. Concerning the prediction of matches for the Round of 16 of WC 2022, our

dynamic priors for both the attacking and defensive net abilities of the competing teams are focused on their previous three matches (group stage matches of this tournament) in such a way the three previous matches contribute as a unique temporal period, and not as three distinct periods. This modification is enabled now since in the last matchday of the group stages some teams had already qualified to the next phase and they did not compete with the strongest line-up. Thus, it would be misleading for our priors to focus more on their last match performances.

## Round of sixteen predictions (3-6 December)

Posterior matches probabilities from the posterior predictive distribution of the model above are displayed in the table below. **mlo** denotes the most likely exact outcome (in parenthesis, the corresponding posterior probability). Darker regions in the plots below denote more likely outcomes: on the  $x$ -axis the favorite team goals, on the  $y$ -axis the underdog team goals.

favorite	underdog	favorite win	draw	underdog win	mlo
Netherlands	United States	0.471	0.298	0.231	1-0 (0.164)
Argentina	Australia	0.665	0.246	0.089	1-0 (0.208)
France	Poland	0.620	0.235	0.145	1-0 (0.145)
England	Senegal	0.632	0.235	0.132	1-0 (0.162)
Japan	Croatia	0.363	0.288	0.349	1-1 (0.122)
Brazil	South Korea	0.740	0.190	0.070	1-0 (0.171)
Spain	Morocco	0.562	0.270	0.168	1-0 (0.173)
Portugal	Switzerland	0.486	0.273	0.241	1-0 (0.141)

