

WORKSHOP 2

Demystifying Generative AI - Shape use cases where generative AI adds real value to the Health Sector



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HEALTH 2023

14th September 2023

Demystifying Generative AI workshop

*Shape your generative AI use
case*

Demystifying the Future of Life Sciences with GenAI



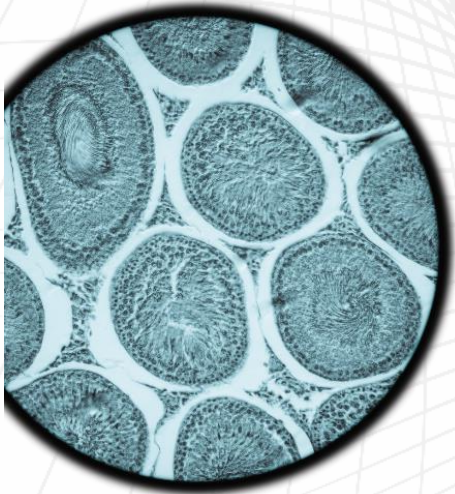
Fig. 1: Video entirely generated using GenAI

Agenda



Objective

Learn how to shape your own use case where generative AI adds real value to the Health Sector



11h15 | **Welcome and Introduction – 5'**

11h20 | **Get AI Inspired – 15'**

Key benefits and use cases of Generative AI for life Sciences and healthcare – 5'

Select use-case to go through (according to audience): (R&D or Patient Engagement) – 10'

11h35 | **A day in the life – Experience the key GenAI building blocks – 30'**

Identify Generative AI suitability to unlock Business Value– 15'

Assessing Feasibility and Risks: Ethical Implications and Risks Mitigation – 15'

12h05 | **Ignite – 10'**

Playback to the group

Reflection on how to bring the use-case to the concrete stage

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Welcome and
Introductions



Meet your Deloitte coaches

We are excited to welcome you and help you shape your Generative AI use-case today

Strategy, Innovation & Technology



Antonio Russo
Innovation Partner,
Strategy & Analytics
Lead (CH)



Aditya Kudumala
Partner Strategy &
Analytics (FR)



Wolfram Von Ehren
Senior Director
Business Operations
(CH)



Sebastian Burnett
Director, Strategy &
Analytics (UK)

Legal & Cyber



Paul De Blasi
Partner Tax &
Legal (CH)



Reto Haeni
Partner Cyber &
Strategic Risk (CH)

Moderation



Berit Gerritzen
Director, AI&Data
(CH)



Arthur Benzaquin
Senior Consultant,
AI & Data (CH)

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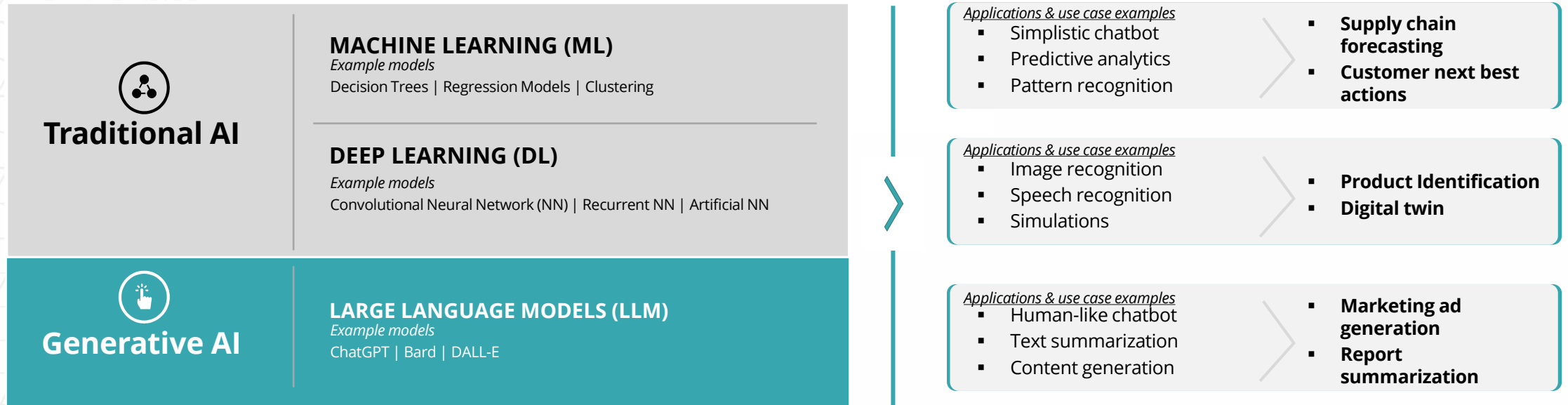
Get AI Inspired

*Discover how Generative AI enables
value for your organization*



Large Language Models Are The New Frontier of Gen AI

We are excited to welcome you and help you shape your Generative AI use-case today



The secret sauce of LLMs (Generative AI) is that they have been trained on billions of data points and can interpret human language with exceptionally high fluency

Generative AI Modalities



Generative AI can significantly improve business efficiency by automating repetitive tasks, generating new ideas, and improving decision-making through data analysis. It can also increase revenue by creating personalized experiences for customers and identifying new market opportunities.

Explain to my colleagues the business impact of generative AI in 50 words

TEXT

```
cpp
#include <iostream>
using namespace std;

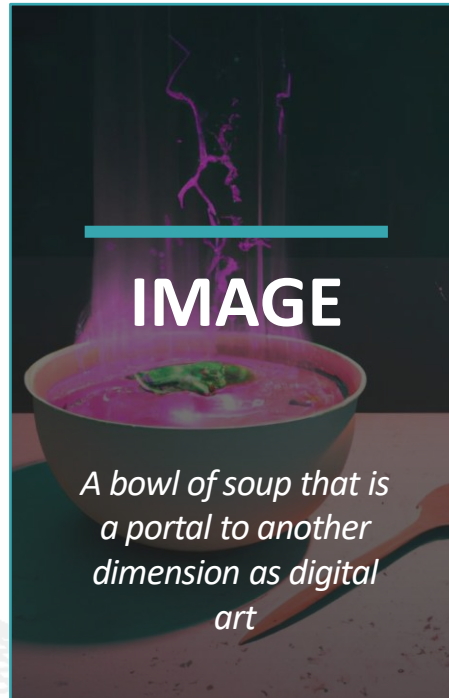
// Define robot class
class Robot {
public:
    // Constructor
    Robot(string id, int x, int y) {
        robot_id = id;
        current_x = x;
        current_y = y;
    }
    // Move function
    void move(int x, int y) {
        current_x = x;
        current_y = y;
        cout << "Robot " << robot_id << " moved to (" << current_x <<
    }
private:
    string robot_id;
    int current_x;
    int current_y;
};

// Main function
int main() {
    // Create two robots
    Robot robot1("R1", 1, 1);
    Robot robot2("R2", 2, 2);

    // Move the robots
    robot1.move(3, 3);
    robot2.move(4, 4);
}
```

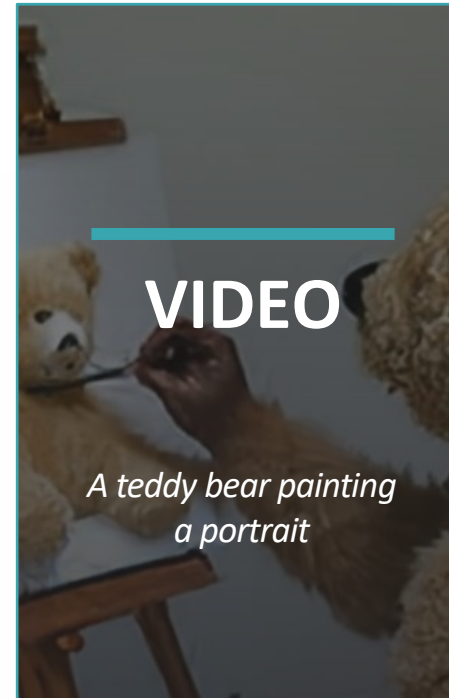
CODE

In Python, code a program that predicts the likelihood of customer conversion



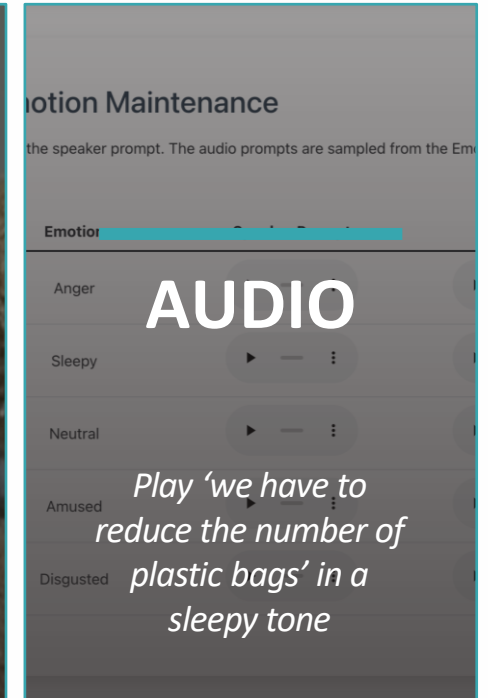
IMAGE

A bowl of soup that is a portal to another dimension as digital art



VIDEO

A teddy bear painting a portrait



Emotion Maintenance

the speaker prompt. The audio prompts are sampled from the Em

Emotion

AUDIO

- Anger
- Sleepy
- Neutral
- Amused
- Disgusted

Play 'we have to reduce the number of plastic bags' in a sleepy tone

Though the content that is output may differ, the general process of data collection, training, and generation remains the same across all modalities

Generative AI Value Plays



EFFICIENCY PLAY

Improve operational performance through improved productivity by doing more with less

- ✓ Automate processes
- ✓ Optimize costs
- ✓ Drive consistency
- ✓ Reduce FTEs
- ✓ Remove waste
- ✓ Improve speed

*“What if you could **improve your operations while increasing margins and profitability?**”*



EXPERIENCE PLAY

Provide fit-for-purpose and customized experiences to patients, partners, and employees

- ✓ Personalize content
- ✓ Differentiate services
- ✓ Enhance quality and outcomes
- ✓ Amplify creativity
- ✓ Knowledge Shift

*“What if you could **personalize communications to each of your patients & HCPs at 0 additional cost?**”*



CAPABILITY PLAY

Develop and enhance enterprise digital and data capabilities that are enabled by GenAI

- ✓ Generate new insights
- ✓ Extend asset utility
- ✓ Augment workforce skills
- ✓ Improve decisioning
- ✓ Improve adaptability

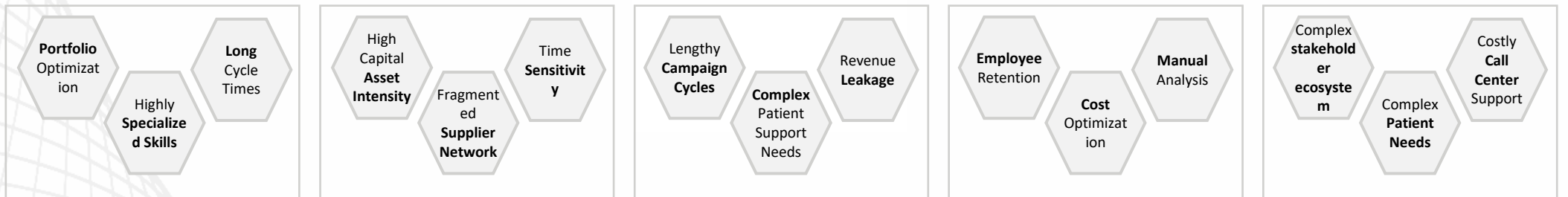
*“What if you could **augment the skills of healthcare practitioners, by giving them access to real-time information and decision-making support?**”*

Where can Generative AI Unlock Value

VALUE CHAIN



Illustrative Business Challenges



Value Play Opportunities

- Efficiency Play
- Experience Play
- Capability Play



Key Areas Where GenAI Can Help

- RESEARCH & DEVELOPMENT:**
 - + Make sense of the noise from scientific literature
 - + Accelerate Study startup activities & deliverable creation
 - + Expedite data intensive Research activities
 - + Reduce patient participation burdens
- SUPPLY CHAIN & MANUFACTURING:**
 - + Expedite coordination across distribution partners
 - + Optimize factory efficiency
 - + Increase velocity of drug commercialization
 - + Automate supplier reviews
- PHARMA COMMERCIAL:**
 - + Increase velocity of content creation and reviews
 - + Enable sales resource scalability and effectiveness
 - + Democratize esoteric contracting knowledge
 - + Simplify patient access & support
- ENABLING AREAS:**
 - + Simplify financial analysis and reporting
 - + Accelerate procure to pay
 - + Improve new employee onboarding
 - + Enhance vendor compliance
- HEALTHCARE:**
 - + Simplify patient access
 - + Re-engineer how support is provided
 - + Improve stakeholder coordination (HCP, pharmacy, etc..)
 - + Customer insights and personalization

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"A day in the life"

Experience the key GenAI building blocks



We present two Use-Cases scenarios for in-Depth Analysis

Personalized Clinical trial Engagement






Generative AI can tailor outreach to potential trial participants, address participation concerns, and boost retention with personalized engagement

ENVIRONMENT CONTEXT

- Securing the right clinical trial participants is vital for patient trust, safety, regulatory approval, and reimbursement
- **Current process is costly, time-consuming, and largely manual**

CURRENT CONSTRAINTS

-  Clinical trials often miss recruitment goals: ~37% of sites fall short and 10% enrol no patients
-  80% of research sites fail to meet their patient enrolment deadlines
-  Patient dropout rates are approximately 30%

Digital Patient CGT Support






Generative AI can streamline patient services, allowing organizations to swiftly expand operations to more patients

ENVIRONMENT CONTEXT

Delivering cell and gene therapies demands intricate coordination among stakeholders like providers / care-site and payers, specialty pharmacies-

CURRENT CONSTRAINTS

-  Cumbersome experience for patient and providers
-  Scalability constraints
-  Costly outcome monitoring

We will go through 2 exercises together

You will have the chance to experience the Deloitte frameworks on one of the selected use-cases or leveraging your own use-case from scratch. Then play the key results back to the group

1

VALUE FRAMEWORK



15'

- ✓ Suitability of Generative AI
- ✓ Expected Value from use-case
- ✓ **Over to you!**

2

FEASIBILITY & RISK FRAMEWORK



15'

- ✓ Feasibility & Risks considerations
- ✓ Key mitigations considerations
- ✓ **Over to you!**

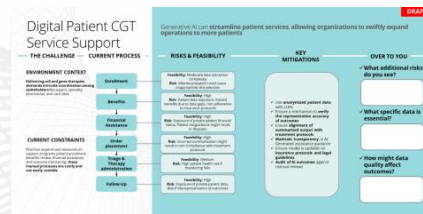
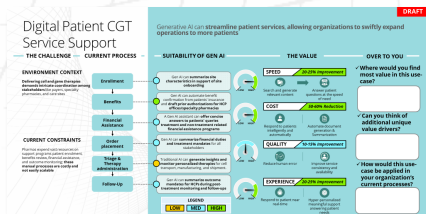
3

SHARE BACK TO THE GROUP



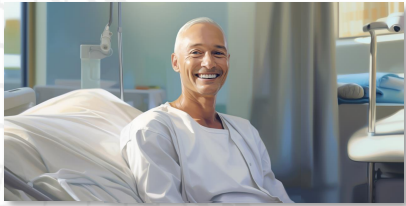
2' / group

- ✓ What additional value drivers? Why?
- ✓ How would this apply in your organization?
- ✓ How might data impact patient outcomes?
- ✓ **Your input!**



Join your table and start the exercise!

Table 1 & 2



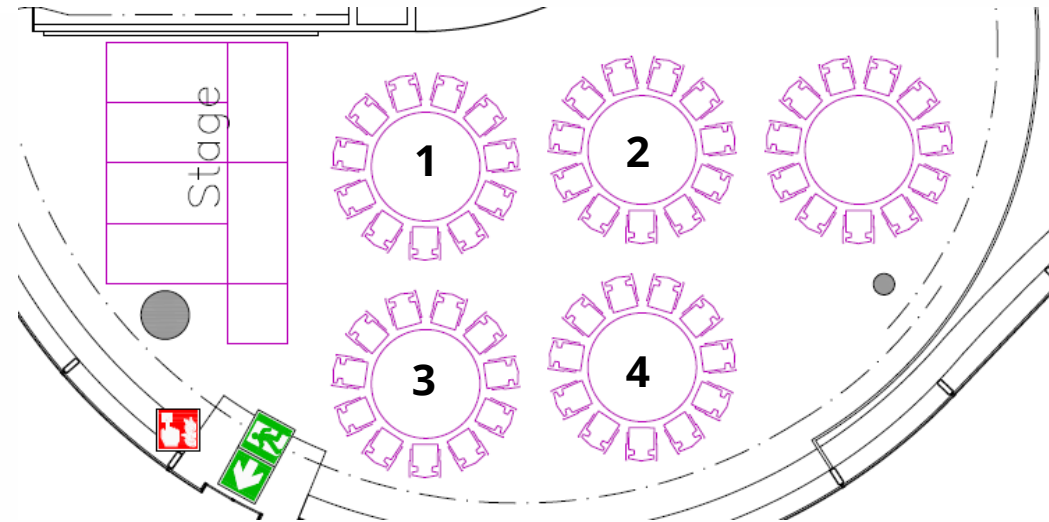
**Personalized Clinical trial
Engagement**

Table 3 & 4



Digital Patient CGT Support

FLOOR PLAN



Exercise – Value, Feasibility and risk framework

You will have the chance to experience the Deloitte frameworks on one of the selected use-cases or leveraging your own use-case from scratch. Then play the key results back to the group

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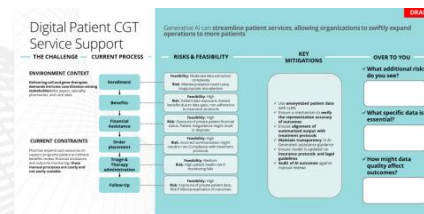
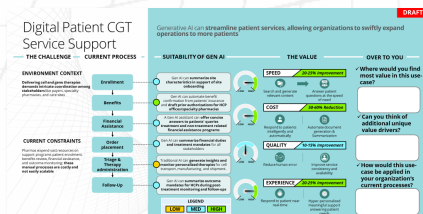
3

SHARE BACK TO THE GROUP



2' / group

- ✓ What additional value drivers? Why?
- ✓ How would this apply in your organization?
- ✓ How might data impact patient outcomes?
- ✓ **Your input!**



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Play back to the
group



Playback to the group

SHARE BACK TO THE GROUP



2' / group

- ✓ What additional value drivers? Why?
- ✓ How would this apply in your organization?
- ✓ How might data impact patient outcomes?
- ✓ **Your input!**

The Path to GenAI: From Data to Intelligence

The secret to GenAI – meticulous data preparation.

GenAI brings incredible potential to deliver transformative business value. With all the hype, it is easy to forget about the less exciting but highly critical step – ensuring access **to quality, reliable and trustworthy data** for model development. Takeda Global Manufacturing, Quality and Supply Chain have been on a journey to **get their data GenAI ready**, leveraging **ML DevOps for continuous improvement**.



Susan Tillmann

Head Data, Analytics and Digital,
Global Manufacturing & Supply
Takeda



Clare Bornstein

Advanced Analytics Platform Lead
Global Manufacturing & Supply
Takeda



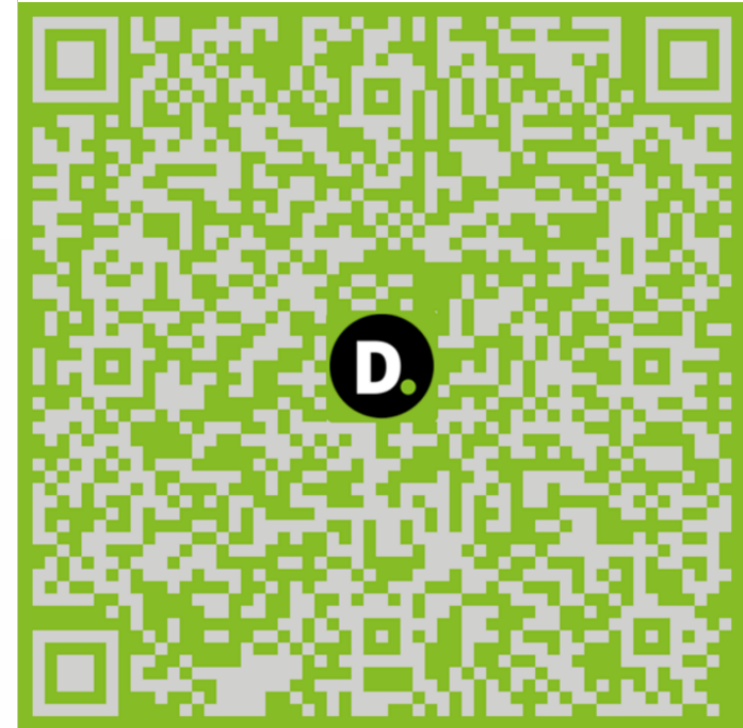
Nishant Sinha

Director AI and Automation, Deloitte

Join us at 14:50 as we share our experience, lessons learned, practical strategies applied on our path from data to intelligence.

What action will you and
your organisation take?

Thank you!



<https://mkto.deloitte.com/Intelligent-Health-booth.html>

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Appendix



Introducing the Value Exercise

THE CHALLENGE

Determine the challenge, considering **current circumstances, the main stakeholders involved, and present constraints**

Digital Patient CGT Service Support

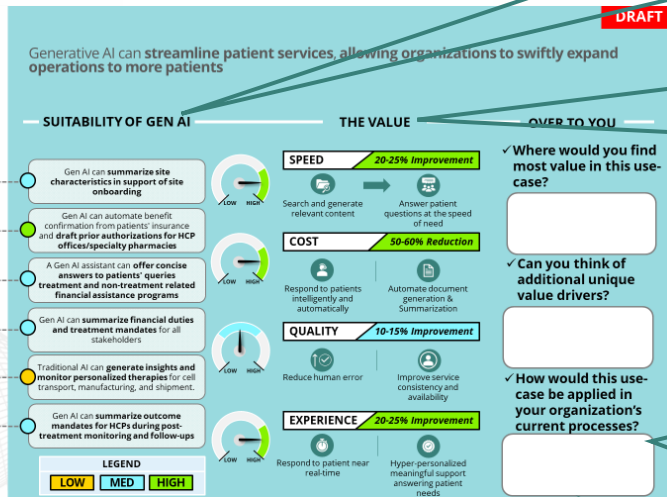
THE CHALLENGE CURRENT PROCESS

ENVIRONMENT CONTEXT

Delivering cell and gene therapies demands intricate coordination among stakeholders like payers, specialty pharmacies, and care sites.

CURRENT CONSTRAINTS

Pharmas expend vast resources on support programs patient enrollment, benefits review, financial assistance, and outcome monitoring; these manual processes are costly and not easily scalable.



GEN AI SUITABILITY

Identify and evaluate the impact that Generative AI can have into a specific process step to solving real business problems

THE VALUE

Understand what are the **key Value drivers** and enabling capabilities of applying Generative AI across the current process

IMPLEMENTATION

Discover hurdles from a regulatory, ethics, risk or change management perspective and strategies to overcome

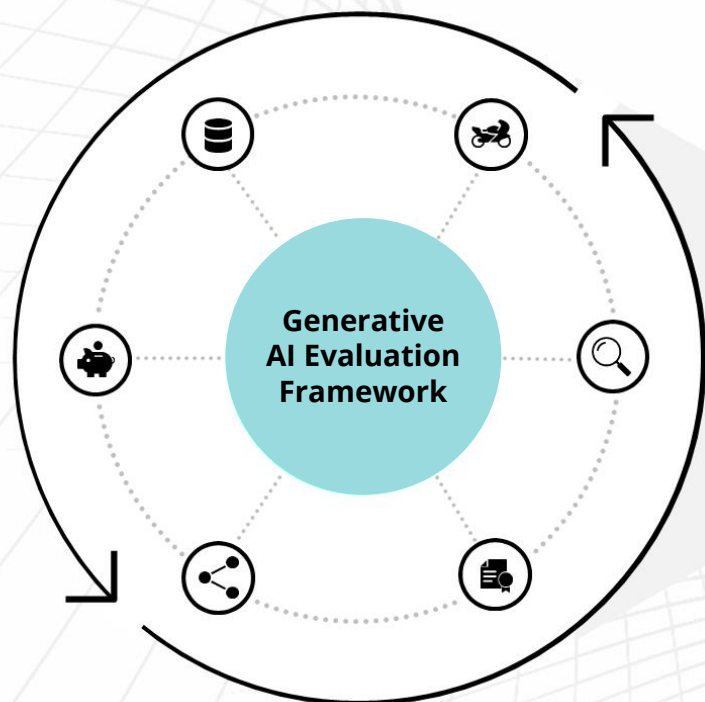
OVER TO YOU











Augment the existing framework **with your "own" insights**

CURRENT PROCESS

Identify the key steps of the current process to **highlight key point with lack of standardization and segregate the application opportunities**

Introducing the Feasibility and Risk Framework



Dimension	Evaluation Factor	Considerations
ABILITY TO EXECUTE	 Data Availability & Quality	<ul style="list-style-type: none"> ✓ Are large volumes of clean data available that can be utilized as samples for GenAI training? ✓ Is a high diversity of data available to mitigate bias potential? ✓ How difficult is it to obtain and access data?
	 Process Standardization & Governance	<ul style="list-style-type: none"> ✓ Are the target processes well documented? ✓ Do the target processes contain known “accurate” and “inaccurate” outcomes that can be used to evaluate the GenAI model’s performance?
	 Nature of Input Prompts & Expected Outputs	<ul style="list-style-type: none"> ✓ How frequent and complex are the outputs of the GenAI model? (e.g., 20-page documents vs. bullet points) ✓ Will system integrations be required to facilitate data inputs or outputs interpretations?
	 Change Management	<ul style="list-style-type: none"> ✓ Is the usability of GenAI embedded in the e2e process- and application landscape providing a seamless user experience? ✓ Is the impact of workload and –content to the employees and the organization known and well managed to avoid lack of adoption?
DEGREE OF RISK	 Bias	<ul style="list-style-type: none"> ✓ Is my data over/under representative of a population cohort, region, gender, demographic group? ✓ Can steps be taken to mitigate bias during training? Are there any metrics that will be used to track bias? ✓ What level of impact criticality a biased output would have on the end user?
	 Ethical Use	<ul style="list-style-type: none"> ✓ Is an appropriate process in place ensuring that the model does not tread across lines of plagiarism and copyright violations? ✓ Will the solution be subject to independent oversight and review ensuring responsibility?
	 Hallucination	<ul style="list-style-type: none"> ✓ Is there a possibility to assess and validate attributions to the source information? ✓ Is an appropriate governance model in place to ensure the “human-in the loop”? (e.g., workforce upskilling, structured oversight, ubiquitous documentation)
	 Cybersecurity	<ul style="list-style-type: none"> ✓ Have the risks for data exfiltration, Data/Model poisoning, model stealing and adversarial attacks being addressed? ✓ Is there a security architecture in place that addresses the key areas of security control Infrastructure and Network, Access Management, Monitoring and Data Protection?
	 IP Protection	<ul style="list-style-type: none"> ✓ Will information be shared with third parties through prompt engineering resulting to potential data leakage?
	 Patient Health and Safety	<ul style="list-style-type: none"> ✓ Is the model capable to process and provide medical information in prescience manner to avoid mistakes which can lead to adverse consequences to human health? ✓ Can the model consider appropriate emotional tone in the conversation to account for individual health status and ability to understand information?

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Appendix – Print-
Outs



Digital Patient CGT Service Support

Digital Patient CGT Service Support



Generative AI can streamline patient services, allowing organizations to swiftly expand operations to more patients

VALUE FRAMEWORK EXERCISE

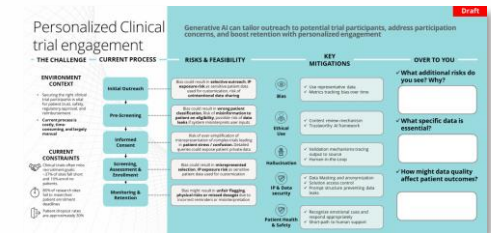
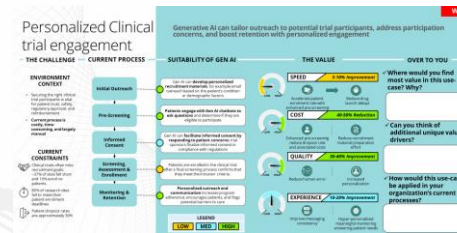


- ✓ Suitability of Generative AI
- ✓ Expected Value from use-case
- ✓ **Over to you!**

FEASIBILITY & RISK FRAMEWORK EXERCISE



- ✓ Feasibility & Risks considerations
- ✓ Key mitigations considerations
- ✓ **Over to you!**



Digital Patient CGT Service Support

Generative AI can **streamline patient services, allowing provider & payer organizations to swiftly expand operations to more patients**

THE CHALLENGE

CURRENT PROCESS

SUITABILITY OF GEN AI

THE VALUE

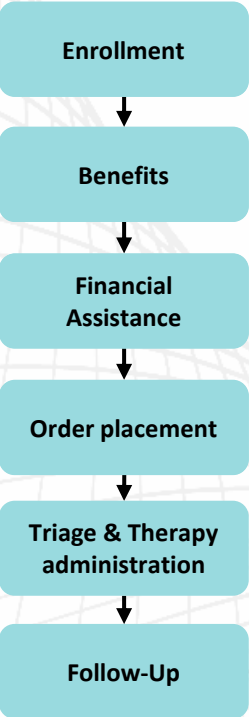
OVER TO YOU

ENVIRONMENT CONTEXT

Delivering cell and gene therapies demands intricate coordination among stakeholders like payers, specialty pharmacies, and care sites

CURRENT CONSTRAINTS

- Cumbersome experience for patient and providers
- Scalability constraints
- Costly outcome monitoring



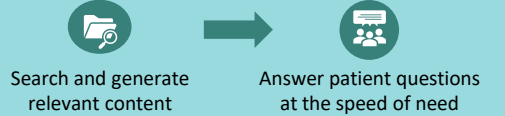
- Enrollment** (Low suitability): Gen AI can summarize site characteristics in support of site onboarding
- Benefits** (High suitability): Gen AI can automate benefit confirmation from patients' insurance and draft prior authorizations for HCP offices/specialty pharmacies
- Financial Assistance** (Low suitability): A Gen AI assistant can offer concise answers to patients' queries on treatment and non-treatment related financial assistance programs
- Order placement** (Low suitability): Gen AI can summarize financial duties and treatment mandates for all stakeholders
- Triage & Therapy administration** (Medium suitability): Traditional AI can generate insights and monitor personalized therapies, including cell transport, manufacturing, and shipment.
- Follow-Up** (Low suitability): Gen AI can summarize outcome mandates for HCPs during post-treatment monitoring and follow-ups

LEGEND

LOW MED HIGH



SPEED 20-25% Improvement



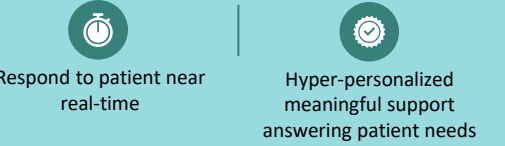
COST 50-60% Reduction



QUALITY 10-15% Improvement



EXPERIENCE 20-25% Improvement



✓ Where would you find most value in this use-case? Why?

✓ Can you think of additional unique value drivers?

✓ How would this use-case be applied in your organization's current processes?

Digital Patient CGT Service Support


Generative AI can **streamline patient services, allowing provider & payer organizations to swiftly expand operations to more patients**


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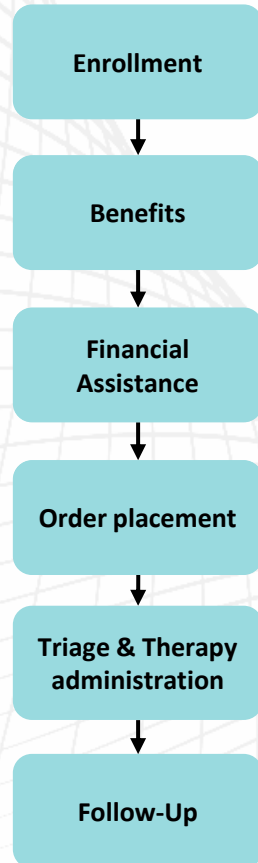
CURRENT CONSTRAINTS

 Cumbersome experience for patient and providers

 Scalability constraints

 Costly outcome monitoring







CURRENT PROCESS



RISKS & FEASIBILITY

- Process needs to be sufficiently digitized / standardized to apply AI. Incomplete data / misinterpretation could lead to incorrect site selection
- Patient data exposure, missed benefits due to data gaps, timely access to the claims data
- Patient misguidance might result in disputes; Risk of exposure of patient financial status
- Incorrect summarization might result in non-Compliance with treatment protocols
- Compliance risks, potential harm to the patient health in case treatment procedure is not followed properly or cell material is damaged.
- Exposure of private patient data, Patient health risk due to model hallucinations and misrepresentation of the medical context

KEY MITIGATIONS

-  **Patient Health & Safety**
 - ✓ Specialized models trained on medical data
 - ✓ Prompts engineered to personalise tone of the conversation
 - ✓ Short-path to human support
-  **Bias**
 - ✓ Use representative data
 - ✓ Metrics tracking bias over time
-  **Ethical Use**
 - ✓ Content review mechanism
 - ✓ Human-in-the-loop
 - ✓ Trustworthy AI framework
-  **Hallucination**
 - ✓ Validation mechanisms tracing output to source
 - ✓ Human-in-the-Loop
-  **Cybersecurity**
 - ✓ Secure architecture (Infrastructure and Network, Access Management, Monitoring and Data Protection)
-  **IP & Data security**
 - ✓ Information Sharing and Third-Party Risk Assessment

OVER TO YOU

✓ **What additional risks do you see? Why?**

✓ **What specific data is essential?**

✓ **How might data quality affect patient outcomes?**

Personalized Clinical trial Engagement

Personalized Clinical trial Engagement



Generative AI can tailor outreach to potential trial participants, address participation concerns, and boost retention with personalized engagement

VALUE FRAMEWORK EXERCISE

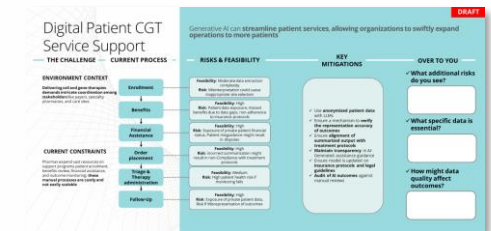
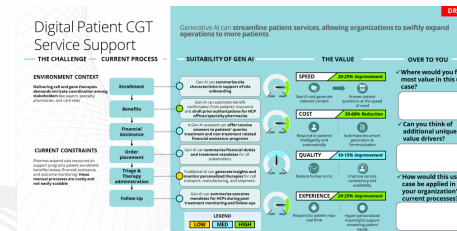


- ✓ Suitability of Generative AI
- ✓ Expected Value from use-case
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FEASIBILITY & RISK FRAMEWORK EXERCISE



- ✓ Feasibility & Risks considerations
- ✓ Key mitigations considerations
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Personalized Clinical trial engagement




Generative AI can tailor outreach to potential trial participants, address participation concerns, and boost retention with personalized engagement

THE CHALLENGE

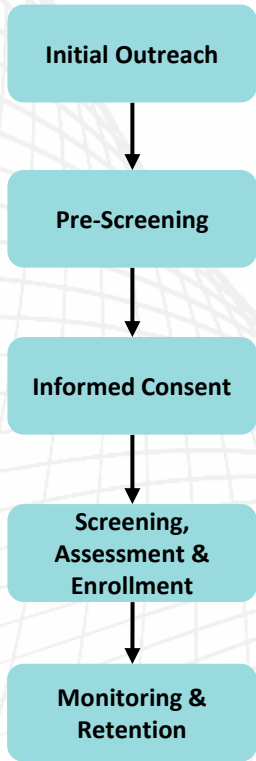
ENVIRONMENT CONTEXT

- Securing the right clinical trial participants is vital for patient trust, safety, regulatory approval, and reimbursement
- Current process is costly, time-consuming, and largely manual






CURRENT CONSTRAINTS

-  Clinical trials often miss recruitment goals: ~37% of sites fall short and 10% enrol no patients.
-  80% of research sites fail to meet their patient enrolment deadlines
-  Patient dropout rates are approximately 30%

CURRENT PROCESS



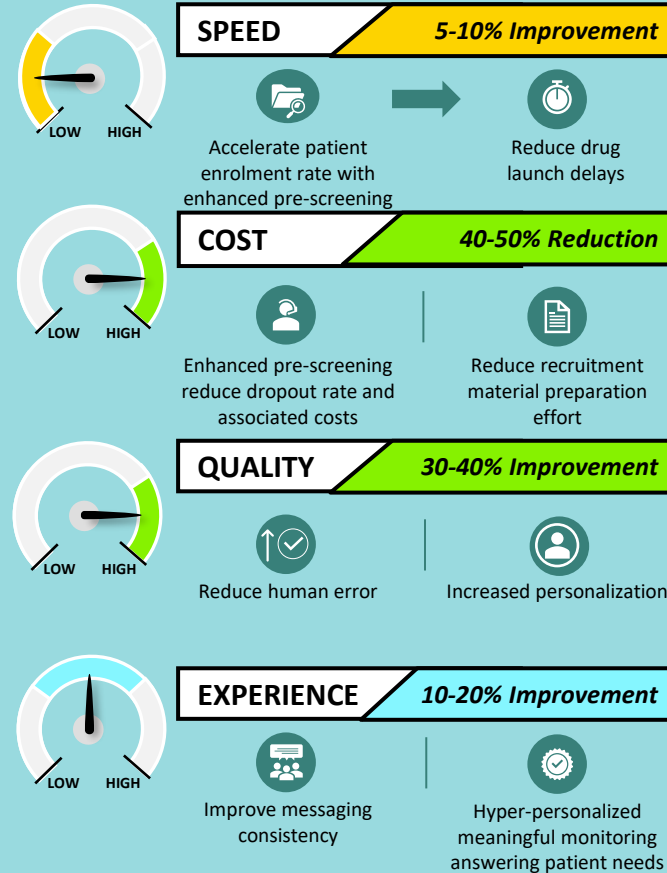
SUITABILITY OF GEN AI

-  Gen AI can **develop personalized recruitment materials**, for example email outreach based on the patient's condition or demographic factors
-  Patients **engage with Gen AI chatbots** to ask questions and determine if they are eligible to participate
-  Gen AI can **facilitate informed consent by responding to patient concerns**; trial sponsors finalize informed consent in compliance with regulations
-  Patients are enrolled in the clinical trial after a final screening process confirms that they meet the inclusion criteria.
-  **Personalized outreach and communication** increases program adherence, encourages patients, and flags potential barriers to care

LEGEND

-  LOW
-  MED
-  HIGH

THE VALUE



OVER TO YOU

✓ Where would you find most value in this use-case? Why?

✓ Can you think of additional unique value drivers?

✓ How would this use-case be applied in your organization's current processes?

Personalized Clinical trial engagement




Generative AI can **tailor outreach to potential trial participants, address participation concerns, and boost retention with personalized engagement**

THE CHALLENGE

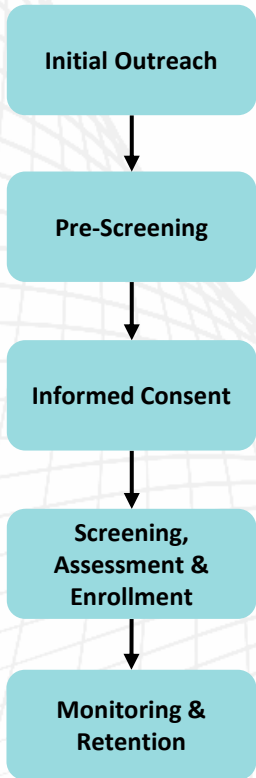
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CURRENT PROCESS



RISKS & FEASIBILITY

- Initial Outreach: Bias could result in **selective outreach, Restricted data exposure risk** as sensitive patient data used for customization, risk of **unintentional data sharing**
- Pre-Screening: Incomplete data sets could result in **wrong patient classification**, Risk of **misinformation to patient on eligibility**, possible risk of **data leaks** if system misinterprets user inputs
- Informed Consent: Risk of over-simplification of misrepresentation of complex trials leading in **patient stress / confusion**. Hallucinations can lead to failure to obtain regulatory approval and delays
- Screening, Assessment & Enrollment: Bias could result in **misrepresented selection, Restricted data exposure risk** as sensitive patient data used for customization
- Monitoring & Retention: Bias might result in **unfair flagging, physical risks and failure to follow protocol** due to incorrect reminders or misinterpretation

KEY MITIGATIONS

-  **Patient Health & Safety**
 - ✓ Recognize emotional cues and respond appropriately
 - ✓ Short-path to human support
-  **Bias**
 - ✓ Use representative data
 - ✓ Metrics tracking bias over time
-  **Ethical Use**
 - ✓ Content review mechanism
 - ✓ Human-in-the-loop
 - ✓ Trustworthy AI framework
-  **Hallucination**
 - ✓ Validation mechanisms tracing output to source
 - ✓ Human-in-the-Loop
-  **Cybersecurity**
 - ✓ Secure architecture (Infrastructure and Network, Access Management, Monitoring and Data Protection)
-  **IP & Data security**
 - ✓ Information Sharing and Third-Party Risk Assessment

OVER TO YOU

✓ **What additional risks do you see? Why?**

✓ **What specific data is essential?**

✓ **How might data quality affect patient outcomes?**