

AI and Digital Healthcare Overview

November 2023

DRAFT

These materials are intended to supplement a discussion with L.E.K. Consulting. These perspectives will, therefore, only be meaningful to those in attendance. The contents of the materials are confidential and subject to obligations of non-disclosure. Your attention is drawn to the full disclaimer contained in this document.



Agenda

- Are we creating value in Digital Healthcare?
- Overview of AI and Digital in Healthcare in Brazil
 - AI Investment opportunities today in Brazil
 - AI Use cases in Hospitals
 - Digital opportunities in Pharma
- How to think about Digital Maturity in Healthcare?

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The Healthcare sector is being pressured on several fronts, and Digital Healthcare has the potential to support solutions for at least some of these critical challenges

Fronts pressuring the Healthcare sector



Ageing population, with growing disease burden and health expenditures



Increasing drug and MedTech costs given new disciplines and capabilities



Healthcare infrastructure constraints



Complex care pathways



Consumerism and high healthcare/ patient engagement

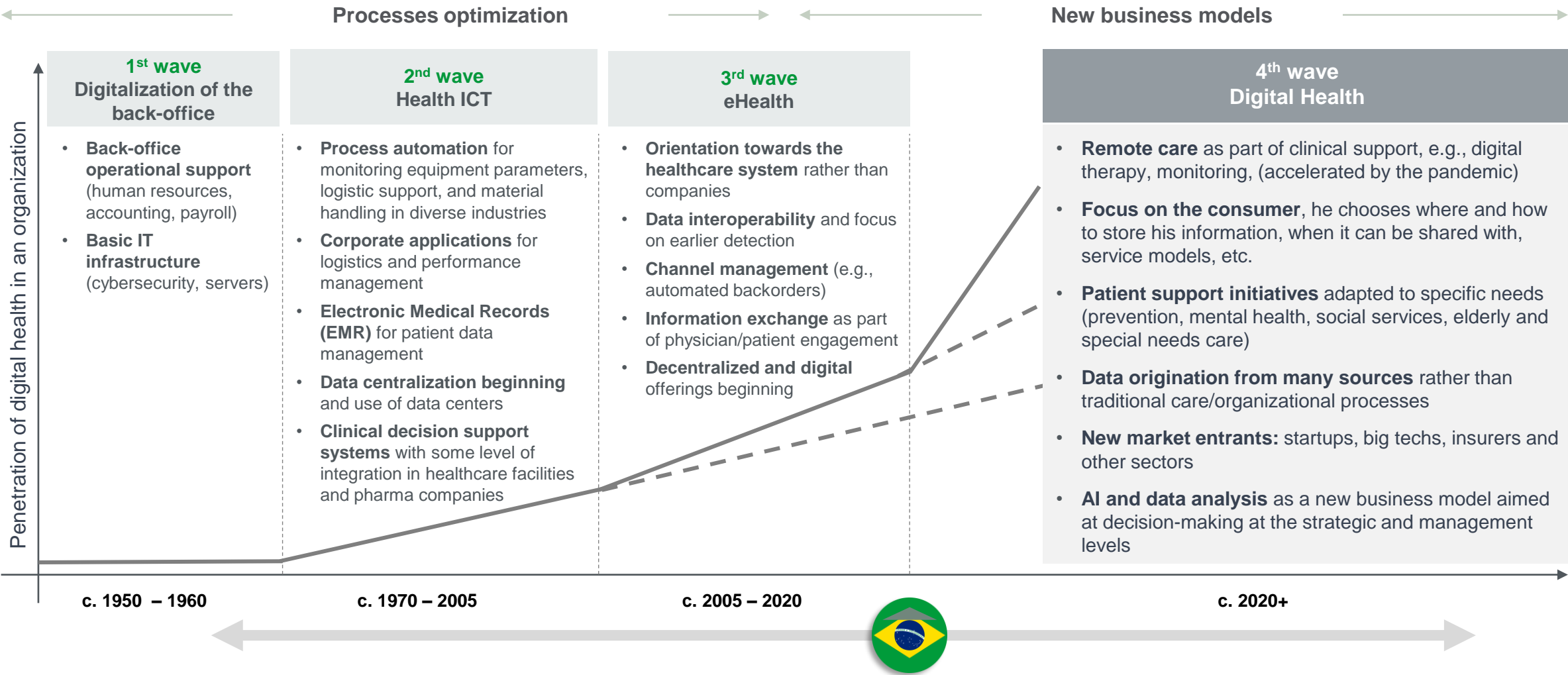


Funding pressures, increased private sector participation and focus on efficiency

Digital solutions can support healthcare companies by allowing

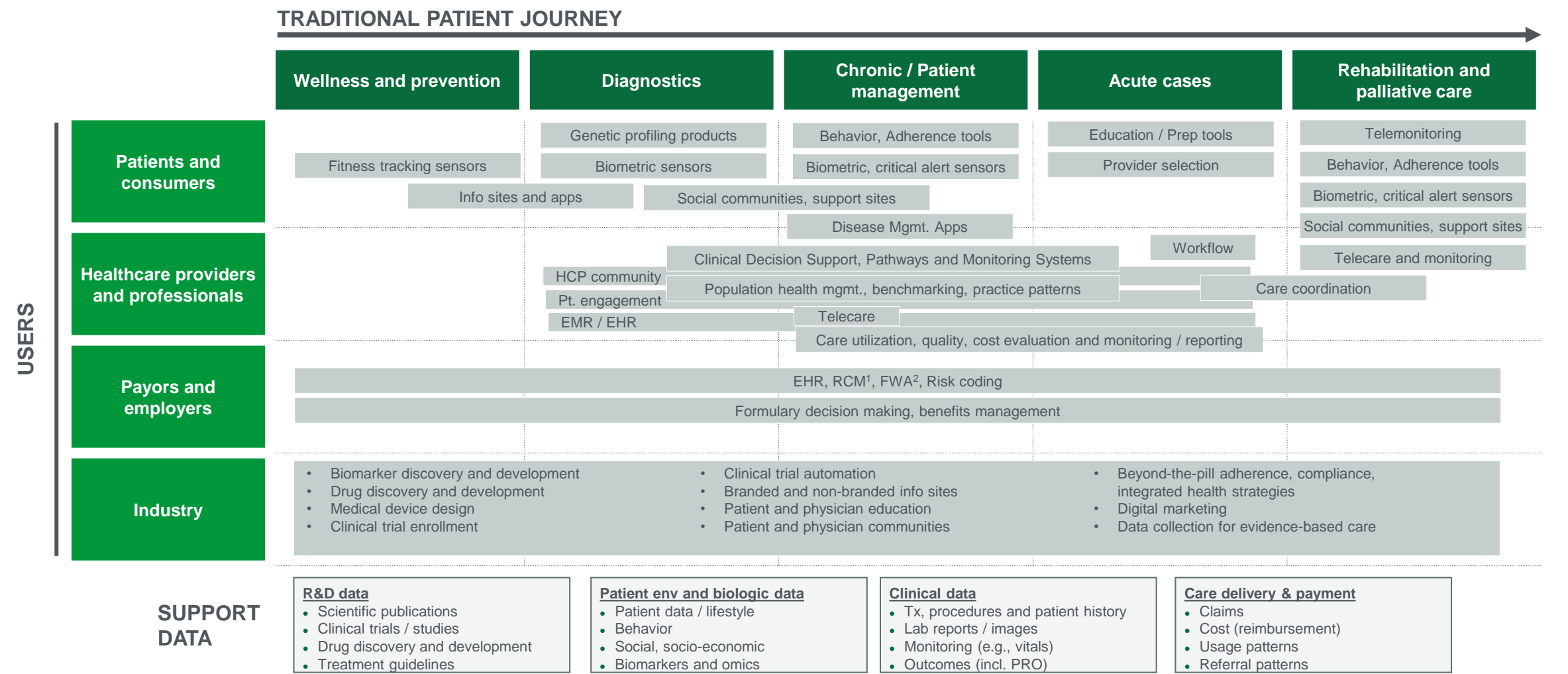
- ✓ **Better control of patient's conditions**, in early stages and during acute / chronic episodes
- ✓ **Quicker and cheaper development** of pharmacological and MedTech products
- ✓ **Operational and care delivery efficiencies**
- ✓ **Better engagement** with and navigation of patients
- ✓ **Innovative solutions** that better align with market participants' demands

Globally we see the development of Healthcare in 4 main waves; evolution has been slower in Brazil, in part due to relevant infrastructure gaps



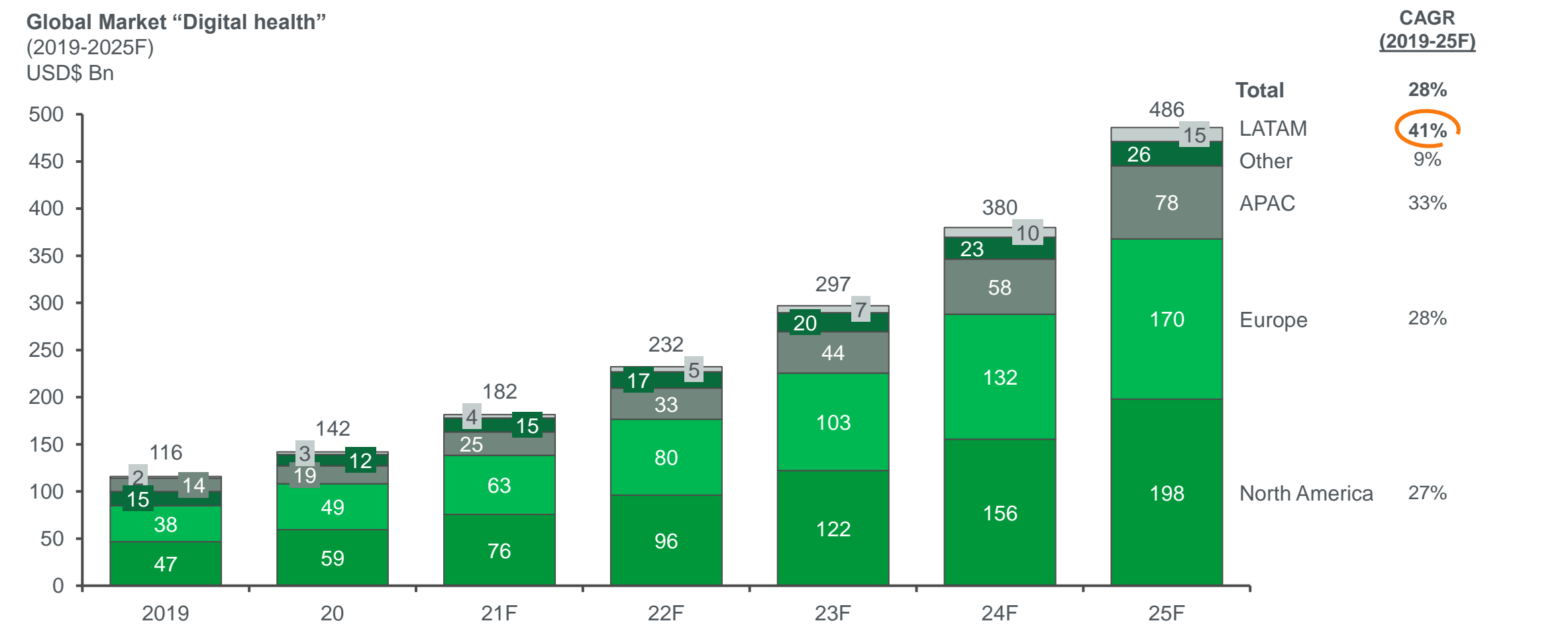
Sources: L.E.K. research and analysis

Health Tech has different use cases across the patient journey and the subsector of the Healthcare industry



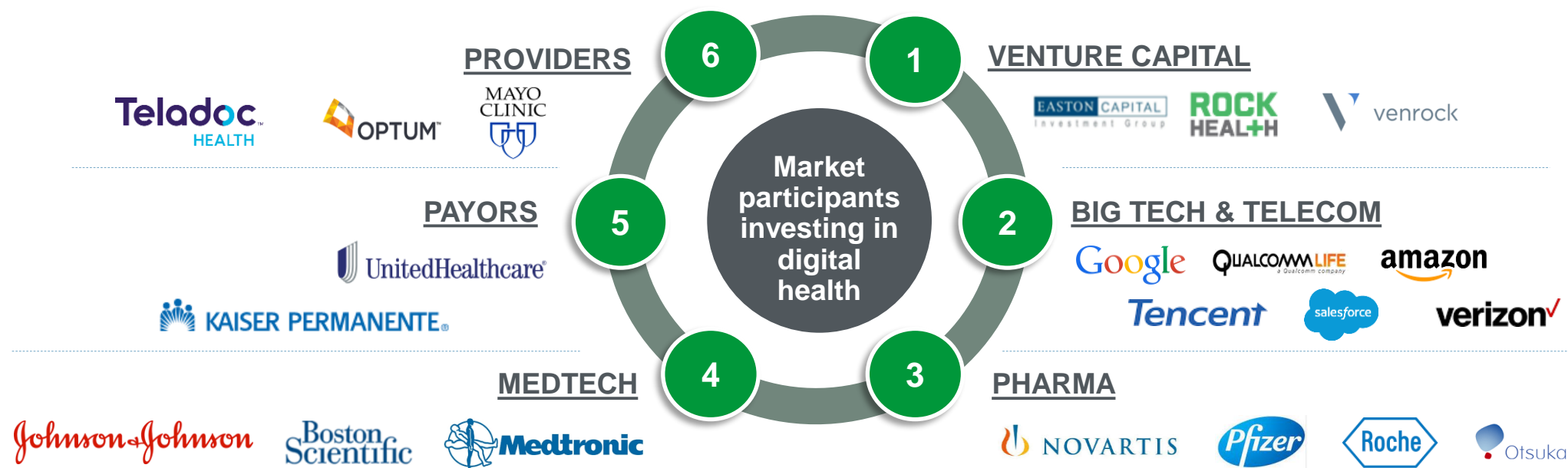
Notes: 1) Revenue cycle management, 2) Fraud, Wast and abuse
Sources: Allied Market Research; Acumen; Global Market Insights; McKinsey Healthcare IT News; Simmons and Simmons; L.E.K. research and analysis

Health Tech sector is growing at an accelerated pace and should reach ~\$485Bn in 2025; LATAM is small but it is growing fast



Note: 1) Includes software, hardware, and services for providers, payers, consumers, and others, but does not encompass analytics solutions for the industry
Sources: Allied Market Research; Acumen; Global Market Insights; Simmons and Simmons;; DigiPharma interviews, research and analysis; L.E.K. research and analysis

Different types of company, from within and from outside the Healthcare sector, are investing in Digital Healthcare

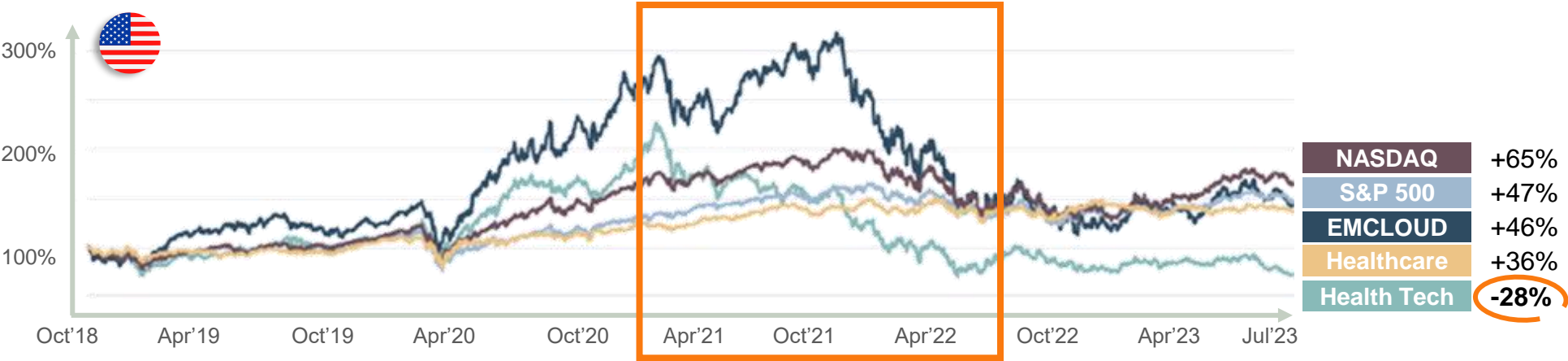


VENTURE CAPITAL Invest in scalable and high return digital health start-ups	TECHS & TELCO Capture a new avenue of growth in healthcare while leveraging core capabilities	PHARMA Invest in “beyond the pill” initiatives and digital health tools to help justify drug costs	MEDTECH Use digital to offer broader solutions, connecting providers and patients to optimize diagnostics and treatment	PAYORS Optimize care delivery and attendant costs	PROVIDERS Improve treatment outcomes and patient satisfaction
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Sources: L.E.K. research and analysis

In the US, the Health Tech sector has performed poorly over the last 5 years and after the end of the Covid pandemic

Stock market shares performance by sector
(Oct'2018–Jul'2023, USA)



Stock market shares performance by sector
(Feb'2021–May'2022, USA)



Sources: CapIQ; Bessemer Venture Partners; L.E.K. research and analysis

Health Tech

32 Health Tech companies used as proxy for the sector

Healthcare SAAS

CoreCloud

Model N

Optimize Rx

HealthStream

DEFINITE HEALTHCARE

HealthEquity

doximity

Veeva

SimulationsPlus

Health Catalyst

EngageSmart

Phreesia

Schrödinger

NUANCE

Tech Enabled Services

LifeStance

agilon health

CERTARA

Oak St. Health

Accolade

R1

signifyhealth

Teladoc

GoodRx

hims & hers

Livongo

OPRIVIA

prognity

evolent

talkspace

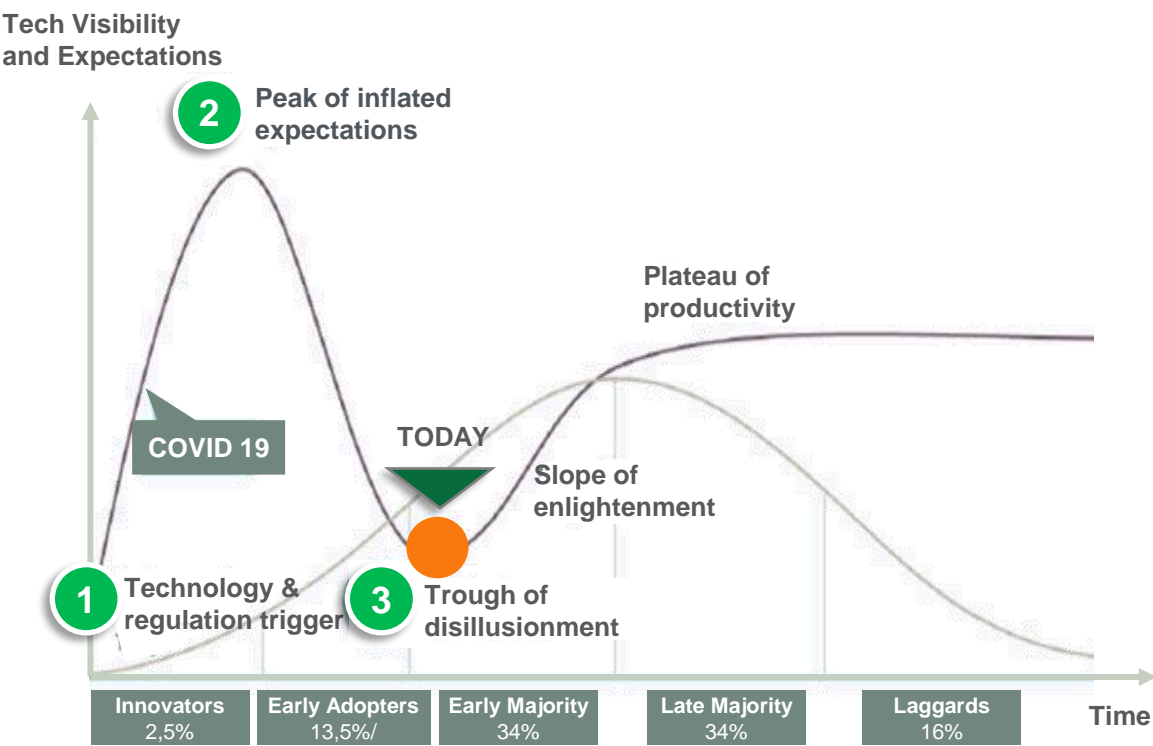
Alignment Health

amwell

one medical

But after a closer look, Health Tech performance seems to be reflecting the technology adoption curve, similar to what happened with Cloud focused companies that entered markets a decade earlier

New technologies are typically adopted over time, following an adoption curve with 3 main stages



This curve can partially explain market performance, Cloud tech companies followed a similar trajectory in the past



Sources: CapIQ; Bessemer Venture Partners; L.E.K. research and analysis

Health Tech is a vast sector, but startups in the space can be split into 6 main segments

HEALTHCARE SAAS Focus areas and considered companies

SOFTWARE FOR PAYERS

- **Software solutions** developed to meet Payers' business needs
- Solutions focused on helping them **optimize their business**, improving financial performance without compromising quality of care



SOFTWARE FOR PROVIDERS

- **Automated tools for clinical documentation and payment**, allowing patients to take a more active role in their own care
- Additional solutions to **improve communication** between providers and costumers



SOFTWARE FOR BIOPHARMA

- **AI-driven solutions** can companies **accelerate** drug discovery, clinical development research and regulatory submissions, **while reducing costs**
- Solutions also address **supply chain efficiency**



TECH ENABLED SERVICES Focus areas and considered companies

B2B2C

- SW solutions allow **B2B2C companies to offer 24/7 virtual care experiences** through data-driven models and virtual platforms
- Oncology, diabetes and fertility treatments benefit the most from a less fragmented approach to care



VALUE BASED CARE

- **VBC companies serve patients, payers and providers**, allowing to **reduce the total cost of care while improving its quality**
- **Tech solutions enable better utilization** of available resources, such as capital and technology



DIRECT-TO-CONSUMER

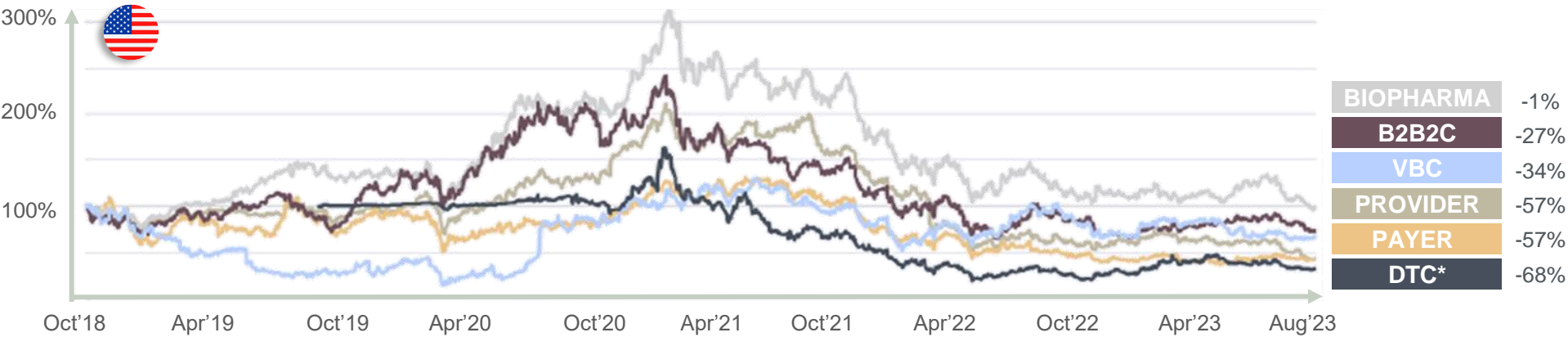
- DTC companies offerings vary **from savings** in drug and products to **telehealth** appointments
- **Tech solutions enable more personalized treatments**, in an increasingly consumer-driven industry



Sources: Companies' website; L.E.K. research and analysis

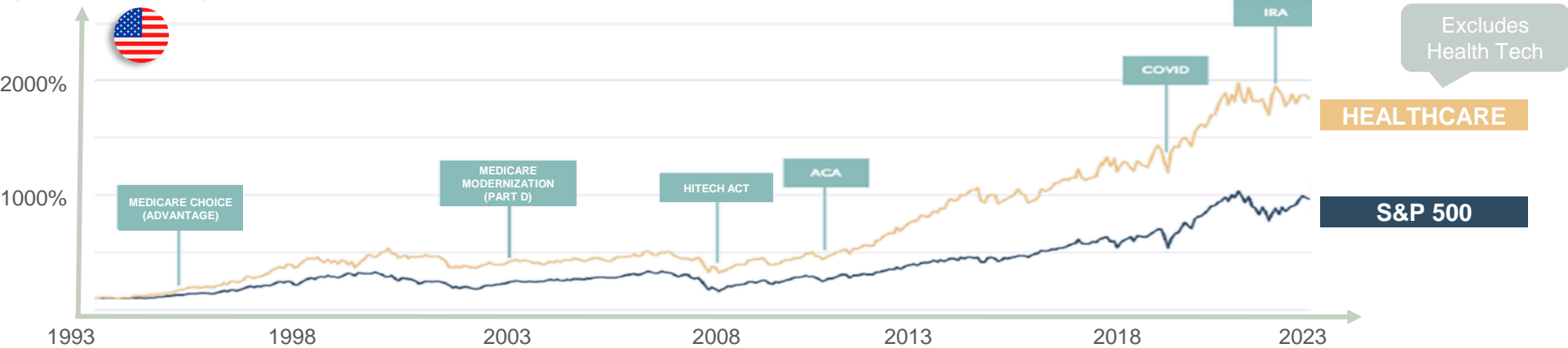
Some Health Tech sectors have been more resilient than others; if we look at Healthcare, sector historically outperformed the S&P500 by ~2x, further reinforcing Health Tech’s positive outlook

Health Tech markets performance by sector
(Oct’2018–Aug’2023, USA)



- **Health Tech** stocks performance has been more **stable since Apr’22**
- Gains driven mostly by **announcements of large acquisitions**, specially by CVS and Amazon

American stock market performance
(1993–2023, USA)

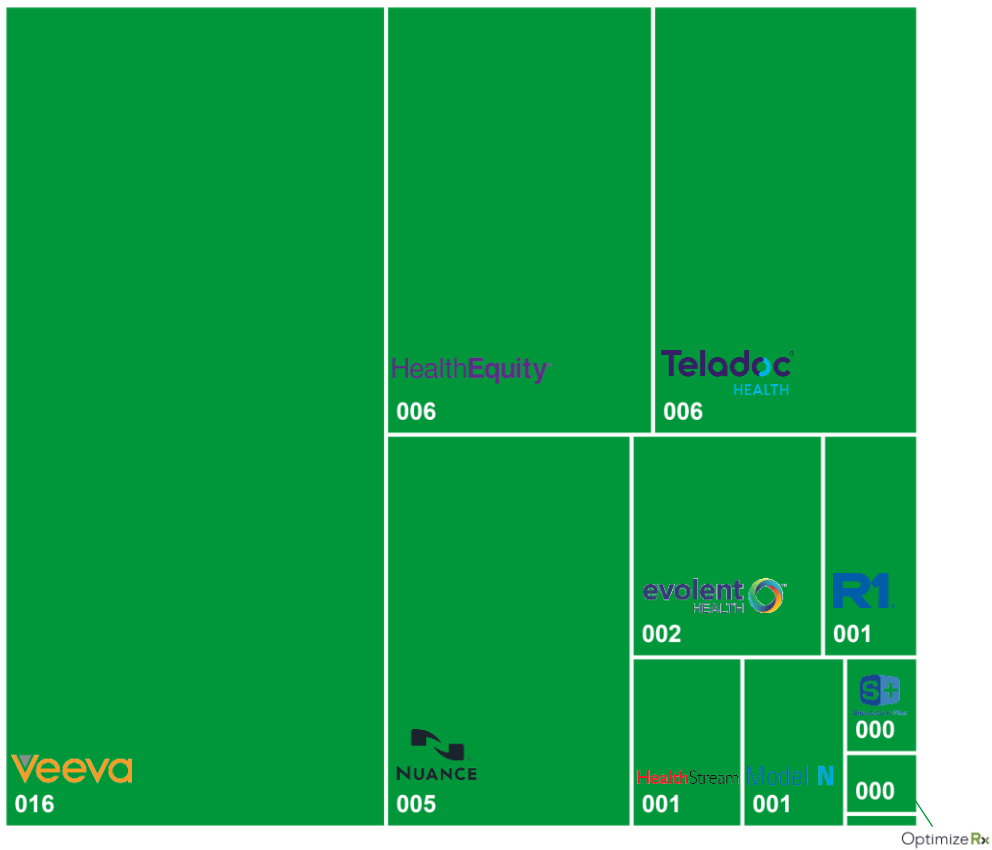


- **Healthcare sector¹** has **outperformed the S&P500** by **~2x** over the last 30 years
- Sector is traditionally **resistant to economic cycles**, but **growth** came mostly after **significant regulatory changes²**
- **Most of the value** in the sector captured by **incumbents**

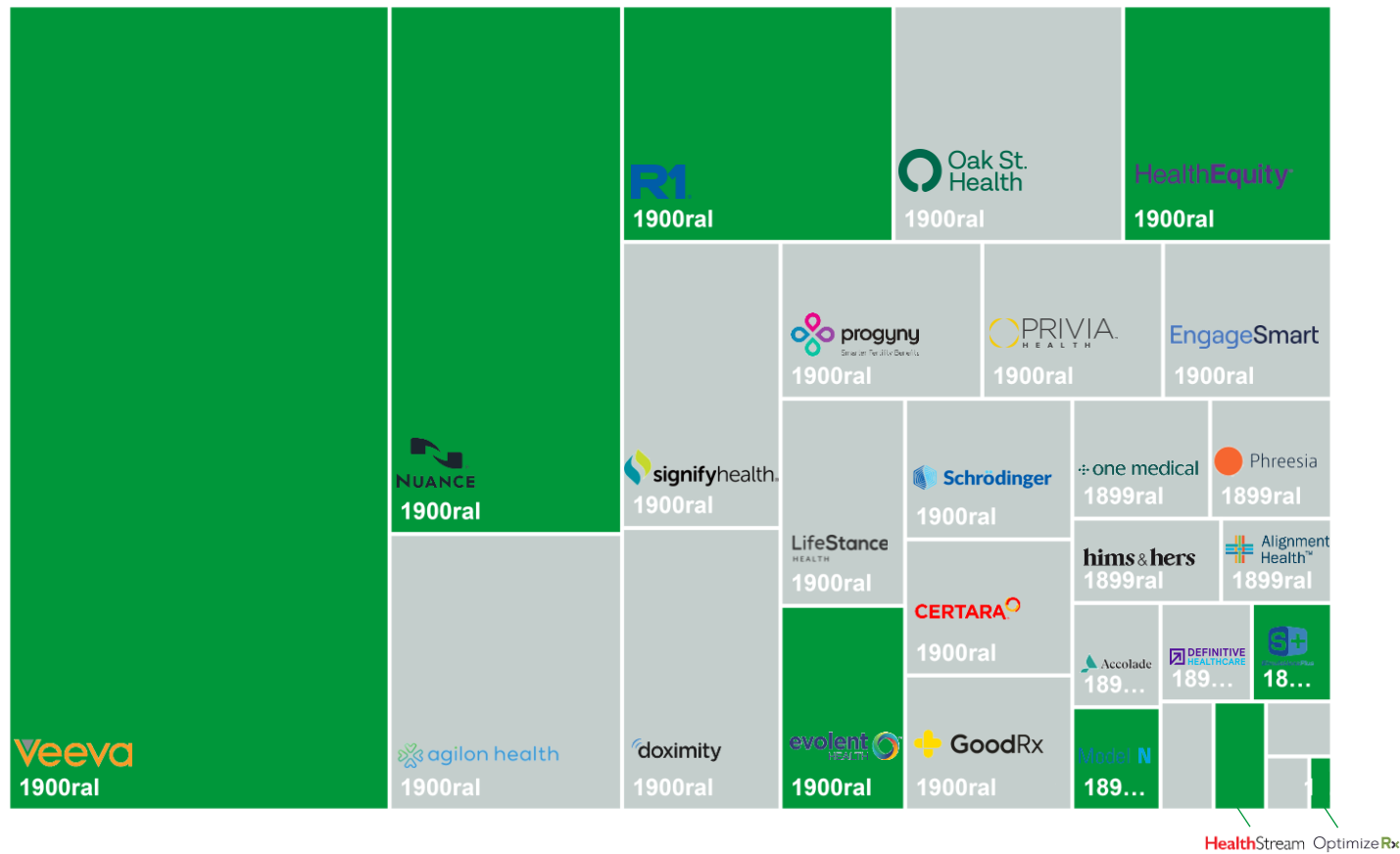
Notes: 1) HCX sub-index, Includes largest healthcare payers, providers, pharma and other healthcare players; 2) Medicare Advantage - 1995, Health and Social Care Act - 2008, Affordable Care Act - 2010, Pandemic - 2020
Sources: CapIQ; Bessemer Venture Partners; L.E.K. research and analysis

Even considering the recent (apparent) poor performance, Health Tech has still added significant value to the US economy, generating over \$90B of additional market cap in under 5 years

5 years ago
<\$40B market cap














Today
+\$130B market cap



Sources: CapIQ; Bessemer Venture Partners; L.E.K. research and analysis

Healthcare incumbents have been actively acquiring startups in an effort to keep up with innovation; +\$52B and ~25% of the total health tech market cap was acquired in the last 24 months

COMPANY	TRANSACTION VALUE	ACQUIRER	DESCRIPTION
Oak Street Health 	\$10.6B	CVS	Comprehensive preventive care, including personalized wellness plans, integrated health services, and educational and social activities
Signify 	\$8B	CVS	Value-based care solutions, software solutions that enable healthcare organizations and payers to transition from fee-for-service to value-based models
One Medical 	\$3.9B	Amazon	Membership-based primary care practice, offering customers seamless access to comprehensive care
Nuance 	\$19.7B	Microsoft	AI enabled solutions for the healthcare sector, from one of the first voice recognition systems to the most advanced ambient clinical intelligence
Benefitfocus 	\$0.6B	Voya Financial	Data-driven, cloud-based software solutions for health care and benefits administration
SOC Telemed 	\$0.3B	Patient Square	Acute care telemedicine provider, with +800 physical facilities with the technology and expertise to manage complex workflows and to provide high quality care
LifeWorks 	\$2.2B	Telus Health	Full-service employee assistance program and work-life/ wellness resources
Nextgen 	\$1.8b	Thoma Bravo	Develops and sells electronic health record software and practice management systems to the healthcare industry
Convey health 	\$1.1B	TPG	Built-for-purpose technology platforms with dedicated and flexible business process solutions
Nextech 	\$1.4B	TPG	EHR, Practice Management, Patient Engagement and Revenue Management that enables productivity and profitability for specialty practices
Tivity Health 	\$2.2B	Stone Point Capital	provider of health improvement, fitness and social engagement solutions.

Sources: CapIQ; Bessemer Venture Partners; L.E.K. research and analysis

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Although AI is still in an early implementation stage in Brazil today, we can already see relevant use cases within Healthcare

NON-EXHAUSTIVE



AI in Brazil – Overview

- **AI is still in an early implementation stage in Brazil**, the availability of robust databases, main input for AI/ML use cases, is still a **major bottleneck across most industries** and companies are still organizing internal databases so they can start experimenting and implementing AI solutions
- **In Healthcare specifically, the challenge is even bigger**, as players in the industry typically use different systems, even within their own operations, data exists within silos, communication between services is difficult and client information sharing is very limited
- **Health interoperability is on Government's agenda**, but while advances in AI/ LLMs and Cloud have drastically reduced the complexity to implement it **health providers have limited interest** in implementing it, as it would allow customers to easily switch between providers
- **Regulation is a major driver for adoption within healthcare**, but current local prospect is still uncertain, specific AI regulation is being debated since 2020 and some bills have been proposed¹, but given their initial state it's still unclear how the healthcare sector might be impacted
- **Still, AI use cases are already being leveraged by healthcare players in Brazil**, according to their focus, they can be segmented into three main areas: **1) Provider, 2) Patient or 3) Operations**
- **AI usage expected to continue to be incremental in coming years**, as technology and legislation evolve, supporting companies to further reduce costs and improve service

Note: 1) Bill proposal (PL) 21/20 and PL 2338/23

Sources: Morgan Stanley reports; Expert interviews; L.E.K. research and analysis

Current AI use cases in Brazil can be segmented according to their focus: Provider, Patient or Operations (1/2)

NON-EXHAUSTIVE



Fraud and Revenue Management

Fraud and revenue management

- **Potential for AI usage in anti-fraud is significant** as fraud generates a **major cost in Brazil**, ABRAMGE estimates reimbursement fraud alone represents 2% of total claims, amounting to ~BRL \$4 B in lost revenues in 2022
- **AI and LLM tools** allow to **significantly reduce people/ manual costs** associated with checking for **inconsistencies in reimbursement** requests (prices charged, frequency, etc.), supporting and automating procedures authorization, and **reducing general costs**
- **Revenue management solutions** are normally **developed targeting Payor** (typically the Insurer) **or Providers** (Hospitals, Clinics, etc.):
 - ✓ **Kuri Saúde:** has an automated solution that interprets the contracts between hospitals and insurers, that typically have hundreds of pages, converting them into an easy-to-read set of rules that can be integrated into the hospital's workflow
 - ✓ **Benner, Orizon and ARVO:** their software solutions leverage AI to identify and reduce fraudulent claims, potential abuses and opportunities to reduce waste along the value chain



Medical support

Medical professionals support

- **Hospitals in Brazil already leverage AI/ML models support medical diagnostics**, producing more precise diagnostics and a better patient experience. That said, **but full automation is not expected for now** due to regulatory and consumer perception
- **Diagnostic equipment providers** use AI/ML-powered analysis to give **diagnostics faster and with higher precision** helping in the early detection of diseases and improving patient outcomes; the exam is also faster, allowing greater machine utilization
- **AI can also be used to increase doctor's productivity**, by releasing them from administrative work. AI powered software solutions can listen to consultations and automatically fill medical records (e.g., Copilot, Abridge)

Current AI use cases in Brazil can be segmented according to their focus: Provider, Patient or Operations (2/2)

NON-EXHAUSTIVE



Patient focused

- **AI powered solutions allow companies to improve customer experience** along all the touchpoints at a relatively low cost, automated chatbots can interact with patients along all the patients journey, creating customized communications in specific touchpoints, allowing to provide a better support and reduce complaints, all without requiring a major investment in personnel
- **Some early uses to “replace” doctors**, mostly acting as a **patients pre-screening** before passing patients along to a real doctor, such as Youper, a startup that leverages AI to automate text based basic psychiatric support, reducing the need to see a real psychiatrist



Pharma operations

- **Internationally AI is already highly leveraged in drug discovery**, to generate new molecules and treatments at reduced costs; but Brazilian companies' R&D focus on smaller innovations, in part due to demanding regulatory approval processes
- **AI is therefore leveraged more in other areas**, as to develop prediction models to estimate regional demand of specific SKUs which should support inventory control and sales, improving inventory control and reducing costs
- **Local drugstore chains also leverage AI solutions to sell more**, focusing on cross-selling, targeted discounts, etc.; these companies, have robust client databases, which should facilitate implementing new AI innovations that emerge (specially RD)

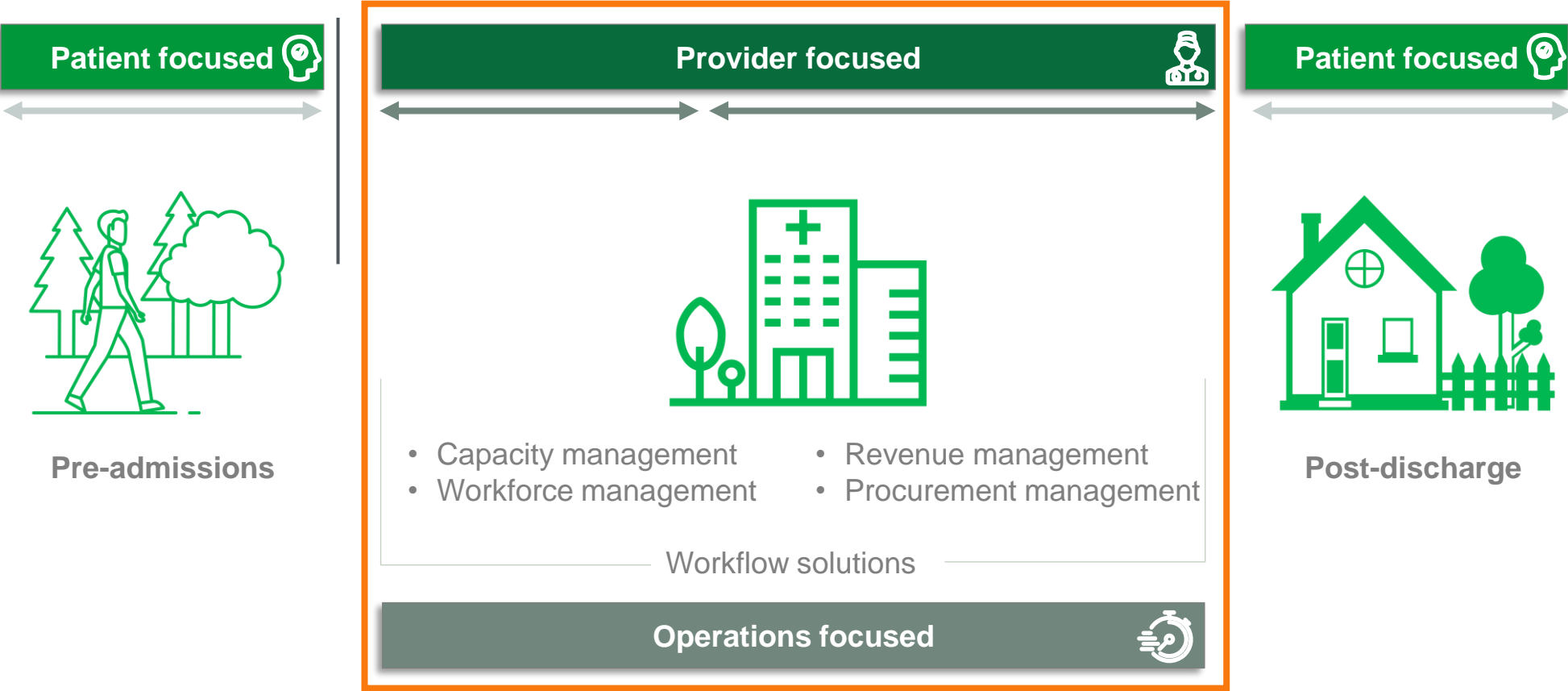
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In hospitals, AI can be leveraged to address pain points along the patients' journey

PRELIMINARY

AI usages across the patients' journey










HOSPITALS

Sources: Kansal & Company; L.E.K. research and analysis

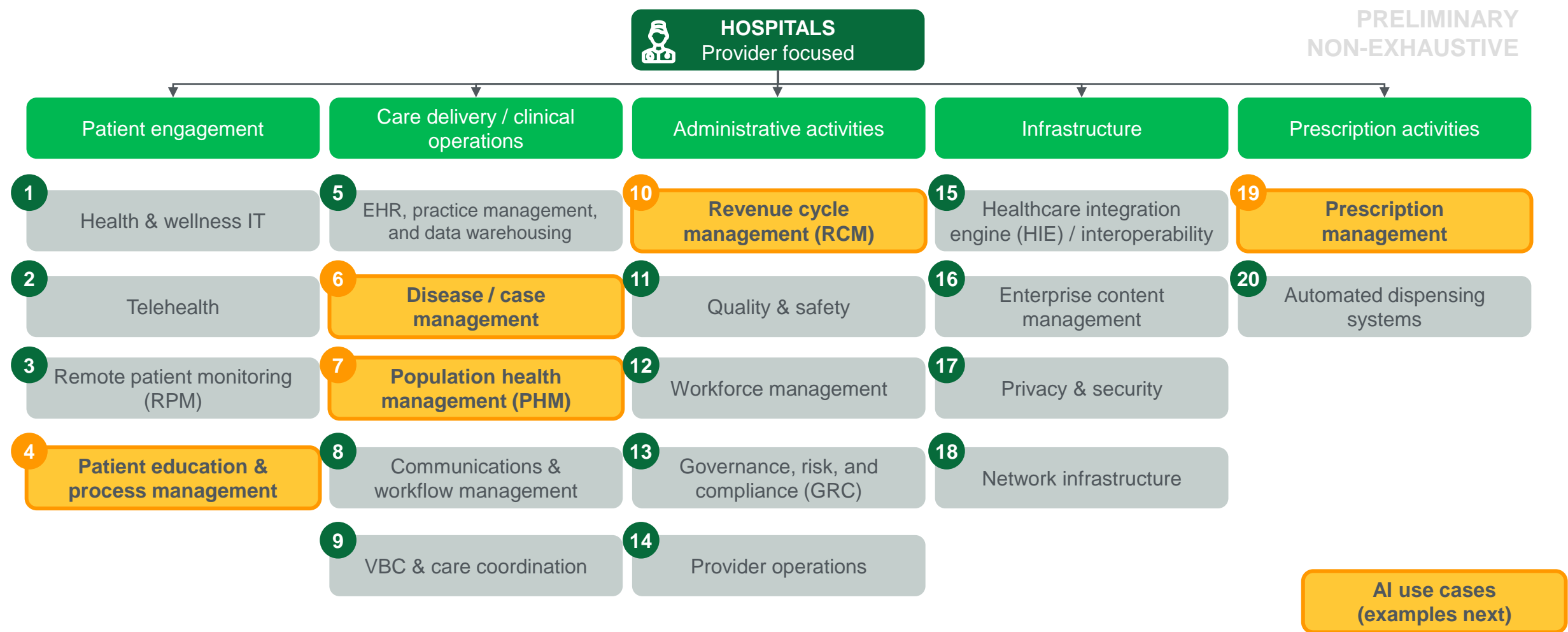
AI in a Hospital can be used for clinical purposes, to improve communication and interaction with the patients or to improve operations

AI focus areas for Hospitals

PRELIMINARY
NON-EXHAUSTIVE

Provider focused		Diagnostics: AI tools developed to assist in the diagnosis of disease, often for conditions that are under-reported or under-diagnosed (e.g., diabetes)
		Clinical decision support: AI systems with the objective of providing physicians and other healthcare staff assistance in making decisions related to a patient's care
		Disease prevention, monitoring, and treatment: This broad category of healthcare AI solutions aims to improve the way in which healthcare providers prevent the spread of disease, as well as monitor and treat diseases among their patient population
Patient focused		Population health management and benefits administration: Programs with the goal of maintaining and improving the health of broad patient populations, as well as administering benefits (e.g., insurance) to those populations
		Patient adherence: AI solutions developed to assist healthcare providers in improving patients' post-discharge compliance with their treatment (e.g., taking medications, attending follow-up visits, etc.)
		Self-management solutions (Patient services): A broad category of healthcare AI solutions encompassing fitness and wellness (e.g., personalized health trackers), consumer health information (e.g., knowledge tools, personal assistants), care coordination, and on-demand healthcare services (e.g., telehealth)
Ops. focused		Workflow solutions: Solutions seeking to improve the efficiency and accuracy of both clinical and non-clinical workflows for healthcare providers (e.g., medication prescription, data entry, patient communication, etc.)

Existing AI use cases across Hospitals can range from augmenting clinical decisions to streamlining administrative burdens



AI use cases within Hospitals

Selected examples

PRELIMINARY
NON-EXHAUSTIVE

EXAMPLE AI USE CASES

4 Patient education & process mngt.

Personalized guidance and support on the patient side, as well as improving efficiency for healthcare providers

- **Personalized patient education:** uses patient data (e.g., medical history, demographics) to personalize education materials
- **Intelligent symptom checker:** interprets symptoms to provide personalized guidance
- **Predictive analytics:** from EHRs data, predicts patients most likely to miss appointments and / or require follow ups
- **Patient communication chatbots:** powered by AI can provide patients with real-time answers to inquiries about health and treatment
- **Virtual assistants:** can help patients manage their health and treatment (e.g., medication reminders)

6 Disease / case management

Improved patient outcomes while reducing healthcare costs

- **Early detection:** early signs of diseases using algorithms that analyze medical images
- **Personalized treatment:** developed using AI to analyze patient data (e.g., symptoms)
- **Risk assessment:** predict risk of certain diseases
- **Clinical trials:** identify suitable participants and predict treatment outcomes based on clinical trial data
- **Remote monitoring:** by leveraging wearable devices and other sensors, detecting early signs of disease

Sources: L.E.K. research and analysis

EXAMPLE AI USE CASES

7 Population health management

AI powered software enables more personalized, proactive and efficient care delivery

10 Revenue cycle management

AI powered software allows improved revenue outcomes for healthcare organizations

19 Prescription management

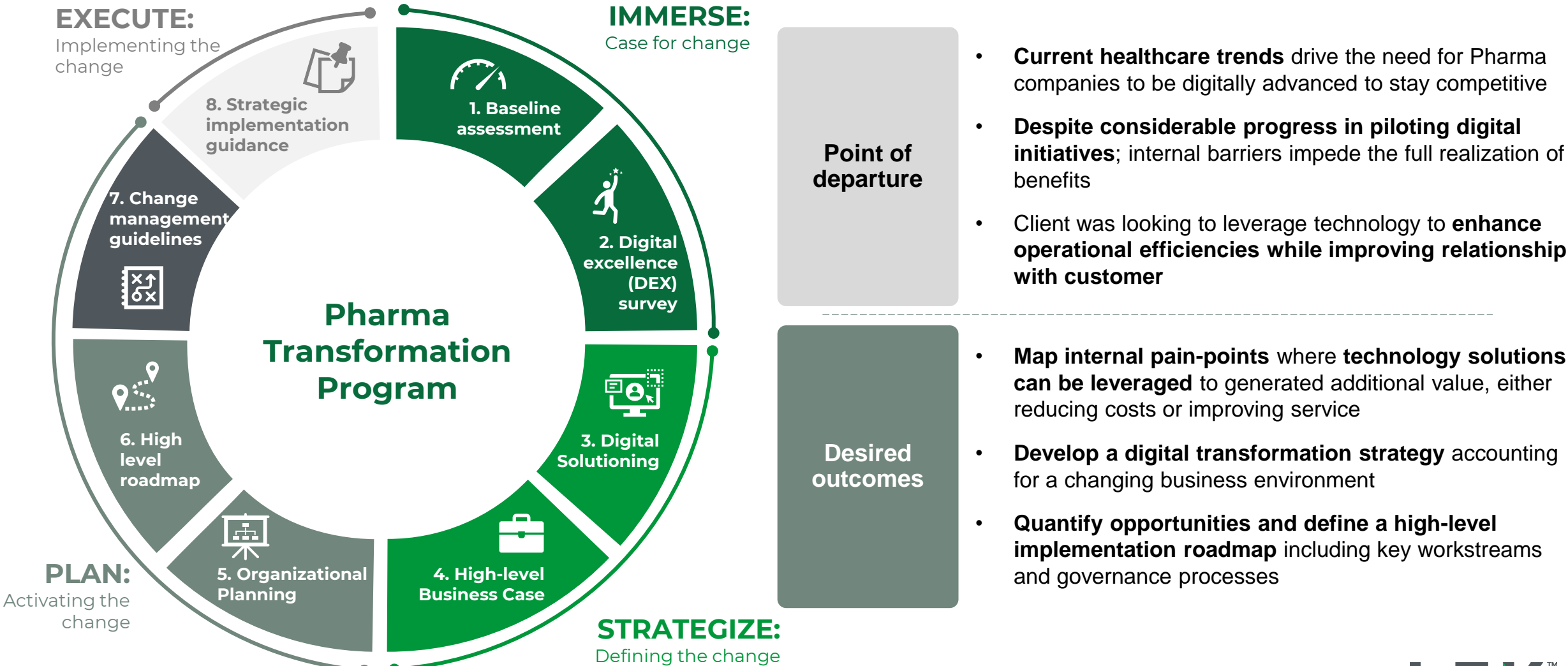
Improved accuracy, efficiency and overall patient outcomes

- **Risk stratification and prediction:** identify most at risk for developing chronic diseases or adverse issues
- **Disease management and prevention:** identify potential issues before they become more severe
- **Clinical decision support:** real-time decision support, such as personalized treatment recommendations
- **Resource optimization:** by identifying patients needing more intensive care or prioritizing appointments for those with increased risk levels
- **Predictive analytics:** predicts future revenue and identify areas of potential revenue loss
- **Intelligent billing:** analyzes patient data to identify effective billing strategies for each patient
- **Fraud detection:** identifies patterns / trends that may indicate fraud
- **Processes automation:** creates automated workflows for authorizations and claims
- **Predictive analytics:** predict future medication needs accurately
- **Personalized medicine:** tailored medication plans
- **Drug-drug interaction alerts:** alerts prescribers of potential adverse drug interactions or side effects
- **Automated refills:** for patients with chronic conditions
- **Drug dosage recommendation:** accurate dosage for a medication based on patient's specific data

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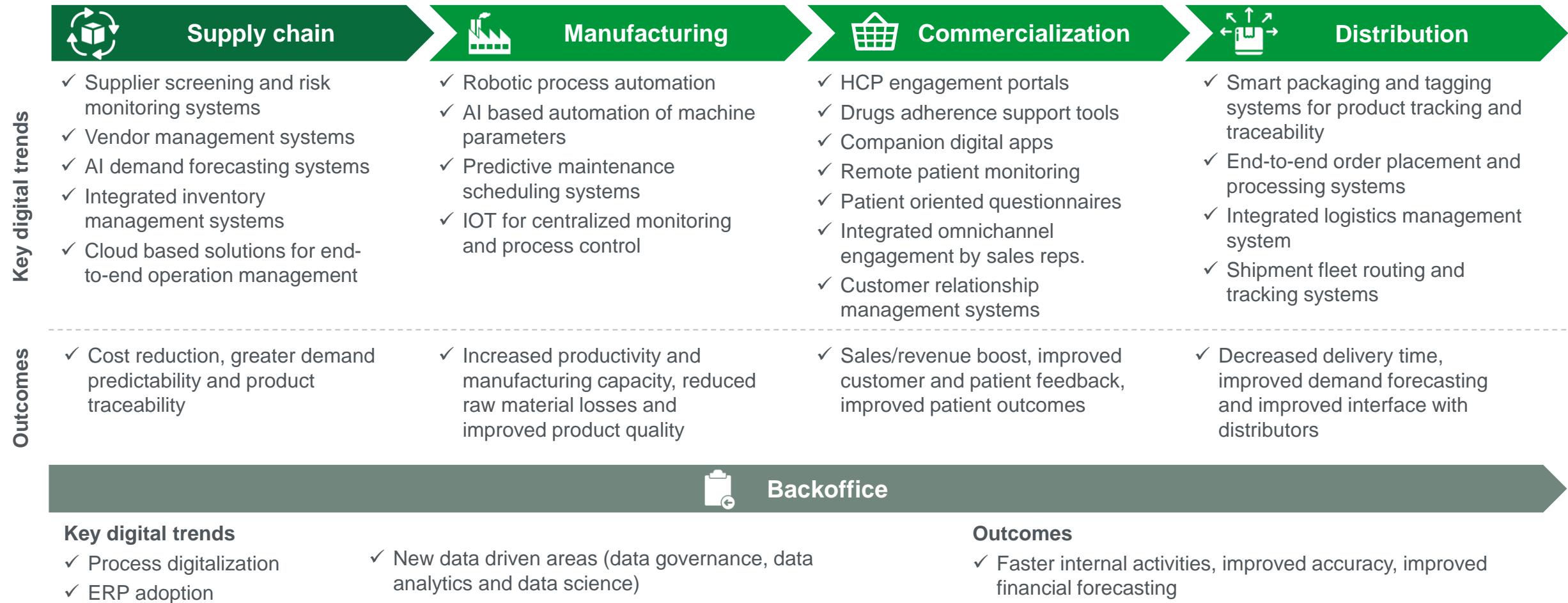
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L.E.K. helps Pharma and other healthcare players to think about their digital strategy in a holistic way






There are several way in which digital solutions can be used to improve a business (Pharma Example)

NON-EXHAUSTIVE



Notes: HCP – Health care professional
Sources: DigiPharma; L.E.K. research and analysis

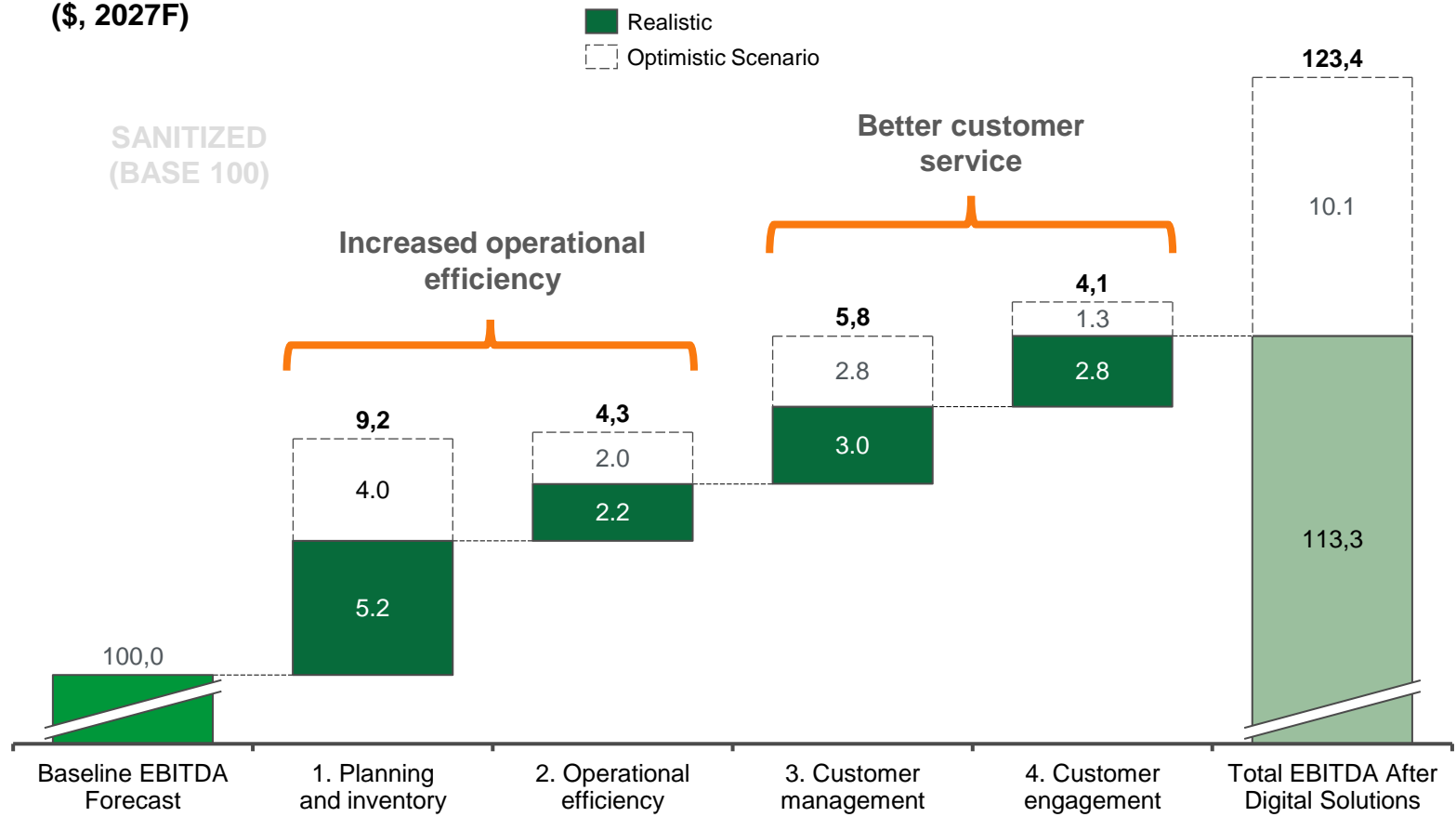
Each of these solutions can be used to solve specific pain-points (Pharma Example)

	Stakeholders	Summary of pain-points / priority areas	Proposed solutions / capability needs	Digital systems
	Supply Chain & Manufacturing	<p>Planning & inventory: Low demand forecasting accuracy; low integration between planning systems across functions</p> <p>Operational efficiency: Non-optimized set-ups impacting OEE; Limited real-time visibility, management and control of production process</p>	<ul style="list-style-type: none"> • Integrated S&OP platform across the value chain, including demand forecasting, procurement and inventory control, leading to better raw material planning and less set-ups • Dashboard with real-time data over production processes and equipment parameters, allowing on-time action on issues • Automated production line planning and simulations of scenarios • System to manage equipment status, predictive maintenance and planning 	<ul style="list-style-type: none"> • Demand forecasting system • Inventory management system • Supervisory control and data acquisition (SCADA) • Manufacturing execution systems • Asset management software
	Commercialization	<p>Customer management: Absence of centralized systems to systematically record and manage customer interaction/feedback</p> <p>Customer engagement: Limited differentiation in customer engagement approaches</p>	<p><u>Physicians/Pharmacists</u></p> <ul style="list-style-type: none"> • Platform to manage doctors/pharmacists and track engagement history / frequency and feedback • Centralized system to automate collection of sales engagement content and optimize SF allocation, routing, samples/corporate gifts management and performance • Segmented approach to customers considering main needs and preferences <p><u>Distributors/Pharmacies/Institutional</u></p> <ul style="list-style-type: none"> • Visual dashboard with integrated inventory levels, orders historic and other client information (e.g.: financial data) • E-commerce for distributors and pharmacies <p><u>Patients/Consumers</u></p> <ul style="list-style-type: none"> • Direct-to consumer engagement, including loyalty initiatives (e.g.: cashback), surveys, digital therapy and education support along with the patient treatment 	<ul style="list-style-type: none"> • CRM platforms • Sales force optimization tools • Omnichannel engagement (channel mix optimization) • E-commerce platforms • Medication support systems
	Organization wide data management	Data management: Absence of stratified data, integration and analytics systems	<ul style="list-style-type: none"> • System to collect multiple data-points across the operation to support holistic data analysis • Real-time visualization of business performance data 	<ul style="list-style-type: none"> • Data structure • Business analytics tools

Sources: L.E.K. research and analysis

Operational focused initiatives can have the same (or better) bottom line impact than customer focused initiatives

Total potential EBITDA uplift from digitalization of priority areas
(\$, 2027F)



Main Assumptions:

- **Revenues uplifts and cost savings** from digital solutions were the basis for the calculation of the EBITDA uplift
- **Ramp-up varies for solutions** depending on complexity and required scale of implementation

Main Drivers:

- **Cost savings** can be realized from productivity gains in production, commercialization and reduced administrative tasks
- **Revenue uplift can be expected for customer-oriented solutions** aimed at redefining customer relationships

Sources: DigiPharma interviews, L.E.K. research and analysis

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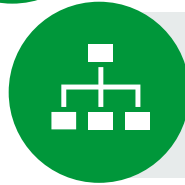
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- **How to think about Digital Maturity in Healthcare?**

A company's Digital Maturity can be measured by how advanced it thinks on five dimensions – Digital Strategy, Organization, Operations, Customer and Business Models

- **There are five key areas that support "digital excellence" for companies** from a holistic perspective, which can be used to evaluate a company's Digital Maturity
- **The DEX framework has been applied in numerous situations for healthcare, MedTech, and life sciences clients**; for example, in board presentations, strategy development, portfolio prioritization, and roadmap development



Development of a digital **strategy**, implemented through...



building a digital **organization**, supported by...



modern digital **operations**, which supports...



developing a relentless **customer focus**, and enabling...



continuous reinvention of **business models**

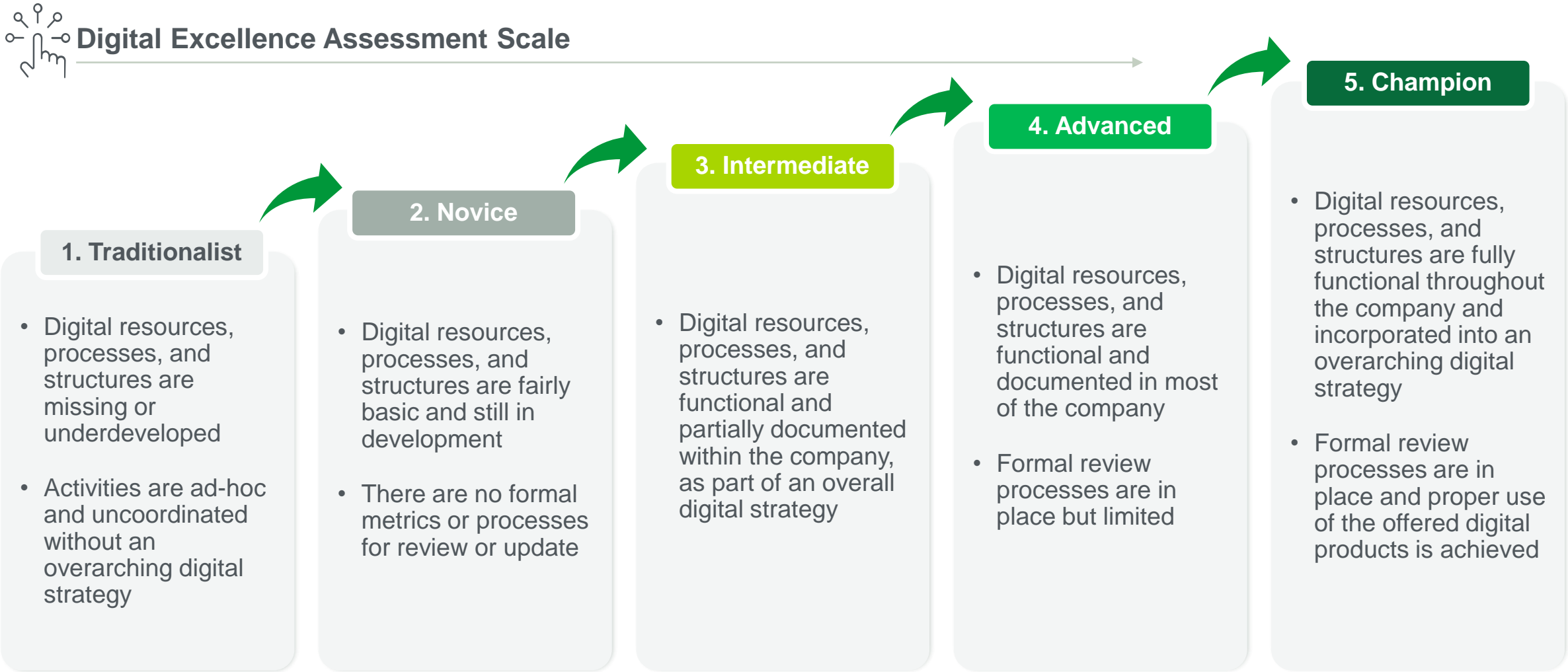
The DEX focus on five key dimensions for the digital transformation – Reimagine, Reorganize, Rebuild, Refocus and Reinvent, which can be further segmented into nine subcategories

INDICATIVE



Sources: L.E.K. Consulting

The DEX allows assessment and classification of companies' digital maturity in five levels - Traditionalist, Novice, Intermediate, Advanced and Champion

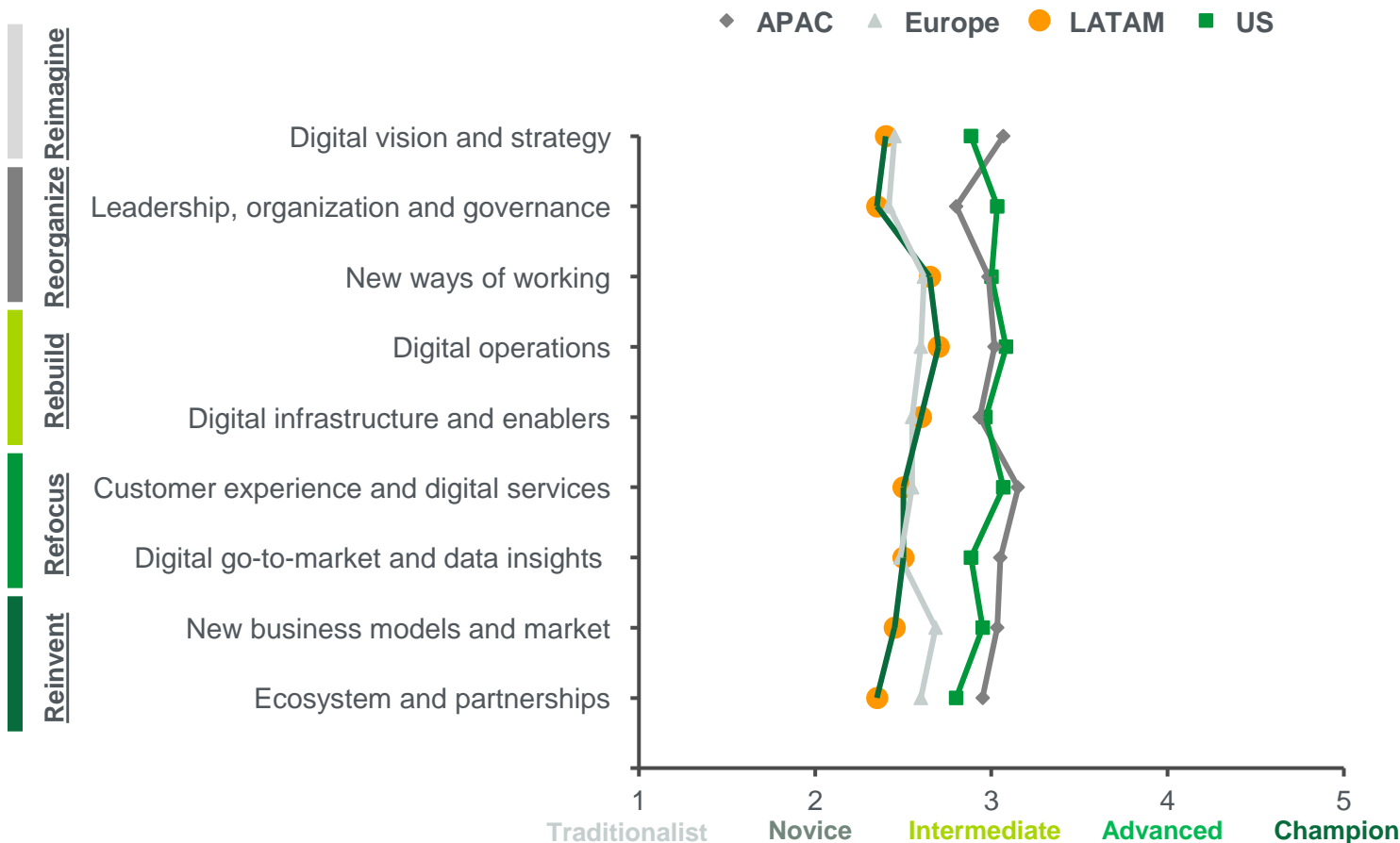


Sources: L.E.K. research and analysis

LATAM is still at an initial stage of its digital transition, as is Europe, both regions lagging US and APAC

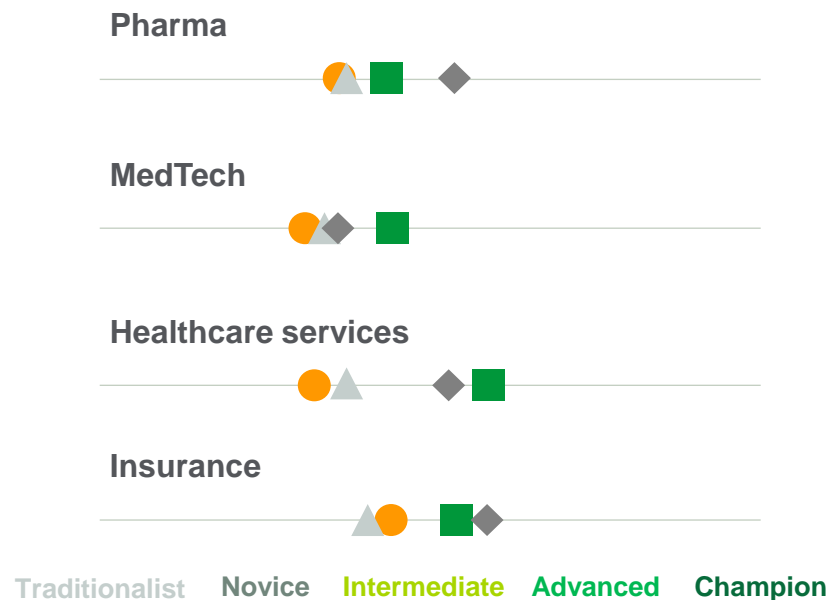
Digital Health Index, 2022

Scale: Traditionalist (1) – Champion (5)



Digital Health Index – Geographies average, 2022

Scale: Traditionalist (1) – Champion (5)



- Most regions have their subsectors at levels in line with their overall DEX, indicating that no subsegment has a greater influence on the level of digital development in each geography
- LATAM scores below peers in all subsectors, except for insurance, the most advanced sector in the region

Health Technology Overview

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