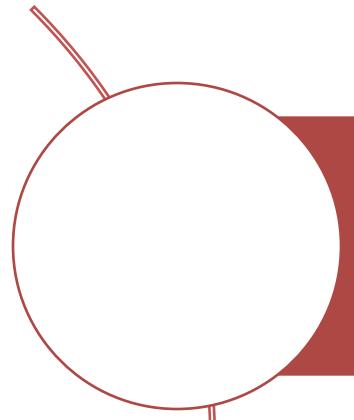
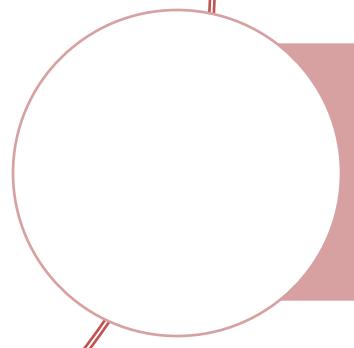


# Leveraging AI in Research... To Study Complex Relations



Interpretable Machine Learning



Multi-objective Optimization

$\Psi$

# Interpretable Machine Learning

## Criterion-Related Validity

- Weighted predictor composite validity in the holdout sample

## Permutation Feature Importance

- Estimates the importance of a FFM factor/facet in predicting performance by permuting the factor/facets

## Partial Dependence Plot

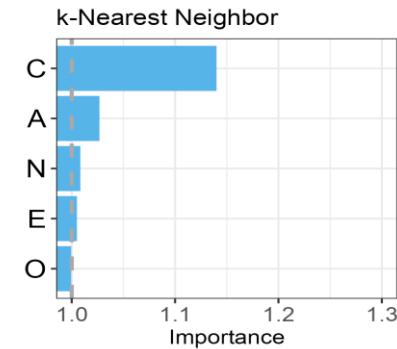
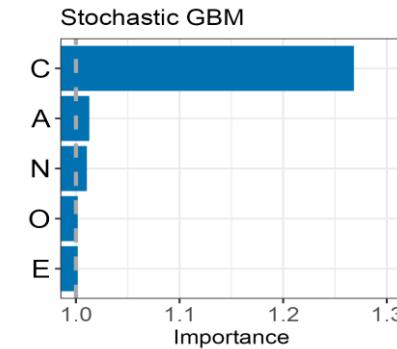
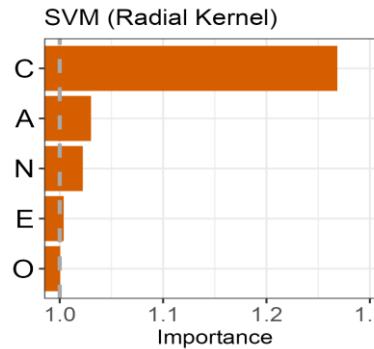
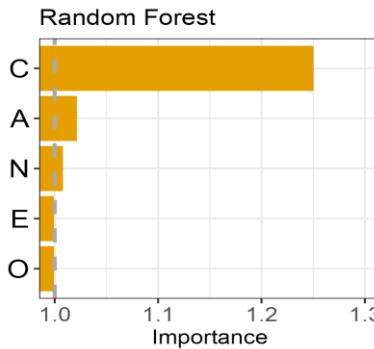
- Visualize the complex relation between each FFM factor/facet and job performance

## Interaction H-squared Statistic

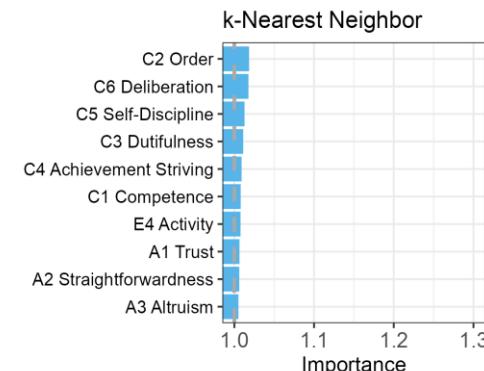
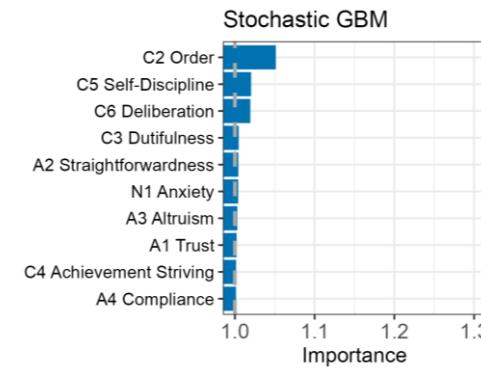
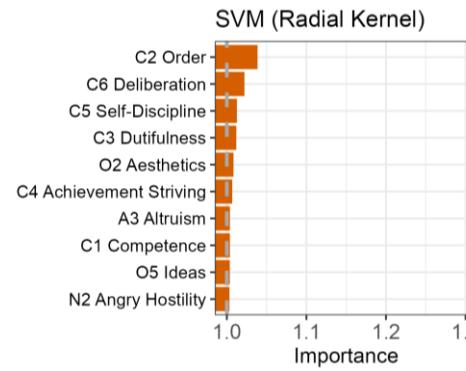
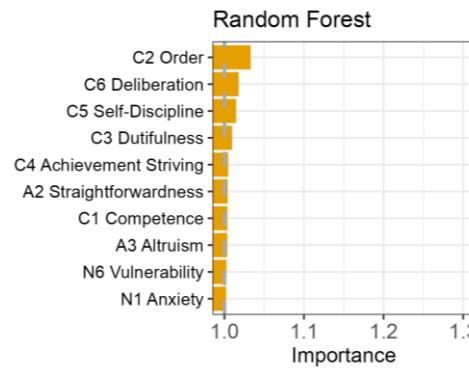
- Describe the strength of the interaction affects among the FFM factor/facets in predicting job performance

# Interpretable ML: Feature Importance

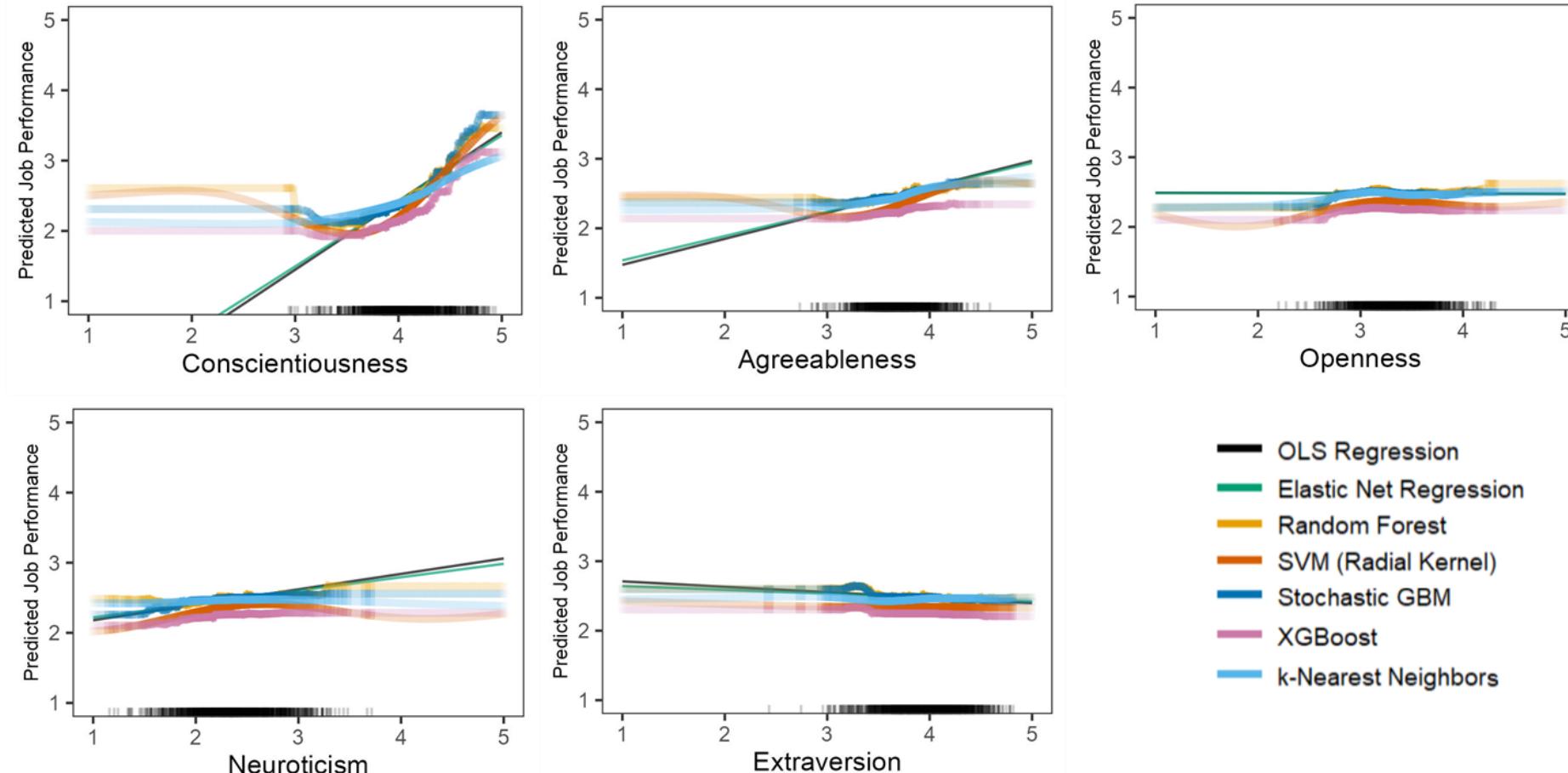
## FFM Factors



## FFM Facets



# Interpretable ML: Linear/Curvilinear Relation



# Multi-Objective Optimization

Weigh predictors to simultaneously optimize  
*multiple objectives*.

## Regression Weighting

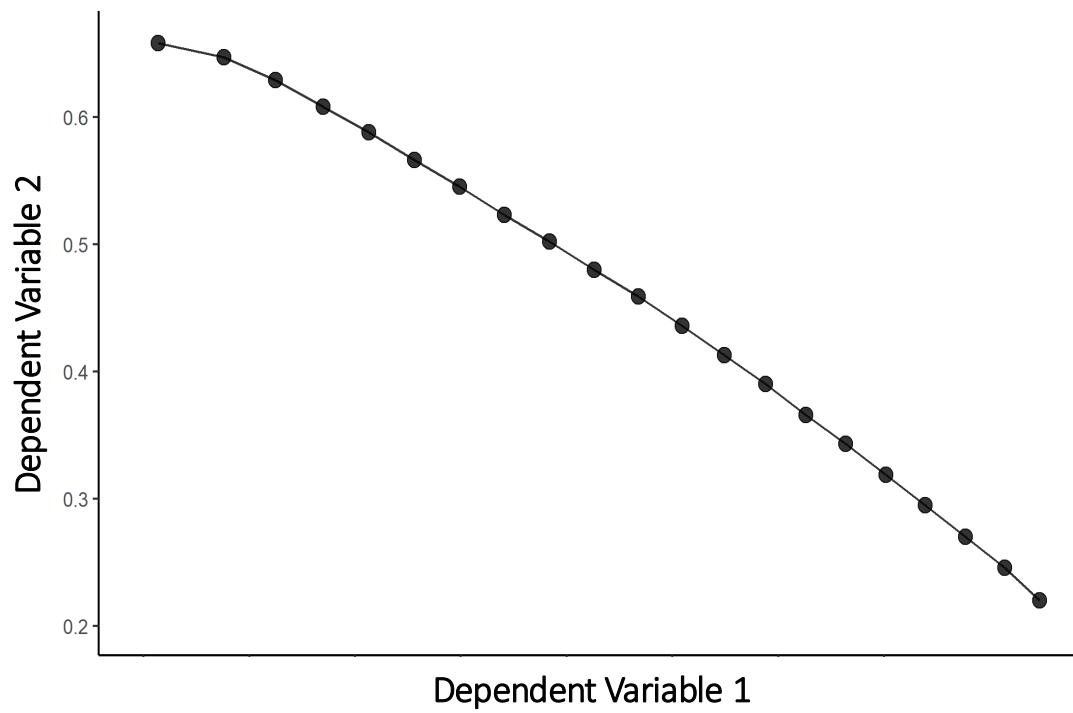
$$Y_1 \xleftarrow{\text{Optimize}} [\beta_1]^* \text{Predictor A} + [\beta_2]^* \text{Predictor B}$$

## Pareto-Optimal Weighting

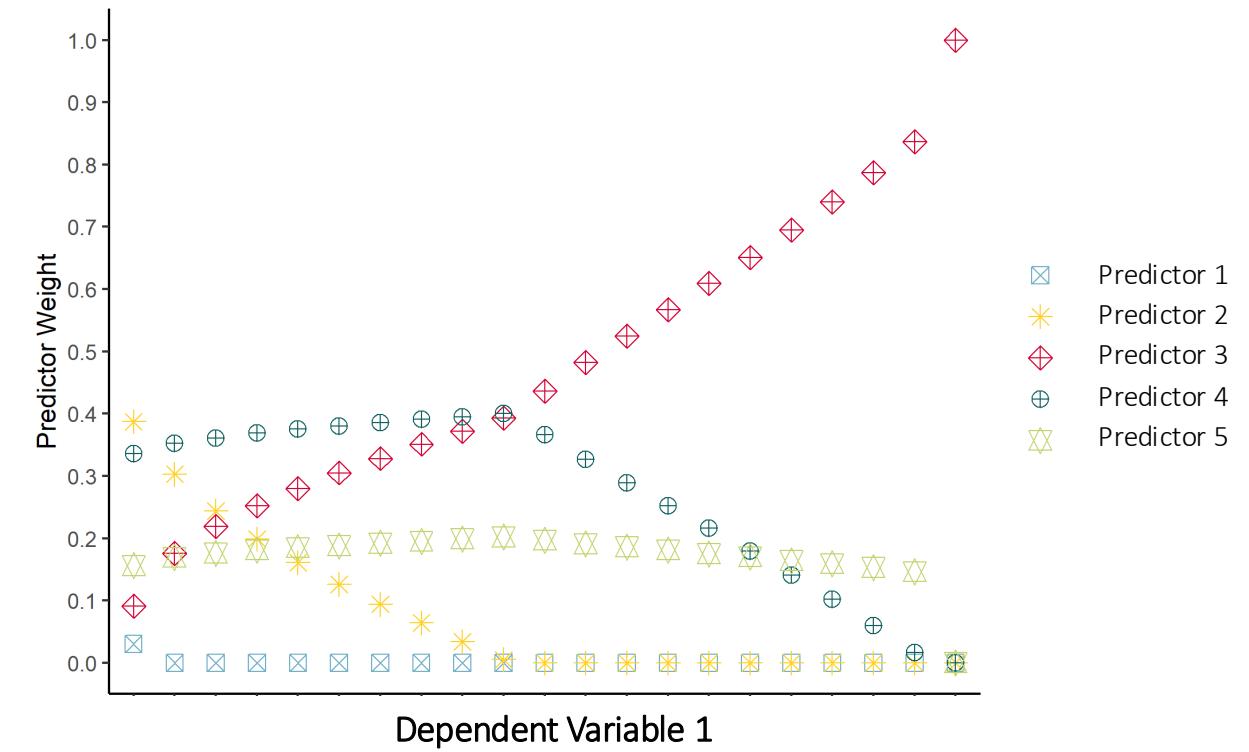
$$\begin{bmatrix} Y_1 \\ Y_2 \end{bmatrix} \xleftarrow{\text{Optimize}} [\beta_1]^* \text{Predictor A} + [\beta_2]^* \text{Predictor B}$$

# Multi-Objective Optimization

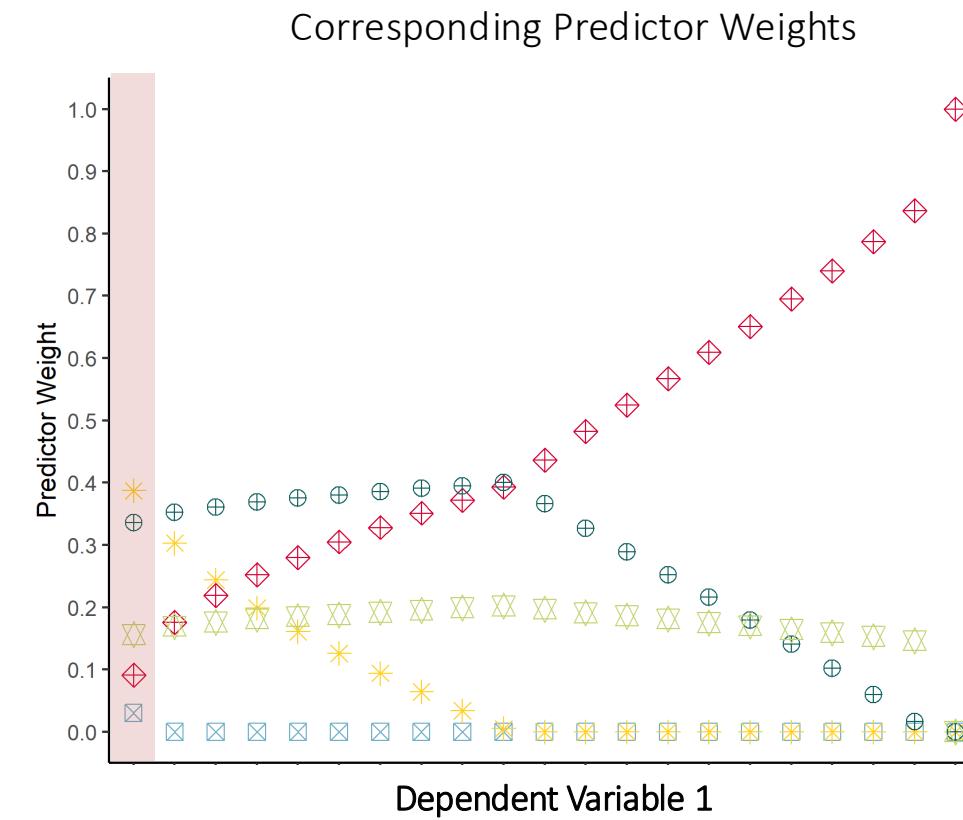
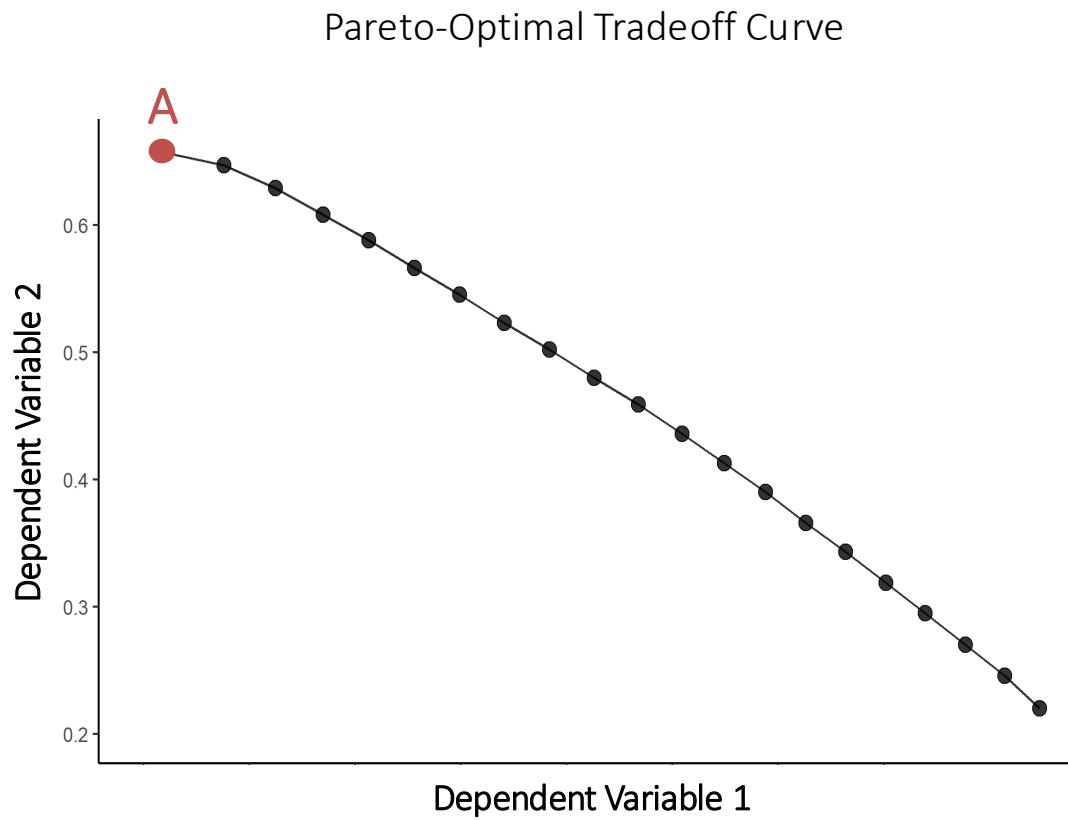
Pareto-Optimal Tradeoff Curve



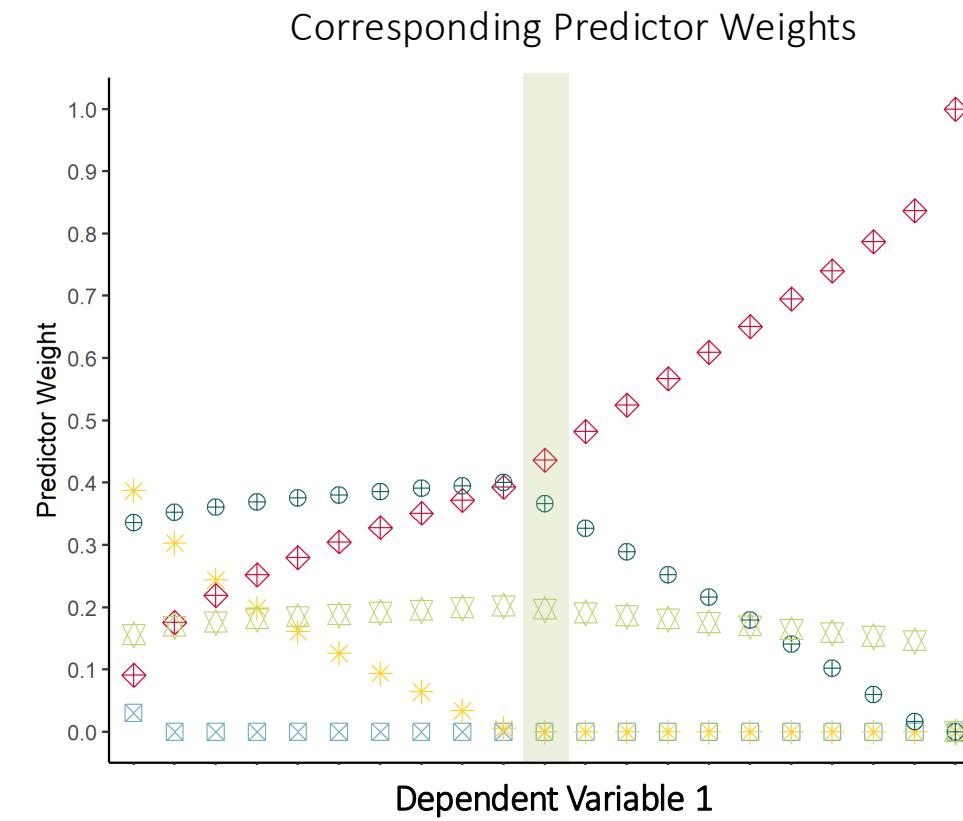
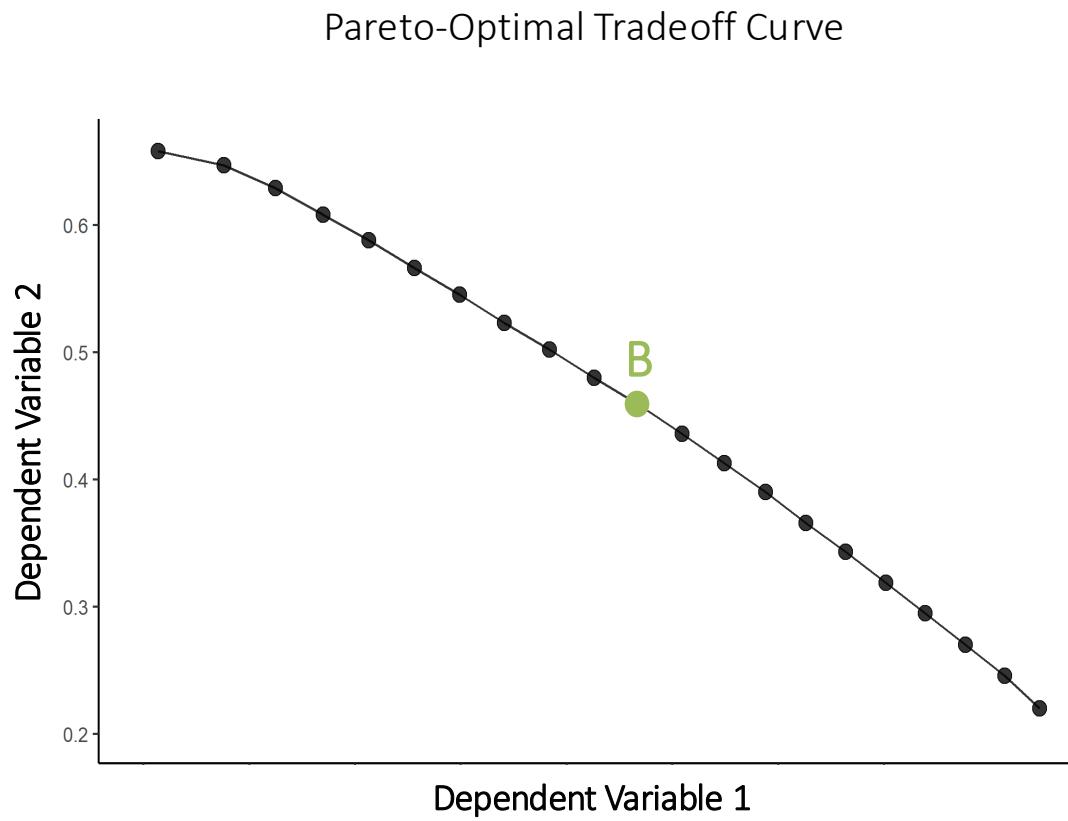
Corresponding Predictor Weights



# Multi-Objective Optimization

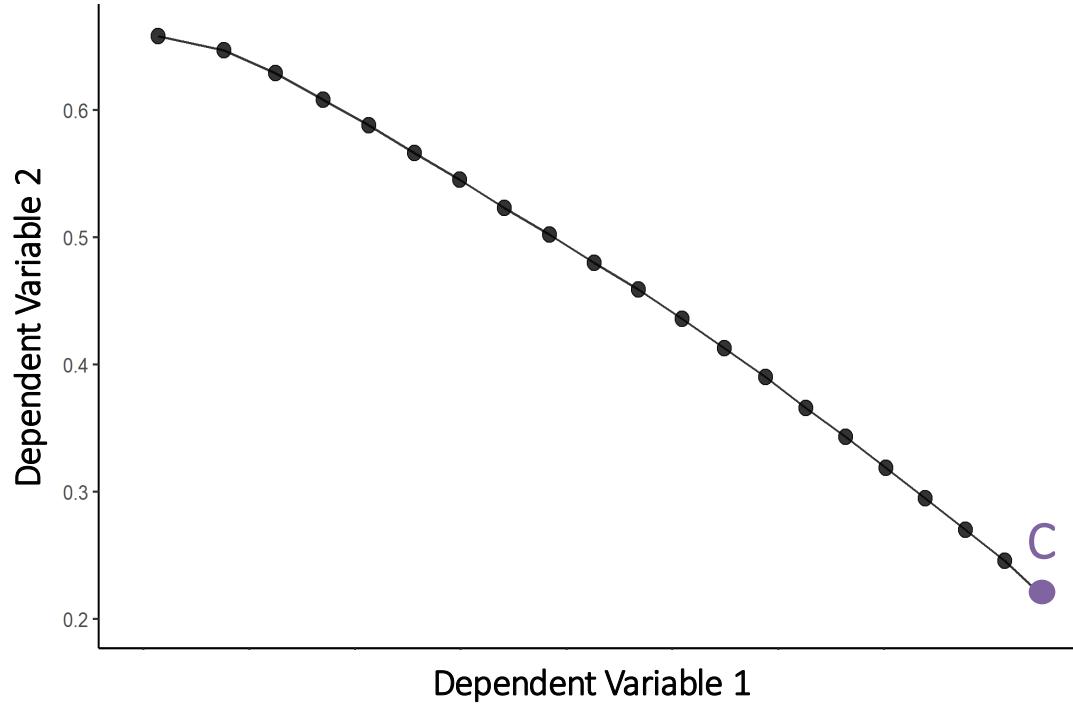


# Multi-Objective Optimization

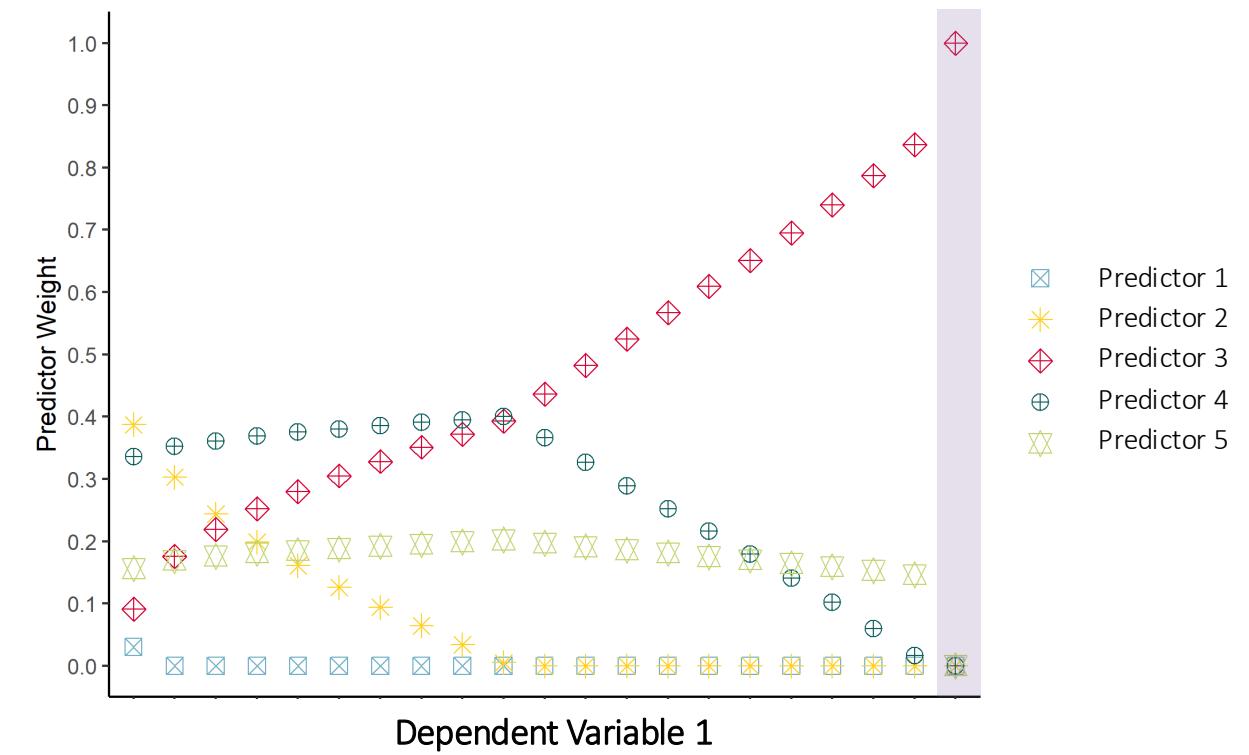


# Multi-Objective Optimization

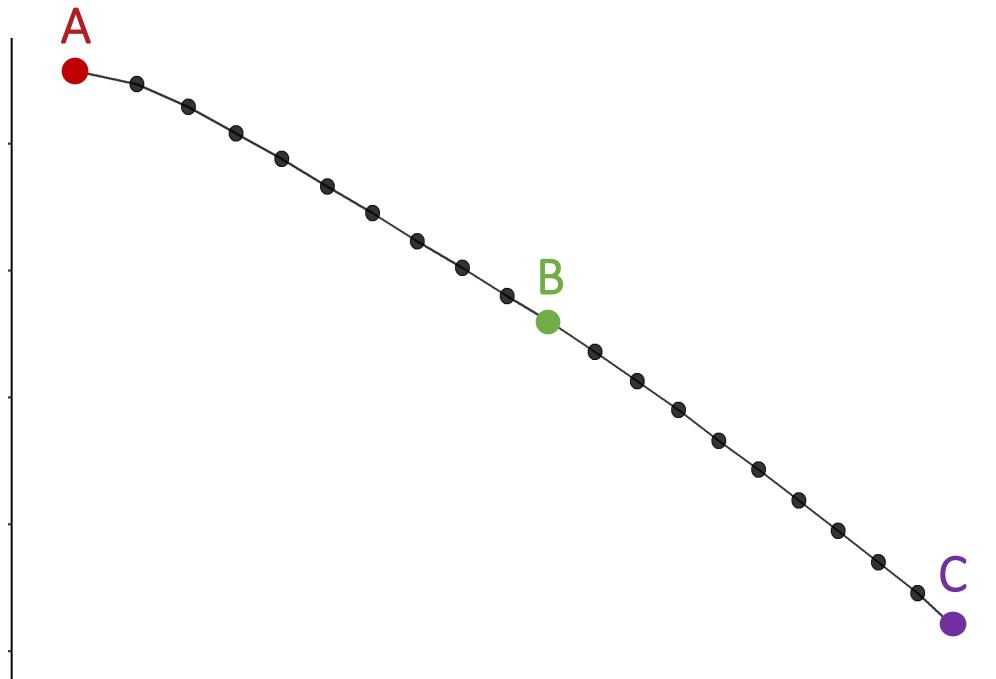
Pareto-Optimal Tradeoff Curve



Corresponding Predictor Weights

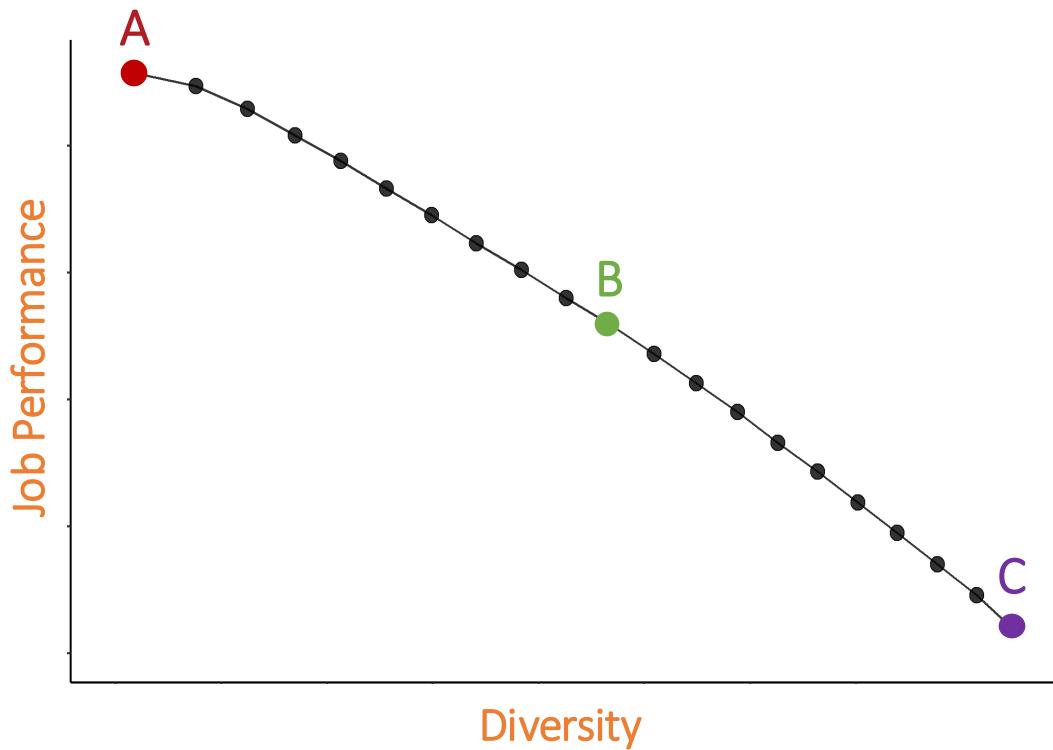


# Studying Multiple Organizational Objectives



1. Optimize multiple organizational objectives
2. Understand the relationship among organizational objectives
3. How different predictors influence multiple organizational objectives simultaneously

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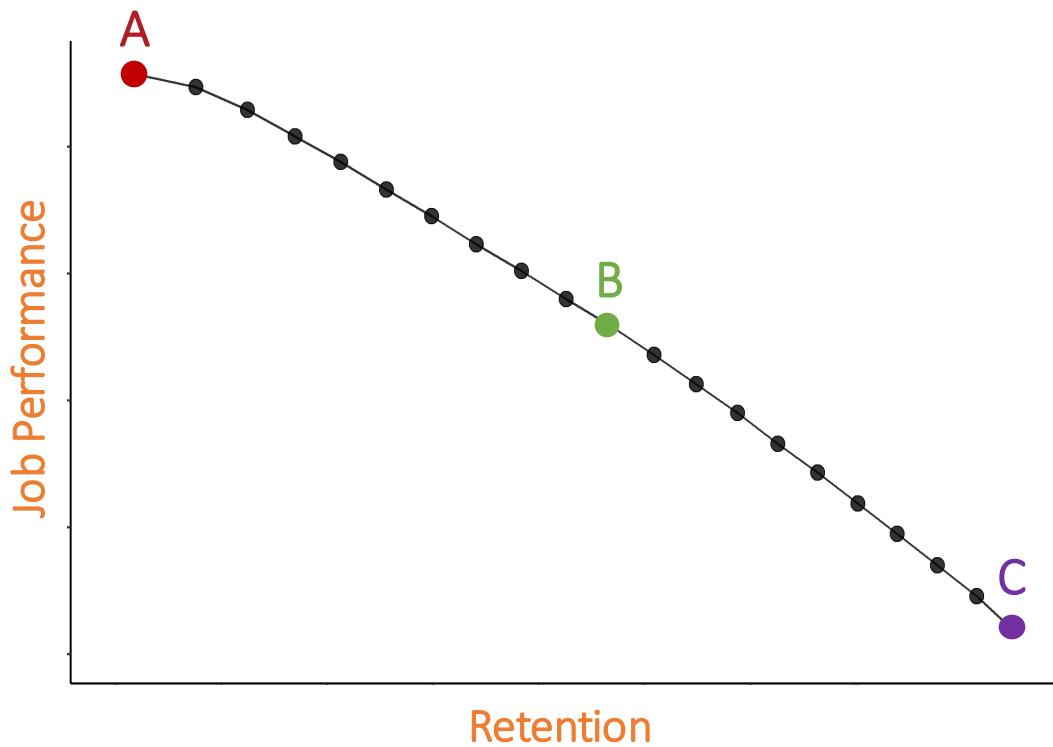
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# Studying Multiple Organizational Objectives



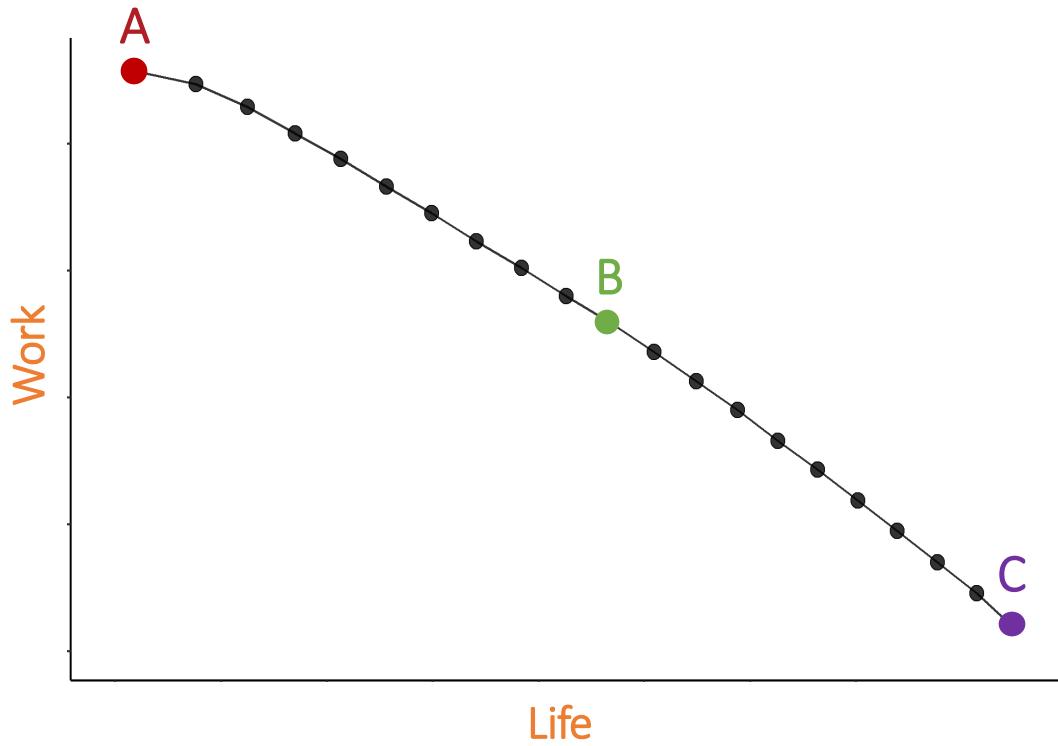
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