# Three real world uses cases of AI operationalization to illustrate AI DevOps challenge

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## What I do

#### • Short bio:

- Computer scientist, former academic,
- Build labs in organizations to deploy innovative technologies.
- Hire highly skilled scientists to create products and solve problems
- Try to bridge the gab between business and technology to deploy all this in prod ...



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- In <u>commerce</u>, time to market (TTM) is the length of time it takes from a product being conceived until its being available for sale [WP]
- A common assumption is that TTM matters most for first-of-akind products, but actually a late product launch in any industry can negatively impact revenues—from reducing the window of opportunity to generate revenues to causing the product to become obsolete faster [WP]
- In modern economy TTM is not only a business concern: it is also a development issue.

## Time to market is key

Performances is another one

# Three real world uses cases of AI operationalization

- 1. State Of the Art search engine
- 2. Open Source Dialog platform
- 3. Machine Learning Risk modeling system

# A state of the art search engine

Case 1

# Let's brake the status-quo

When everybody is in trenches

### Case 1 : A state of the art search engine

- Characteristics
  - New technology from scratch (SoIR)
  - Full DeVops practices
  - O Git / Java / Spring
  - O Agile Dev Teams
  - O 2 Linux Data center
  - O 2 weeks iterations & scrums
- O Needs
  - Make it work ...
  - Relevance not measured
  - Performances unknown
  - O Bad blood between IT and Business

Everything goes smooth, deployment are clean, every two weeks, scalability is perfect (600 M queries a year), uptime is industry standard (over 99.99%) ... **but big quality issues** 



# Case 1 : A state of the art search engine

#### Solving the quality problem

#### • Two teams – Two product owners

- O 1 R&D Team
  - With computer scientists and linguists
- 1 Development Team
  - With architect
- 1 scrum master for the 2 teams
- O Needs

O Make it work ...



# Case 1 : A state of the art search engine

#### O Issues

- O R&D Team
  - O improve code with relevant science
  - build metrics
  - team suggest modifications
- O Roadblocks
  - Dev teams refuse R&D code
  - Architect make design that do not fit with current technology (example: index in memory)
  - PO do not prioritize and trust R&D improvements
  - QA do not understand concept of IR metrics

Consequences: client complaints about poor quality of results – Time to market of 1 year (instead of 3 weeks sprints) – backlog of technologies that do not goes in prod



#### Case 1 : A state of the art search engine

- Deployment of new technology do not come but this is not a dev issue
- Solutions :
  - Change report structure Dev & RD Teams (digital marketing)
  - One Senior PO instead of two for R&D and Dev Team
  - Infra stay in IT but architecture move
- Time to market reduced to 2 weeks for code update and 24h for data upgrade
- From 1 innovation in prod every 6 to 12 months to 3 to 6 every sprint

DevOps is 30% of the solution (30% is R&D, 30% is data and 10% business)



After organisational transformation search become an internal product with a F-Score of 0.8 (Google at 0.9, Yelp at 0.65). Product is generalized company wide (including in subsidiaries)

# Deploying successfully and multiple time an open source dialog platform in a bank

Case 2

# Going from scratch

Build the good structure from start

**Case 2 :** *deploying successfully and multiple time an open source dialog platform in a bank* 

- A banking organization
- Need to deploy technology to minimize pression on call centers
- Solution : dialog systems



**Case 2**: deploying successfully and multiple time an open source dialog platform in a bank

## Environment

• Multiple technologies

• 9 projects, 9 vendors

- Strict roles separation (Business vs IT)
- lack of internal knowledge of dialog system
- Poor quality, high price
  - O Example
    - O chat with nobody to answer
    - FB bot with no upgrades in months and no data collection



## Solution

#### **Case 2**: deploying successfully and multiple time an open source dialog platform in a bank

- Adopt and integrate an open source framework (Rasa)
- Define an organization that can handle in the best possible way
  - O Operationalization
  - O Operational Quality
  - End user quality

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Ma voûte d'échange Aide et contact English	Parcourir nos démos         Découvrez étape par étape comment fonctionne votre compte.         • Faire un tour d'horizon de votre banque en ligne         • Faire un Virement Interace**         • Annuler un Virement Interace**         • Payer/ajouter une facture         • Ajouter un avis de voyage	Plantier une transaction Commander des chique Commander des chique Comma
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- Define an organization that can handle in the best possible way
  - O Operationalization
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  - End user quality
- Building an AI Team on business side to design a solution
- Building an IT AI Factory Team to operationalize using standard DevOps techniques
- Establish collaboration between AI Team with AI Factory for roadmap

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## **Resulting organisationnal structure**

**Case 2 :** *deploying successfully and multiple time an open source dialog platform in a bank* 

#### Al Science Team

- In charge of solution design and model maintenance
  - Open source framework selection
  - Functionality design (including patents and comp-sci communications)
  - Model performance (accuracy)
  - O Model improvement
  - Data ownership

#### Al Factory Team

- In charge of solution integration
  - Choice of technology (Kubernetes, cloud ...)
  - O Deployment
  - O Monitoring
  - Upgrading open source solution
  - Proprietary code development

One product owner for the project on business side : in charge of backlog and scrums for all involved teams.

Success: from 1 bot in operation to 8 in 3 years – time to market of 3 to 6 months – models upgrades every 2 days

DevOps is 30% of the solution (30% is science and 40% is business ownership)

# Delivering a new machine learning based risk modelling algorithm

Case 3

# The art of legacy

The difficulty to innovate when there is a lot of history and regulation

Jo. Counts

# Use case : delivering a new machine learning based risk modelling algorithm

#### Introducing machine learning algorithms in existing environnement

- ML models can be developed in few weeks
- Can overperform traditional models by 10 folds
- Can be updated live with new data (during massive crisis like Covid-19)

#### Difficulties

- Environment uses traditional models (regression, score cards ...)
- Multiple legacy systems (data access)
- Existing framework not designed for common ML framework
- Design of ML model is conducted with non-IT standard tools (Python, Jupyter notebooks)
- Risk management is not used to ML
- IT do not accept (again) scientist code
- Big tech companies are here to challenge you with their own framework...

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#### Solutions

- Develop new deployment pipelines using DevOps framework
- Data Engineers build data pipeline
- Architect build a common development framework and scientists recode
- Upgrade risk management with new rules
- Big tech companies go away fast because they understand how it is complex

The time to market remain poor as transformation involves multiple business units: in this case DevOps techniques are less than 10% of the solution, more than 50% is business and 30% is risk

