

DATA INFORMATICS AND MACHINE LEARNING TECHNIQUES TO OPTIMIZE ADDITIVE MANUFACTURING



Additive manufacturing (AM) of metallic materials is a rapidly maturing technology that has captured the attention of academia and industry alike. Building layer-by-layer, AM can produce structural parts with arbitrarily complex shapes and spatially varying composition (functionally graded materials), providing an unparalleled freedom in design. However, because AM combines materials synthesis and part production into a single step, exercising the microstructural control that is required to produce components with consistent mechanical properties has proven elusive. Relying on consistency in composition and processing conditions, the classical process-structure-properties (PSP) triangle of materials science has historically drawn connections between process conditions and microstructure, between microstructure and properties, and vicariously between process and properties. Directly relating process and properties has relied on intuition and experience developed over years of heuristic observations. But because each set of build parameters, e.g. feedstock, part geometry and build order – in short, each AM process – is unique, no two designs will experience the same processing conditions, such as thermal history, obfuscating these already opaque relationships. These highly non-equilibrium conditions vary from design-to-design, from part-to-part, and even vary within the part itself to produce highly disparate, spatially varying microstructures. A full understanding of the interplay across hierarchical microstructures is, and will continue to be, an ongoing effort, but enabling manufacturability of AM parts will require a way of connecting process to properties more directly. This presentation will discuss the ongoing efforts to build the infrastructure, characterization techniques, data informatics and machine learning tools developed in the ADAPT Advanced Characterization Center to directly identify the process-structure-property relationships for additively manufactured metals.



Dr. Branden Kappes is a Research Assistant Professor in the Mechanical Engineering Department at the Colorado School of Mines and the Operations Director for the Alliance for the Development of Additive Processing Technologies (ADAPT) Advanced Characterization Center at CSM. Dr. Kappes received his Ph.D. from the Colorado School of Mines in 2008 in Computational Materials Science. Following his Ph.D., he worked as a postdoctoral fellow in Mechanical Engineering at the Colorado School of Mines, expanding his atomistic modeling efforts in aluminum alloys to density function theory calculations of low dimensional materials. In 2011, he was awarded a National Science Foundation Postdoctoral Fellowship as part of the Cyber Infrastructure for Transformational Computing (CI-TraC) program, under which he developed materials informatics tools to identify and improve anode materials for lithium ion batteries. The general functionality of these materials informatics and machine learning tools have subsequently enabled development of flow battery electrolytes, nanoparticle catalysts, and now, metallic materials for additive manufacturing.

**Dr. Branden
Kappes**

**Colorado School
of Mines**

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