

Project Highlights

Objective:

Rapidly develop new, reformulated, and improved products at the minimum cost

Approach:

The key element was exploring possible formulations with materials that had not been used previously. Therefore, the inclusion of ingredient properties was critical to the success of the project

Dataset Provided:

Formulations

- ✓ Rubbers
- ✓ Oil
- ✓ Polypropylenes (PP)

Ingredient Properties

- ✓ Rubbers
- ✓ Oil
- ✓ Polypropylenes (PP)

Ingredient Costs

- ✓ Rubbers
- ✓ Oil
- ✓ Polypropylenes (PP)

Process Conditions

- ✓

Final Quality

- ✓

Results:

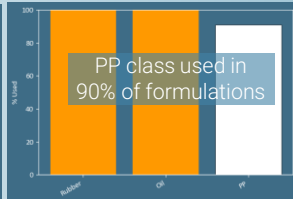
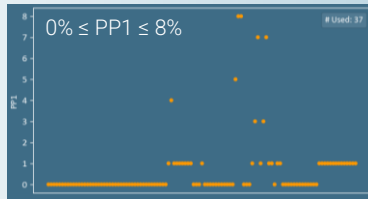
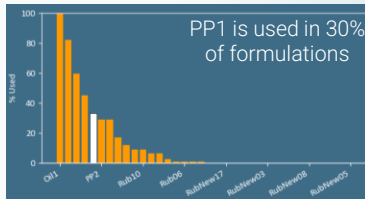
- ✓ Developed a new product (golf ball core) with specific properties using new ingredients
- ✓ Reformulated existing product at a lower cost

5% Cost Reduction

0 Data (Import and resolve data integrity issues)

- ✓ Used Excel® template to format and import data
- ✓ Specified descriptor variables, resolved data entry errors, combined duplicate variables, resolved repeated errors with replacement rules

1 Generate Ratios ($R_{\text{ingredients}}$ and R_{class})



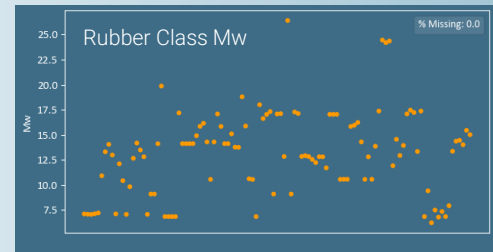
Bar plots compare frequency of ingredient use

Line plots compare variation in ingredient use

Compare formulations with Class Ratios

2 Generate Mixture Properties

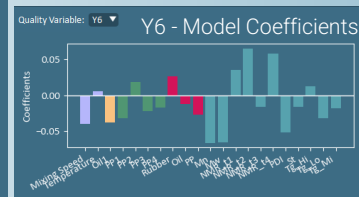
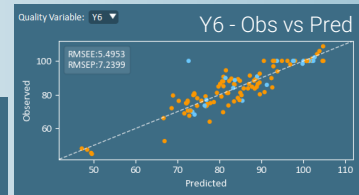
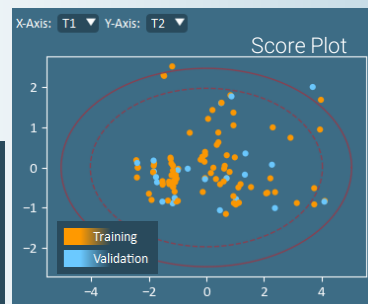
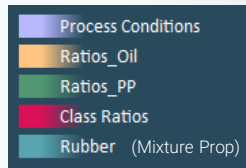
- ✓ Past formulations contain 1-5 rubbers
- ✓ Ingredient properties and ratios were combined with appropriate mixing rules to generate mixture properties for the rubber class



Mixture properties allow **new rubbers** to be considered in future formulations

3 Model Building (multivariate analysis)

- ✓ A PLS model for 7 quality variables was built with 5 PCs on the x-blocks:



4 Optimization

Once the model was built and validated, numerical optimization was applied to solve the design problem suggesting ingredients and combinations that achieve the quality targets of 7 key properties at the minimum cost.