

# The Convex Hull of Function Vectors

M. Ballerstein<sup>1</sup>, D. Michaels<sup>2</sup>, and R. Weismantel<sup>3</sup>

**Abstract:** A challenging task in designing global optimization algorithms is to construct tight convex relaxations that provide reasonably globally valid bounds on a mixed-integer nonlinear program (MINLP). For a general MINLP, convex relaxations are usually obtained by replacing each non-linearity occurring in the model description by a convex under- and a concave overestimator. The mathematical object studied to derive such estimators is given by the convex hull of the graph of a function  $f : \mathbb{R}^n \rightarrow \mathbb{R}$  restricted to a relevant domain  $D \subseteq \mathbb{R}^n$ , i. e. the convex set  $\text{conv}(\{(x, f(x)) \in \mathbb{R}^{n+1} \mid x \in D\})$ .

The separate consideration of the non-linearities ignores all interactions between different non-linearities through the convexification step. To derive improved relaxations, we investigate, for a set of functions  $f_i : D \subseteq \mathbb{R}^n \rightarrow \mathbb{R}, i \in I$ , the convex hull of the graph of the vector-valued function  $f : D \subseteq \mathbb{R}^n \rightarrow \mathbb{R}^{|I|}$  given by the function vector  $f(x) := (f_1(x), \dots, f_{|I|}(x))$ , called the convex hull of  $f$ . An important example is given by the convex hull of the function vector consisting of all quadratic monomials in a set of variables. In this work, we discuss useful properties of convex hulls of function vectors in a more general setting. In particular, we establish a link to a set of convex hulls associated with a certain family of real-valued functions. This link is used to define improved relaxations. We especially focus on some well-structured classes of function vectors of low dimension. Numerical examples are presented demonstrating the impact of this concept.

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<sup>1,2,3</sup> Eidgenössische Technische Hochschule Zürich  
Institut für Operations Research  
Rämistrasse 101, 8092 Zürich, Switzerland  
{martin.ballerstein, dennis.michaels, robert.weismantel}@ifor.math.ethz.ch