



More than 80% of AI projects get stuck in the lab or produce partial success.

Productizing ML is one of the biggest challenges in AI practices today.

* Source Gartner



partial success, or consume far more resources and time than initially planned."

* Source: Gartner

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"Only a small fraction of real-world ML systems is composed of the ML code" Google, inc.



* Sculley, David, et al. "Hidden technical debt in machine learning systems." Advances in neural information processing systems 28 (2015).

Evolutionary Changes in Data Analysis (ECiDA)



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Mission

- Simplify engineering tasks to let scientists concentrate on coding.
- A Lifecycle Management System specifically designed to support Real-time Data Processing, with enhanced Modularity, using Microservices.



Infrastructure

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* Hadadian Nejad Yousefi, Mostafa, et. al. "Empowering Machine Learning Development with Service-Oriented Computing Principles." Symposium and Summer School on Service-Oriented Computing. Cham: Springer Nature Switzerland, 2023.

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Coarse-Grained AI/ML Lifecycle



Data Processing Pipeline



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Modularity By Design



Algorithmic Modularity

• Utilization of programming languages or frameworks for the development of machine learning applications



Architectural Modularity

• Packaging each stage into distinct module and deploying these modules into appropriate software environments



	Monolith	Microservice
Pros	 Easy to develop Easy to deploy Less prone to network errors 	 Better Modularity and Visibility Scalability Technology Diversity Continuous Updates
Cons	 Lack of isolation Reusability Hard to minor updates and patches. 	 Operational Overhead Hard to debug Hard to share code







* https://docs.microsoft.com/en-us/azure/architecture/microservices/ci-cd

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Classical Software Evolution



- Incremental improvement
- Definite input/output

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Al System = Code + Data Code = Algorithm/Model

Hyperparameters



Al System Evolution



Monitoring Distributed ML Systems

- ML workflow monitoring:
 - Model monitoring
 - Performance Metrics (Accuracy, Precision, Recall)
 - Concept Drift: Change in the relationship of inputs and targets over time
 - Data Monitoring
 - Outlier Detection
 - Data Drift: Statistical Distribution Changes
- Resource usage monitoring
 - CPU, memory, and disk I/O

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Which one do you pick?





Selection Results







User Interface





Summary

- Code alone doesn't make an AI project.
- Engineering aspects of data science are overlooked
- Al is being used to streamline its own development and deployment.
- There are many specifics for that need careful considerations
 - Pipeline Composition
 - Life Cycle Management
 - Training vs Inference
 - Versioning
 - Continuous Monitoring
 - Experiment Tracking
 - What-if Scenarios



With AI comes great maintaining efforts

use it wisely





Product Launch



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in CONNECT

MacBook Air

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