Thesis seminar - Modelling Long-term Indian Stock Market Performance using Genetic Algorithms

Ver 1.2

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With immense pride and an overwhelming sense of fulfillment, this doctoral thesis is being presented as the culmination of years of rigorous inquiry, persistent effort, and unwavering curiosity. This work is not merely a collection of research findings but a testament to a personal and intellectual journey driven by passion, resilience, and a deep-seated desire to contribute meaningfully to the field of applications of Genetic Algorithms (GA) in the area of Indian stock market for the quest of Indian stock market's long term growth momentum and its trends.

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As financial markets continue to evolve, the application of genetic algorithms in stock market prediction is likely to increase, providing new opportunities for optimizing investment strategies and improving financial decision-making.

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