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Learning from small samples

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Learning From Small Samples

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*No good can ever come from deviating from the path that you
were destined to follow.
—Robert Greene, *Mastery**

With a heavy heart and profound respect, I dedicate this dissertation to my dear father, whose passing just a few months before the completion of my PhD journey has deeply affected me. The memory of his warm and reassuring smile is ever-present in my thoughts, providing comfort and inspiration in moments of reflection. His absence in the final stages of this academic pursuit is a profound sorrow. For six years, distance separated us, and I had always hoped he would be present to witness this milestone. His enduring love and the wisdom he shared continue to guide and inspire me. His smile, a symbol of joy and love, remains a vivid and cherished memory. As I reach this significant milestone, I do so with the image of his smiling face in my heart, hoping he is watching over me, feeling proud and fulfilled. His spirit has been a guiding light in the most challenging phases of this journey, making this accomplishment not just mine, but ours.



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