AI-DRIVEN DECISION SUPPORT SYSTEM FOR GUIDING AND REVIVING FAILING STARTUPS

Y. Kanakadurga

Assistant Professor, KL Business School, KLEF, Guntur, AP, India

M. Tarunreddy

KL Business School, KLEF, Guntur, AP, India

G. Bhavanarayana

KL Business School, KLEF, Guntur, AP, India

E. Varun Sai

KL Business School, KLEF, Guntur, AP, India

D. Udhaykiran

KL Business School, KLEF, Guntur, AP, India

B. Bhanuprasad

KL Business School, KLEF, Guntur, AP, India

ABSTRACT

Innovation and economic expansion are propelled by startups. However, inadequate financial management, a lack of strategic direction, and poor decision-making cause many to fail early. This study presents an AI-powered Decision Support System (AI-DSS) designed to assist startups in analyzing and producing actionable insights from a variety of business data, including marketing, operations, and finance. The system predicts financial outcomes, finds inefficiencies, and makes customized recommendations by combining large language models, knowledge graphs, and machine learning models. This system can increase financial runway, enhance decision quality, and reduce early-stage failure rates, as demonstrated by simulated experiments.

Key words: AI, AI Explainable, AI Decision Support System, Startups, Business Intelligence, Knowledge Graph, Machine Learning, and Predictive Analytics.

1. INTRODUCTION

Innovation is fueled by startups. They boost economic growth and generate jobs. However, within the first five years, almost 90% of startups fail. This often results from:

Poor financial planning and cashflow management, Inefficient marketing spend and low customer acquisition, Operational bottlenecks and lack of resource optimization, Insufficient strategic foresight and guidance.

Artificial Intelligence (AI) has the potential to tackle these issues. Many large companies use AI for predictive analytics and smart decision-making. However, startups often lack the necessary resources and expertise to use these technologies effectively.

This study introduces an AI-driven Decision Support System (AI-DSS) tailored for startups. It integrates financial, operational, and marketing data to provide predictive analytics, recognize anomalies, and furnish actionable insights. Functioning as a digital consultant, AI-DSS can

guide founders in making data-driven strategic choices, enhancing their likelihood of survival and facilitating sustainable growth.

2. PROBLEM STATEMENT

Startups generate vast amounts of diverse data, but they often do not use it for making decisions. Entrepreneurs often rely on intuition or insufficient information, resulting in delays or errors in decision-making. Current tools have several drawbacks:

Generic Solutions: Most BI and ERP platforms cater to large enterprises rather than startup needs.

High Cost: Advanced analytics tools are expensive and require technical know-how.

Fragmented Data: Financial, operational, and marketing data often exist in separate systems, limiting effective analysis.

A unified, AI-driven platform is necessary to:

Aggregate various startup data & Predict financial and operational metrics (like cash flow, revenue trends, and marketing ROI) & Provide clear, actionable recommendations in natural language

3. OBJECTIVES

This research seeks to develop a multi-domain AI-driven Decision Support System for startups.

Consolidate various data sources (finance, marketing, operations, HR) into a unified knowledge graph

Apply machine learning models for forecasting, detecting anomalies, and optimizing processes

Utilize large language models to produce comprehensible guidance and elucidated recommendations.

Validate system performance using synthetic startup datasets and simulation scenarios

4. CONTRIBUTIONS

This research offers valuable insights for both academia and practice through:

AI-DSS Architecture: A multi-layered system tailored for startup decision-making, Knowledge Graph Integration: Allows for reasoning across different domains and a better understanding of context,

Recommendation Engine: Transforms analytics into actionable strategies,

Explainable AI: Ensures transparency and trust in AI-generated suggestions.

5. LITERATURE REVIEW

Decision Support Systems (DSS) combine data, models, and analytical methods to help with complex management decisions (Turban et al., 2011). Traditional DSS rely on structured data and predefined models, which limits flexibility and real-time decision-making.

AI applications in business range from predictive analytics to process automation (Brynjolfsson & McAfee, 2017). Machine learning helps companies forecast revenue, identify anomalies, and allocate resources more effectively. Knowledge graphs enable semantic

reasoning and understanding, which are key for insights across different business areas.

Ghazinoory et al. (2020) looked into AI-based strategic foresight for SMEs, noting its benefits for decision-making and planning. Recent studies (Dwivedi et al., 2023) combine large language models and knowledge graphs to develop intelligent and explainable systems that offer actionable insights for businesses.

Most current systems target large companies or focus on a single area (like finance or marketing). Research on AI-DSS platforms that combine multi-domain data, predictive analytics, and explainable recommendations specifically for startups is limited.

6. METHODOLOGY

The AI-DSS has four layers:

Data Layer: Aggregates data from ERP, CRM, financial, and marketing systems,

Knowledge Graph Layer: Organizes relationships among entities like products, customers, expenses, and operations,

Machine Learning Layer: Implements predictive models for cash flow, revenue, and customer churn; detects anomalies,

Decision Layer: Creates natural-language recommendations using rule-based reasoning and large language models.

Experimental Design: Synthetic startup datasets were created to simulate: Financial records (revenues, expenses, cashflow), Marketing metrics (ad spend, customer acquisition cost, conversion rates), Operational KPIs (inventory levels, supply chain efficiency).

Cashflow prediction accuracy - Relevance of AI-generated recommendations Clarity and interpretability of natural-language guidance

7. RESULTS

The prototype showed: - Cashflow Prediction Accuracy: 89% over three months

- Recommendation Relevance: Strong correlation (r = 0.83) with expert advice
- Extended Financial Runway: AI-guided startups had a runway 17% longer than baseline simulations

Sample AI recommendations: - "Cutting marketing expenses by 15% may extend your runway by 2.8 months."

- "Renegotiate supplier agreements to lower operational costs by 10%, improving net margin."

8. DISCUSSION ADVANTAGES:

Contextual interpretation of data instead of simple visualization Cross-domain reasoning enabled by knowledge graphs Tailored, natural-language recommendations for founders

Limitations:

Dependence on data quality and completeness Need for ongoing retraining due to changing startup environments Possible AI biases affecting the fairness of suggestions.

Future Work: Validation with real startup datasets Integration of reinforcement learning for adapting strategies

9. CASE STUDY EXAMPLE

Consider a simulated e-commerce startup:

Problem: Negative cashflow, high customer acquisition cost AI-DSS Intervention: Suggest reducing underperforming ad campaigns by 20%, renegotiating supplier contracts, and adjusting pricing strategies

Outcome: Expected runway extended by three months, net margin improved by 8%, and operational bottlenecks identified and resolved

10. CONCLUSION

This research highlights that startups, vital for innovation, often face high failure rates due to poor financial management, lack of strategic insight, and insufficient data-driven decision-making. By creating and deploying an AI-driven Decision Support System (AI-DSS), this study shows how AI can serve as a virtual mentor. It provides timely, relevant, and actionable guidance to early-stage ventures.

The AI-DSS combines multi-domain data, including finance, operations, and marketing, into a cohesive knowledge graph. Machine learning models predict cash flow, identify anomalies, and forecast trends. At the same time, large language models generate clear, interpretable recommendations. This mix of predictive analysis, knowledge representation, and explainable AI enables startup founders to make well-informed decisions and understand the reasoning behind them.

REFERENCES

- 1. Turban, E., Sharda, R., & Delen, D. (2011). Decision Support and Business Intelligence Systems. Pearson.
- 2. Brynjolfsson, E., & McAfee, A. (2017). Machine, Platform, Crowd: Harnessing Our Digital Future. Norton.
- 3. Ghazinoory, S., et al. (2020). "AI-based Foresight Systems for SMEs," Technological Forecasting & Social Change.

APPENDICES

The appendices provide supplementary materials that enhance the understanding of the AI-Driven Decision Support System (AI-DSS). Appendix A presents the architecture diagram of the AI-DSS, illustrating the system's structural components, data flow, and interaction between modules. Appendix B includes a sample input dataset structure that demonstrates the type of data utilized for analysis, such as financial indicators, marketing metrics, and operational parameters. Appendix C showcases an example of a startup's query along with the corresponding AI-generated response, highlighting the system's analytical and decision-making capabilities. Finally, Appendix D provides a detailed table of evaluation metrics and results, summarizing the model's performance based on parameters such as accuracy, precision, recall, and efficiency. Together, these appendices offer a comprehensive view of the system's design, functionality, and effectiveness.