## Mixed Effects Project Revisited - Formulas

The goal is to find the marginal effect of random-effect regressor  $Z_p\left(QB, Team, Opponent\right)$  on passing efficiency  $(EPA_{pass})$  while controlling for remaining random effects. The effects will be quantified by estimating random-effect coefficients and transforming them into parameters:  $\theta_p$ . Random-effect coefficients are "parameterized" as the relative Cholesky factors of each random effect term  $Z_p$ .  $X_p$  is any fixed-effect(s) with coefficient(s)  $\beta_p$ . Coefficients will be estimated using OLS.

## **Formulas**

**Example:** Finding marginal effect  $(\theta_1)$  on passing efficiency  $(EPA_{pass})$  when there's a change in QB  $(\Delta QB)$ ; dependent on Team and Opponent

$$\begin{split} EPA_{pass} &= \beta_{p,i}X_{p,i} + \theta_1QB_i + \theta_2Team_i + \theta_3Team_iQB_i + \\ & \theta_4Opponent_i + \theta_5Opponent_iQB_i + \in_i \\ & \frac{EPA_{pass}}{\Delta QB} = \theta_1 + \theta_3Team_i + \theta_5Opponent_i \end{split}$$

Equation: Finding  $\theta_p$  on  $EPA_{pass}$  when  $\Delta Z_p$  ; dependent on remaining random-effects.

$$\begin{split} EPA_{pass} = \beta_{p,i}X_{p,i} + \theta_1QB_i + \theta_2Team_i + \theta_3Team_iQB_i + \theta_4Opponent_i + \\ \theta_5Opponent_iQB_i + \theta_6Opponent_iTeam_i + \in_i \end{split}$$

I should be able to estimate the coefficients  $\theta_1,\theta_2,\theta_4$ 

$$\frac{EPA_{pass}}{\Delta QB} = \theta_1 + \theta_3 Team_i + \theta_5 Opponent_i$$

$$\frac{EPA_{pass}}{\Delta Team} = \theta_2 + \theta_3 QB_i + \theta_6 Opponent_i$$

$$\frac{EPA_{pass}}{\Delta Opponent} = \theta_4 + \theta_5 QB_i + \theta_6 Team_i$$

The coefficients  $\theta_1, \theta_2, \theta_4$  should be able to tell us the relative impact that QB, Team, and Opponent have on Passing Efficiency.