

AI FOR DRUG DISCOVERY, BIOMARKER DEVELOPMENT AND ADVANCED R&D LANDSCAPE OVERVIEW 2018 / Q2

Companies - 100 Investors - 220 Corporations - 30 R&D Centers - 20 Conferences - 20



Al for Drug Discovery, Biomarker Development and Advanced R&D Landscape Overview 2018 / Q2

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Al for Drug Discovery, Zaρρos VTF **Biomarker Development** BOE MITS FUND and Advanced R&D DIGITAL UpHonest Capital THIRD ROCK Landscape / 2018 Q2 SOFINOVA Amadeus 20 nesta 😽 Capital One Lenovo CiTRIX BAKKEN & BÆCK **Numerate** AllBright WARBURG PINCUS **inato** Lantern Pharma antidote // **Drug Discovery Advanced R&D** rativ GLOBAL HEALTH
INNOVATION BioSymetrics Exidence RECURSION S 👭 Felicis Ventures SILICON BADIA Data Collective MGV -- CI RESONANT Globavir inno≥L€XU5™ Plex (ZhenFund bootstrap Meta Bio CEI BenevolentAl HEALTH Tencent 确示 XtalPi hactevo NuMedii TIII CREATIVE S DESTRUCTION S e-Therapeutics plc DEEP 6 AL AMGEN IKT@S 伤 GTN LTD ERICSSON illumına^{*} Biorelate Canon illumına^{*} celsius NURITAS **Investors** ECL OKYNDI evotec Tencent 腾讯 CASDIN PHARNEXT Biovista Karlın Pharma IT **Al Companies** two≲AR IRIS.AI PLUGANDPLAY COMCAST VENTU Google KNOWLEDGE S DRAPER EDB MERCK (intel) khosla ventures **Corporations** insitro true ventures FREES Microsoft engine sorrento LanzaTech AstraZeneca SANOFI ventures Mendel.ai IRM AcuraStem CYTOX Foundation enterprise Bios Partners CLINIC Seed Fund Spring enomics teselagen SYNTHACE I Start VIRVIO ENVISAGENICS matrix Boehringer Ingelheim **CULTIVIAN** SANDBOX HITACHI de Exscientia novoheart nQ BIOAGE JUVENESCENCE.AI ANDREESSEN trials.ai (0) H C S = Darling A PHENOMIC AL DATAVANT KPCB SMEDVIG* LANSDOWNE VENTURES **FDNA** Bloomberg **NJF**CAPITAL THIELFOUNDATION 11.2 Capit techammer SoftBank REVEAL & BIOSCIENCES 8VC Banc Ventures Korea **MATRIX** CLOUD MEDX ReviveMed SOFINIOVA SYNDICATE woodford **EURETOS** MediBic Group GNS HEAITHCARE AFORE CAPITAL initialized() Pritzker Group NEWDO @CAMBIA RIVAS CAPITAL Boundary Capital DORM ROOM MITSUI&CO. IT HERITAGE PROVIDER NETWORK FAIRHAVEN COTINGA bdc* Celgene L2 VENTURES C PALMDRIVE BULLFROGAL

Biomarker

Development

DEEP

KNOWLEDGE ANALYTICS

Companies - 100 Investors - 220 **Corporations - 30**

Diversification of Al for R&D and **Drug Discovery process**





Preclinical

Experiment

Execution

novoheart"

SYNTHACE I

-

ECL A

EMERALD





Optimization. Recruitment Drugs



信中利

TVP

Clinical Trial





SOFINIOVA 🦃

BIOECONOMY ENDURE

MC III III

NEWDO TECHU

RIVAS CAPITAL

WORLDQUVNT VENTURES





Lantern Pharma



Preclinical

EURETOS





6 OS FUND

Alphabet UNIVERSITY INNOVATION





Al for Drug Discovery, **Biomarker Development** and Advanced R&D Landscape / 2018 Q2

USA

FOUNDERS FUND SUTTERHILL LanzaTech

VENTURES Zappos

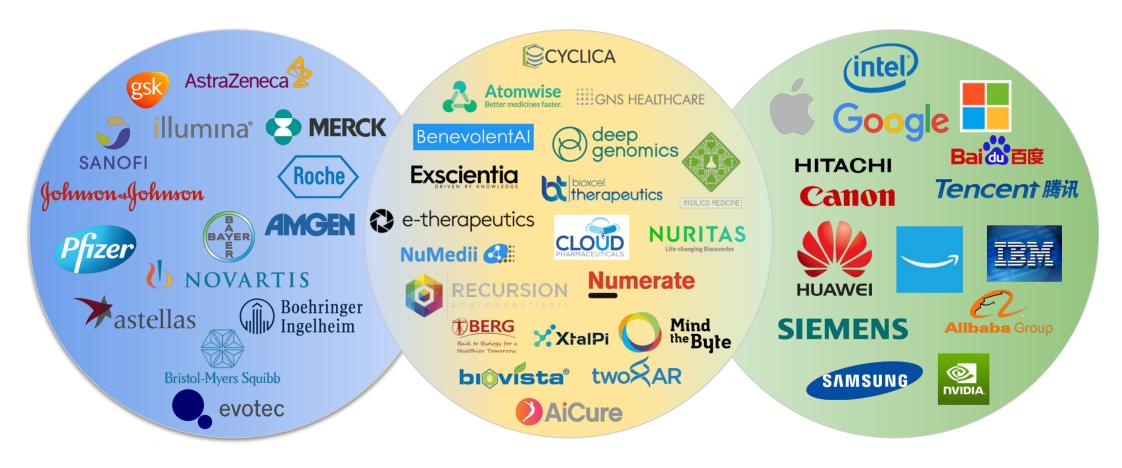
FAIRHAVEN

Companies - 100 **Investors - 220 Corporations - 30**

> Regional **Position**



Leading IT and Tech Corporations / Al Companies / Pharma Corporations Advanced Al in Healthcare and Drug Discovery





Al for Advanced R&D and Drug Discovery 2018 / Q2

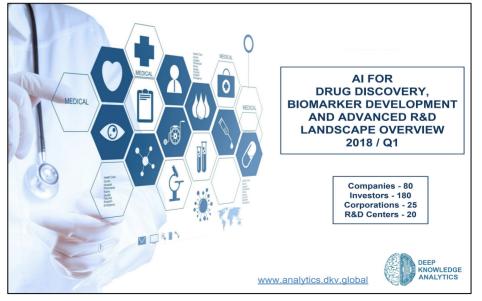
In the end of 2017 our analytical department released its inaugural report on the state of AI for Drug Discovery industry, entitled "AI for Drug Discovery Landscape Overview 2017".

In April 2018 we released a subsequent report entitled "Al for Drug Discovery & Advanced R&D Q1 2018".

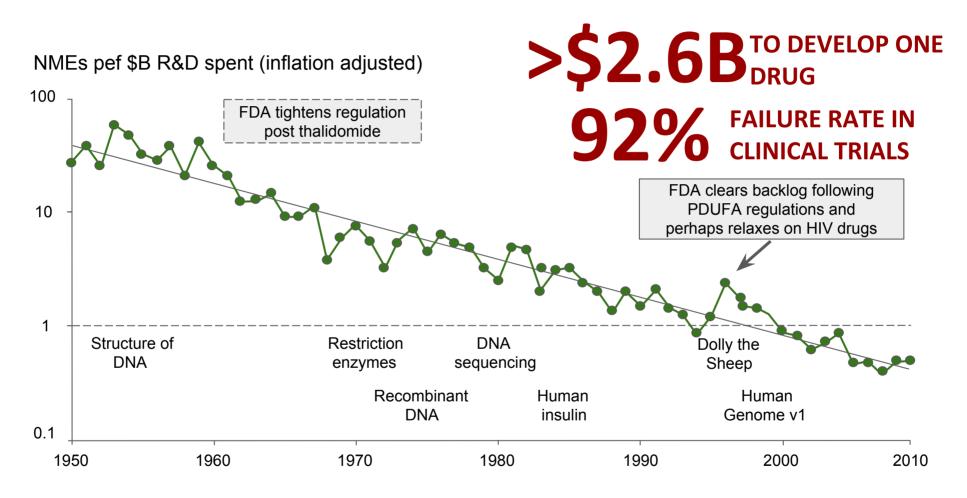
The present report is a significantly extended edition with more in-depth coverage of specific topics, and which has aggregated all important industry developments occurring in the second financial quarter of 2018.

The second quarter of 2018 saw major changes, significant investments, acquisitions, and the establishment of substantial joint ventures. This serves as a stark reminder of how fast the AI for Drug Discovery, Biomarker Development and Advanced R&D sector is advancing. Many trends noted in our last report have continued and intensified, while other new trends have emerged as well.





Pharma Efficiency is Declining Steadily



Bernstein Research: The Long View - R&D Productivity, 2010

46 NEW DRUGS launched in 2014

Source: adapted from Insilico Medicine investor presentations, www.insilico.com

GLOBAL SALES:

>\$1 Trillion

GLOBAL R&D:

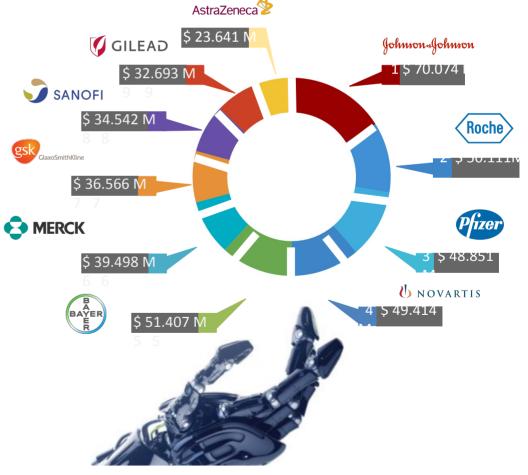
>\$150 Billion



>\$2.6B TO DEVELOP ONE DRUG

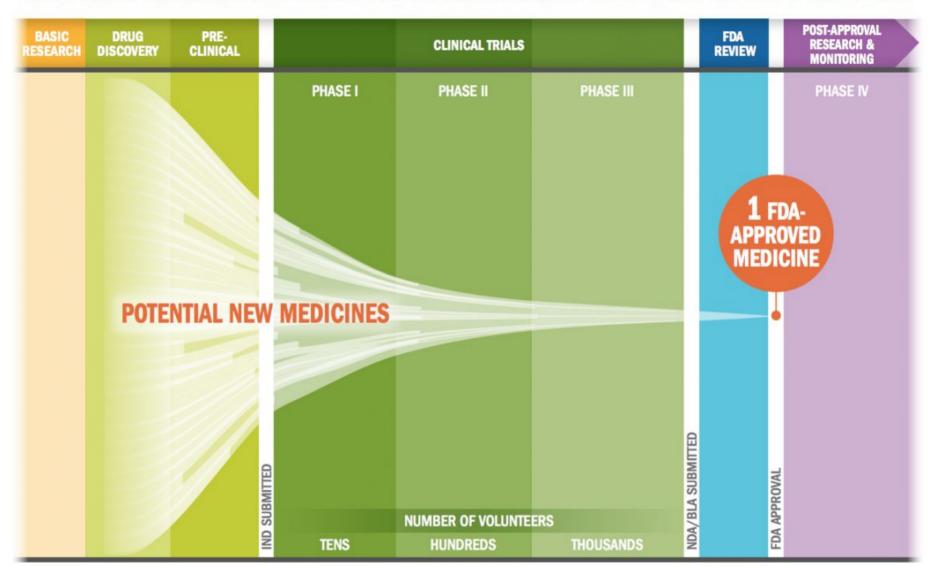
92%

FAILURE RATE
IN CLINICAL
TRIALS



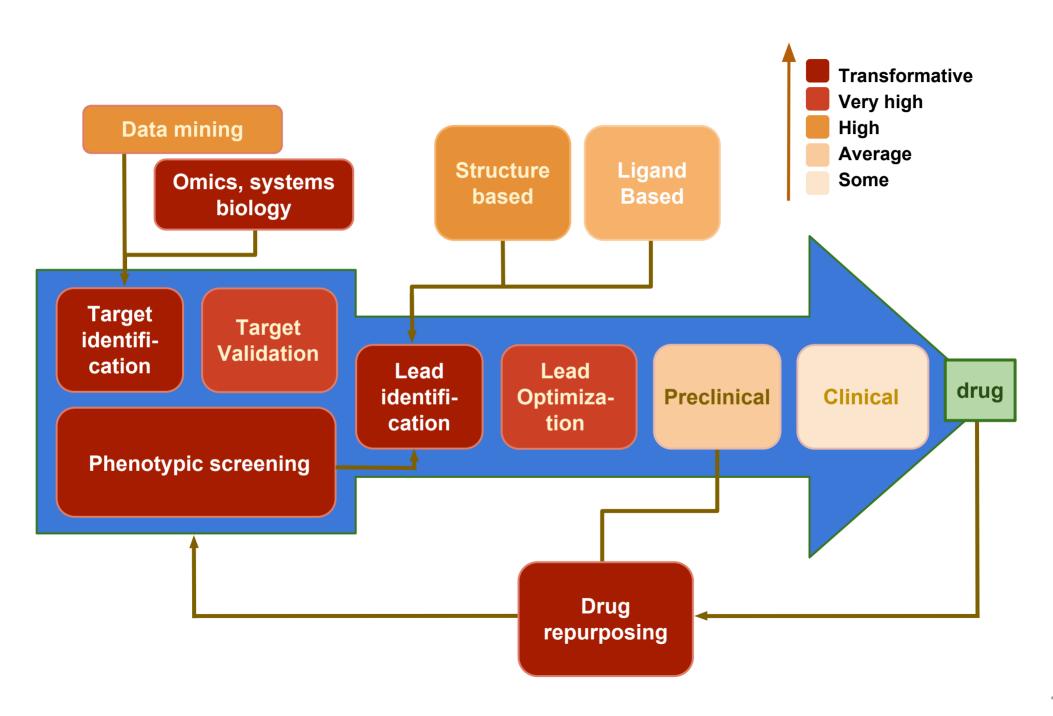
Source: adapted from Insilico Medicine investor presentations, www.insilico.com

THE BIOPHARMACEUTICAL RESEARCH AND DEVELOPMENT PROCESS



Source: Biopharmaceutical Research & Development, PRMA http://phrma-docs.phrma.org/sites/default/files/pdf/rd_brochure_022307.pdf

The "heat map" of AI potential value for various R&D areas



The Application of AI for Advanced R&D

Generate Novel Drug Candidates

- Analyze data sets, form hypotheses and generate novel insights
- Identify novel drug candidates
- Analyze data from patient samples in both healthy and diseased states to generate novel biomarkers and therapeutic targets
- Predict binding affinity and other pharmacological properties of molecules
- Allow filtering for drug-like properties of molecules
- Reduce complexity in protein design

Aggregate and Synthesize Information

- Extract knowledge from literature
- Generate insights from thousands of unrelated data sources
- Improve decision-making
- Eliminate blind spots in research
- Identify competitive whitespace

Repurpose Existing Drugs

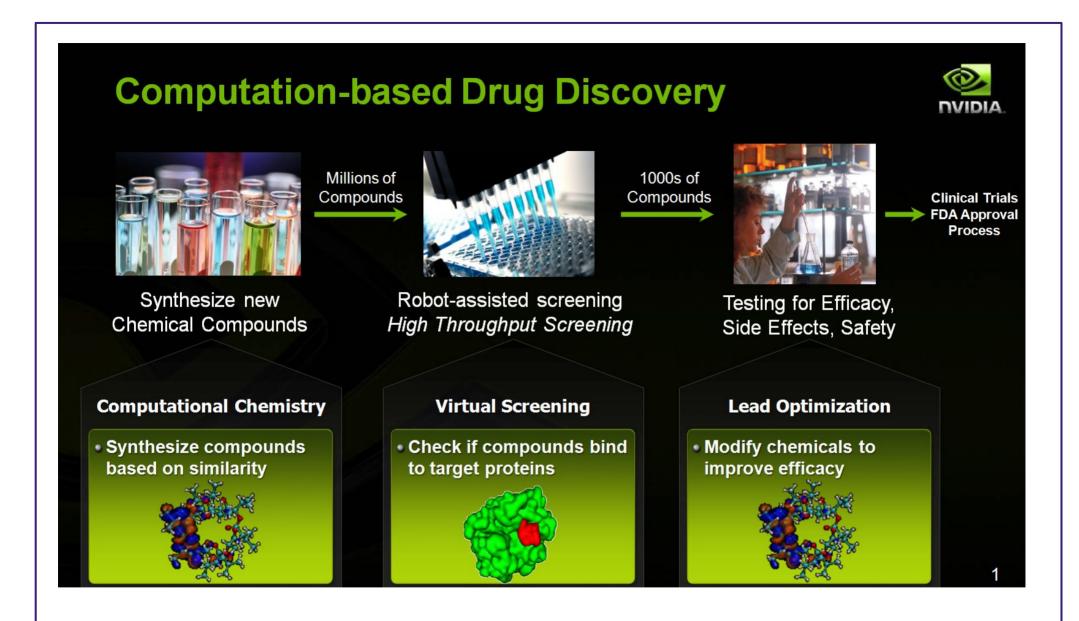
- Rapidly identify new indications for many known drugs
- Match existing drugs with rare diseases
- Conduct experimental biology at scale by testing 1000+ of compounds on 100+ of cellular disease models in parallel
- Generate novel biomarkers and therapeutic targets

Design and Run Preclinical Experiments

- Reduce time, money, and uncertainty in planning experiments
- Decode open- and closed-access data on reagents and get actionable insights
- Automate selection, manipulation, and analysis of cells
- Expedite development of cell lines and automate manufacturing of cellular therapeutics
- Automate sample analysis with a robotic cloud laboratory

Clinical Trials

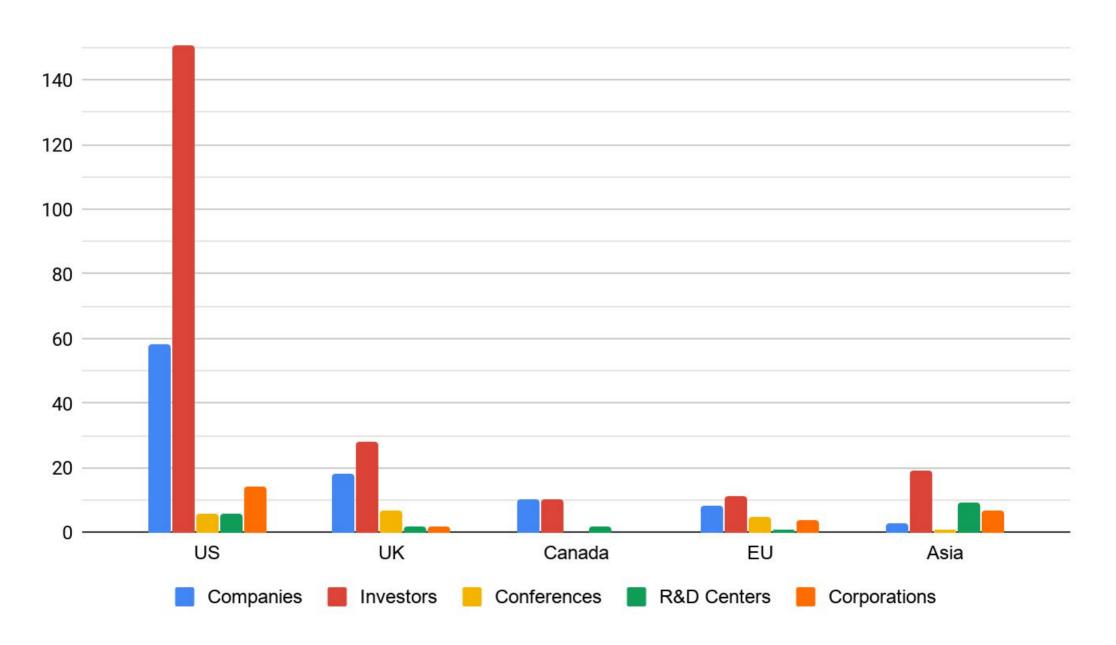
- Optimize clinical trial study design
- Transform diverse streams of biomedical and healthcare data into computer models representative of individual patients
- Deliver personalized medicine at scale, by revealing optimal health interventions for individual patients
- Analyze medical records to find patients for clinical trials
- Automate matching cancer patients to clinical trials through personal medical history and genetic analysis
- Improve pathology analysis
- Identify patients that would benefit from novel therapies



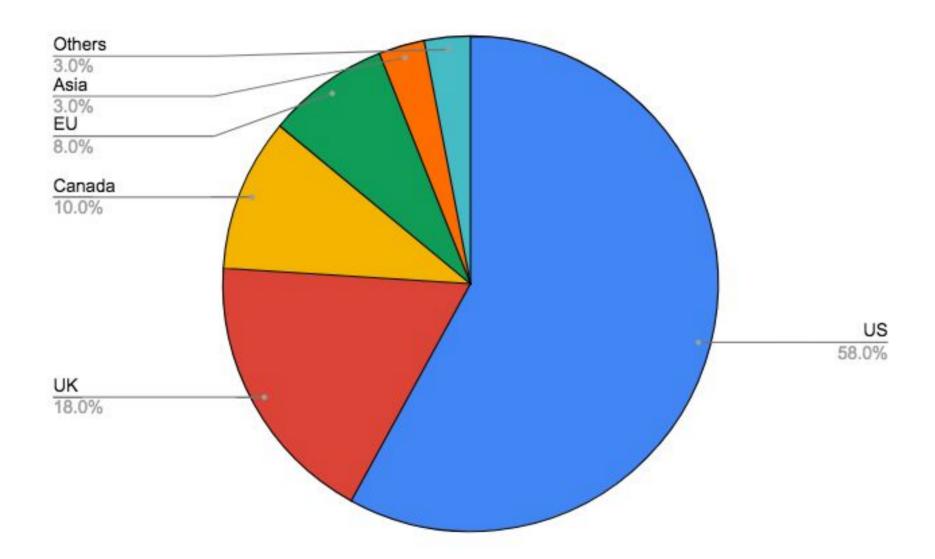
Source: https://blogs.nvidia.com/blog/2010/01/22/accelerating-the-pace-of-drug-discovery-using-gpus/

Regional Comparison of AI for Drug Discovery Companies/Investors/R&D Centers





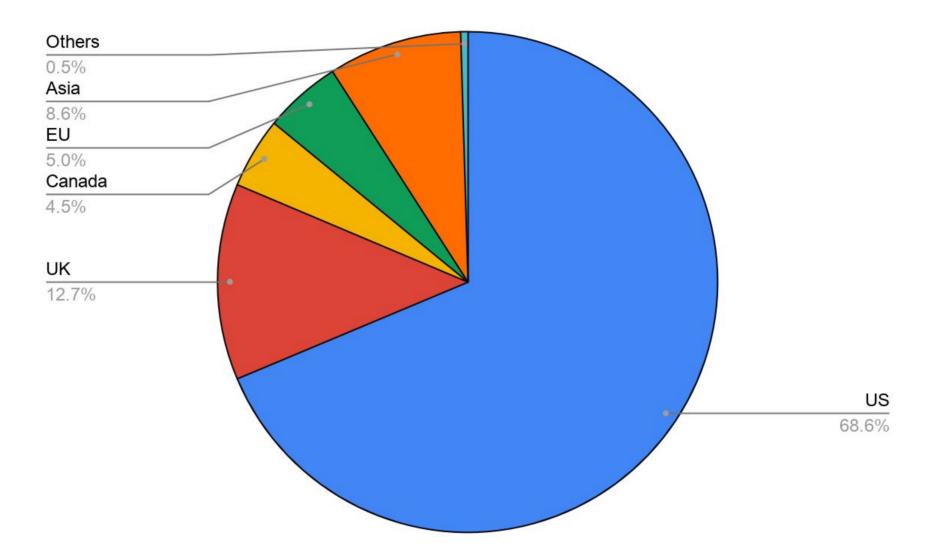
100 Al Companies: Regional Proportion



The US is still firmly in the lead in terms of its proportion of AI for Drug Discovery companies. Interestingly, Asia currently has the fifth-lowest proportion of AI for Drug Discovery companies. The Asia-Pacific region has, however, begin to aggressively increase their activity in the space in terms of investments into foreign companies (largely US-based companies), and we can expect to see an increase in the number of AI for Drug Discovery Companies located in the Asia-Pacific region generally, and in China particularly.

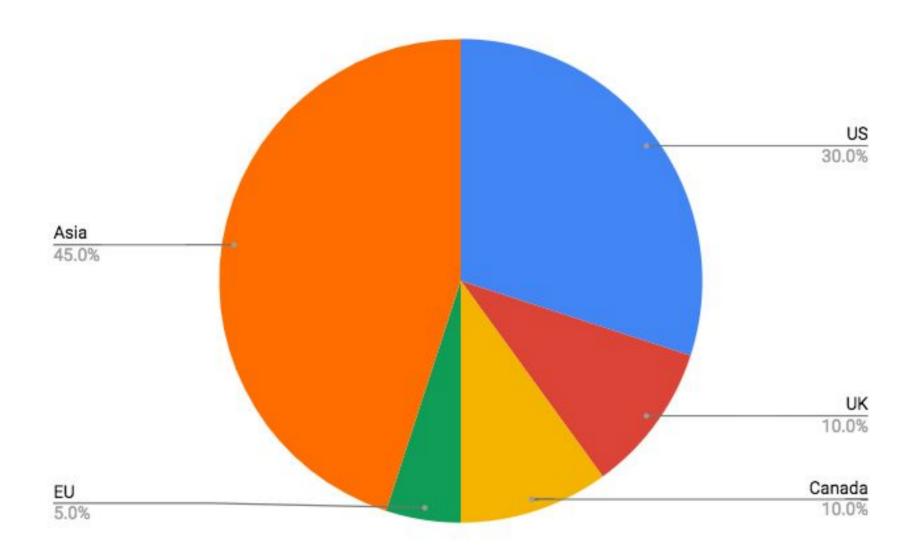
16

220 Investors: Regional Proportion



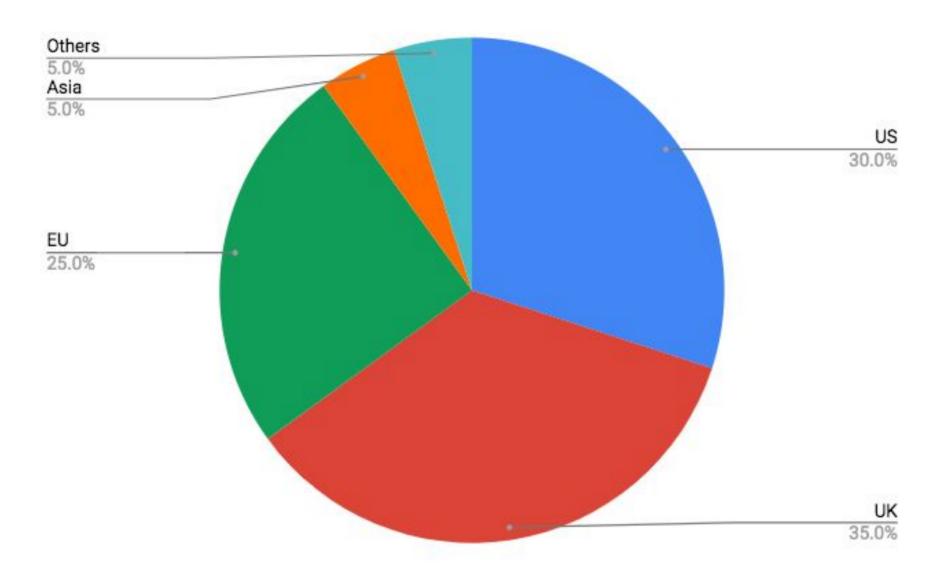
The US still leads the rest of the world in the proportion of AI for Drug Discovery Investors. This is sensible given that they also have the largest proportion of AI for Drug Discovery companies. However, it is interesting to note that, while the UK is home to the second-largest proportion of investors in this space, Asia has now overtaken the EU is rapidly advancing to acquire the #2 position. This past year has seen a substantial increase in the number of Asian investors, as well as Asian Tech & IT corporations, entering the AI for drug discovery industry.

20 Leading R&D Centers: Regional Proportion



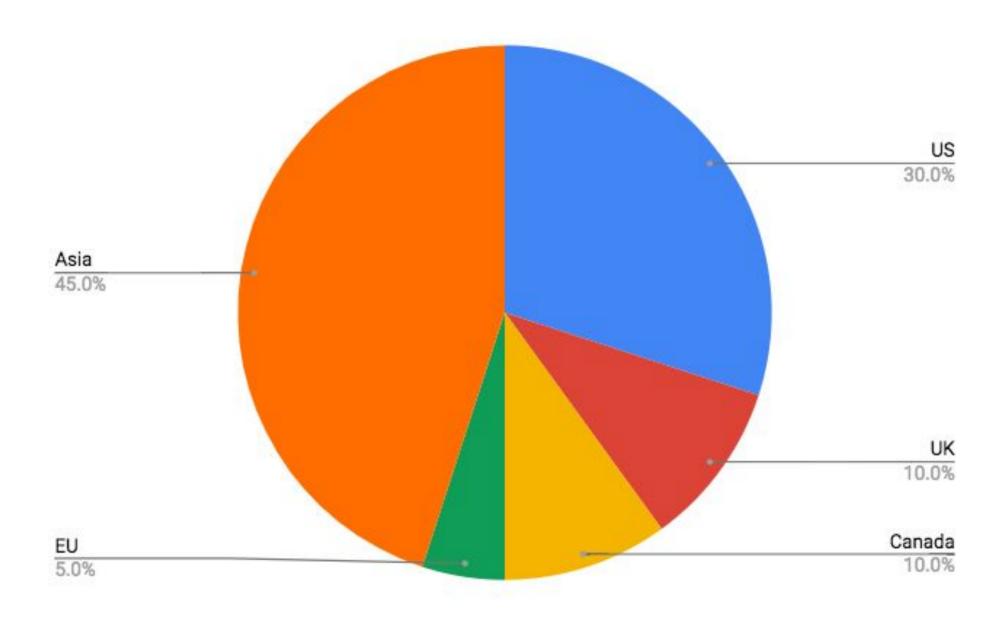
The figure above shows that while the US leads the world in terms of the number of R&D Centers focused on AI for Drug DIscovery, China is rapidly catching up. This makes sense within the context of the recent increase in the number of Chinese investors entering the AI for Drug DIscovery space, and the Chinese government's recent commitment to lead the world in AI by the year 2030.

Top-20 Conferences on AI for R&D and Drug Discovery 2018-2019: Regional Proportion



As can be seen in the figure above, whereas previously the US has dominated the AI for Drug DIscovery conference landscape (which follows naturally from the fact that it also leads in terms of the total number of AI for Drug DIscovery conferences and investors), we have seen a significant increase in the number of AI for Drug Discovery conferences located in the UK and EU.

30 Corporations Applying Advanced Al in Healthcare and Drug Discovery



Combined Capitalization of 15 IT & Tech Corporations vs 15 BioPharma Corporations In Millions of USD



As can be seen in the figure to the left, the combined capitalization of the 15 BioPharma corporations profiled in this report have remained on the same level for the past 5 years while the capitalization of the 15 IT & Tech corporations profiled in this report is growing significantly.

This can be considered as evidence that the BioPharma industry is stagnating in general, while the IT & Tech industry is progressing.

This is why it is so notable that the number of IT corporations has already matched the number of BioPharma corporations active in this subsector.

15 IT&Tech Corporations15 BioPharma Corporations

Source: Deep Knowledge Analytics

Top 20 Global AI for Drug Discovery Conferences























HOME / CONFERENCES / ARTIFICIAL INTELLIGENCE TO SPEED UP DRUG DISCOVERY: THE REVOLUTIONARY ROAD TO ADVANCING INNOVATION REVOLUTIONARY ROAD TO ADVANCING INNOVATION

Top 20 Global AI for Drug Discovery Conferences



DoubleTree Suites Boston-Cambridge

Cambridge, MA



20-21 September 2018, London, UK



Artificial intelligence and blockchain in healthcare

11th & 12th July 2018, Canary Riverside Plaza Hotel, London UK



2nd Annual Artificial Intelligence in Drug Development Congress



2ND GLOBAL PHARMA R&D INFORMATICS & AI CONGRESS











Artificial Intelligence in Drug Development Congress

27-28 September 2017, London, UK



MAX PLANCK ALUMNI ASSOCIATION

Artificial Intelligence and Big Data in Pharma

Impact on drug development on the role of the industry

March 21, 2018

Max Planck Institute of Biochemistry, Munich

Al Companies in Longevity





Atomwise



BioAge

Insilico Medicine Aging.Al 2.0



One of the most promising projects developed by Insilico Medicine is called Aging.AI 2.0, which is an AI-empowered platform integrating multiple predictors of clints age and used to track changes of health over time and optimize clints lifestyle.

http://young.ai/



Track your age at every level!



See what makes you younger or older!



Stay young!

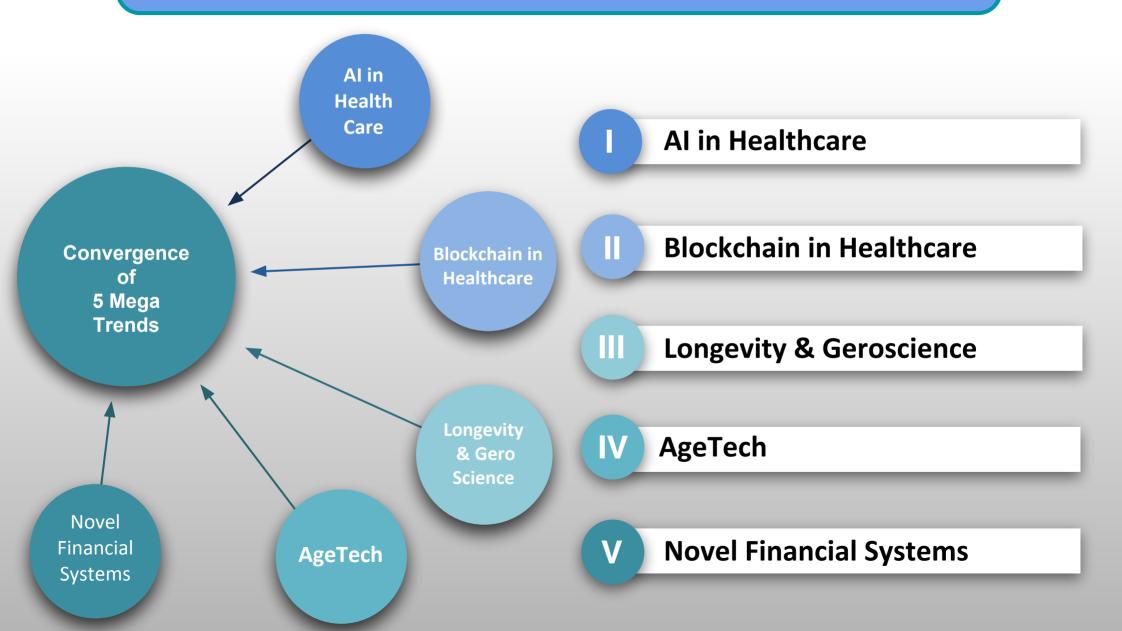
Insilico Medicine Earns Accolades from Frost & Sullivan

FROST & SULLIVAN

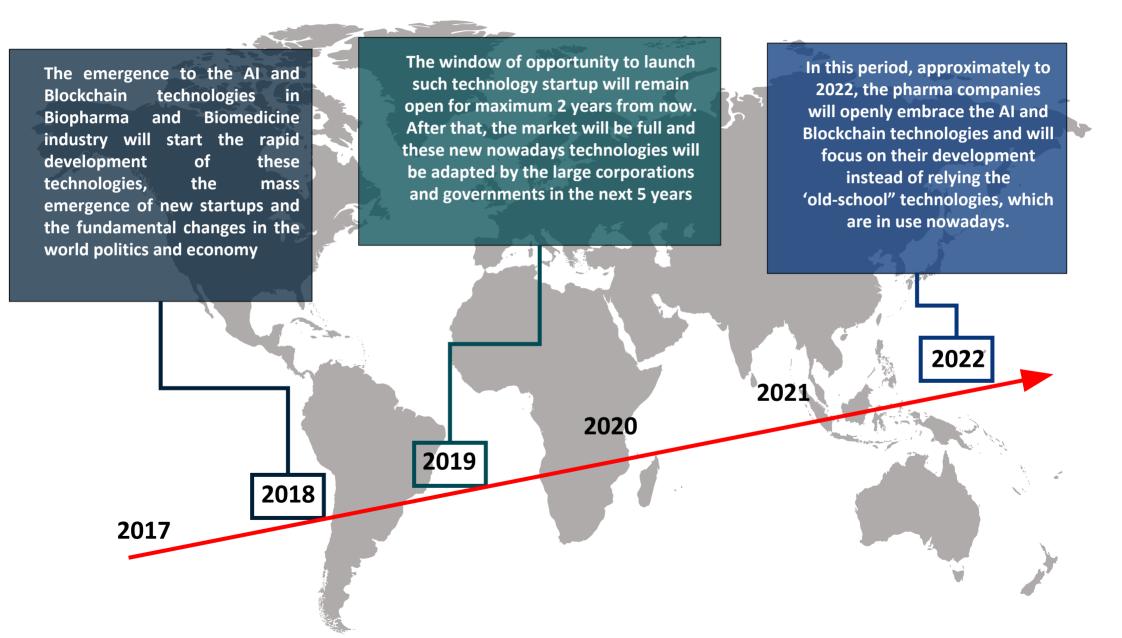


2018 North American Artificial Intelligence for Aging Research and Drug Development Technology Innovation Award

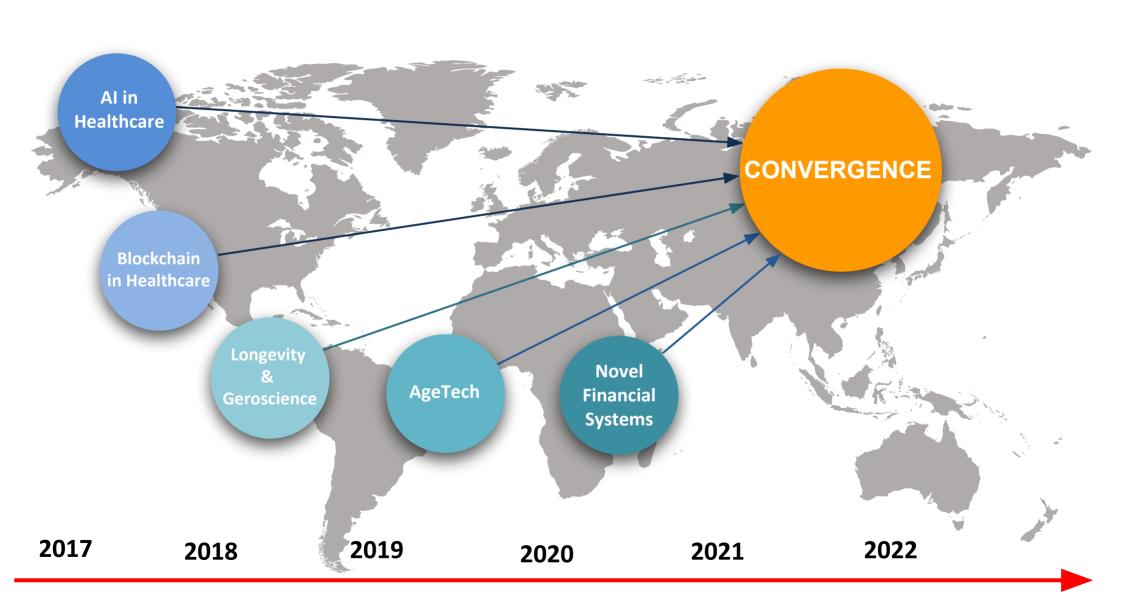
5 Mega Trends to Disrupt the BioTech & BioMedicine Industries in the next 5 Years



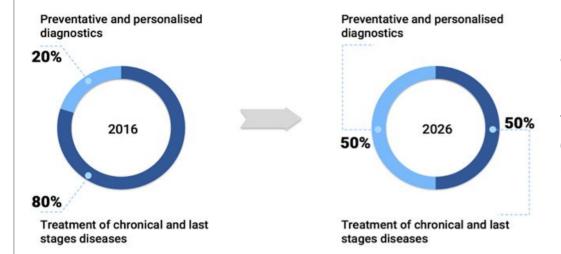
Consequence: The Major Shift in the BioMedicine Industry



Convergence of 5 Mega Trends

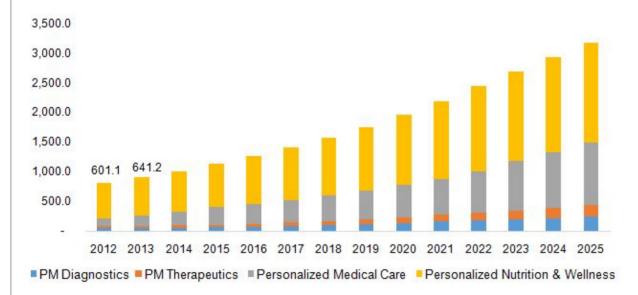


P3 medicine



It is expected that personalized and preventive approaches in the treatment of chronic diseases will become the prevalent one by 2026.

The changes in healthcare systems together with emerging technologies will double the P3 medicine market by 2022.



Source:

https://www.grandviewresearch.com/industry-analysis/personalized-medicine-market

AI FOR DRUG DISCOVERY, BIOMARKER DEVELOPMENT AND ADVANCED R&D LANDSCAPE OVERVIEW 2018 / Q2

Section III

Comparative Industry Analysis Classification Framework (Investor and M&A Guide)



Al for Drug Discovery, Biomarker Development and Advanced R&D Landscape Overview 2018 / Q2 Section III

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Comparative Industry Analysis Classification Framework (Investor and M&A Guide)

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Section III: Comparative Industry Analysis & Classification Framework (Investor and M&A Guide) is devoted to an in-depth comparative and quantitative analysis of the entire AI for Drug Discovery landscape, specifically tuned for investors and business analysts who wish to gain a deeper understanding of the industry in Q2 of 2018.

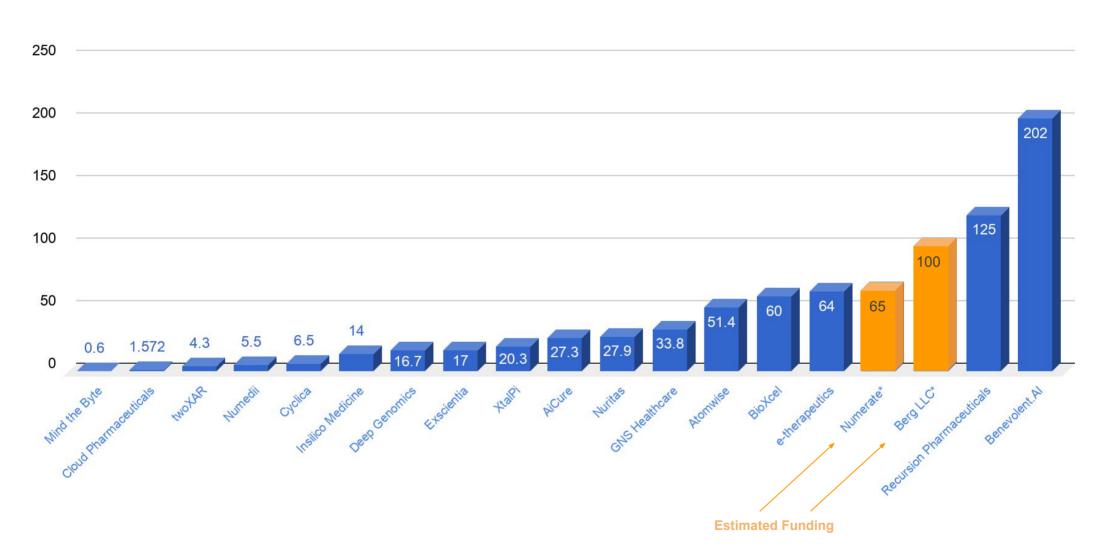
- Chapter XI: Classification/Ratings of AI for Advanced R&D and Drug Discovery Companies performs a quantitative analysis of many of the AI for Drug Discovery companies covered and profiled in this report using of a variety of tangible metrics that can be used to acquire an understanding of their level of scientific validation and industry activity, including the proportion of AI specialists among their total staff, number of publications, number of patents, etc. It then uses these metrics to rank AI for Drug Discovery companies side by side, and to build a classification framework by which these companies can be better categorized according to their specific focus, application and industry segmentation.
- Chapter XII: 2010 2016 Investment Rounds, M&A Deals and Notable Events summarizes some of the most notable investment rounds, M&As and other notable events from 2010-2016, including but not limited to Benevolent Al's \$87M raise, ThoughtSpot's \$100M raise and Meta's \$23M raise.
- Chapter XIII: 2017 Investment Rounds, M&A Deals and Notable Events summarizes some of the most notable investment rounds, M&As and other notable events in 2017, including but not limited to Exscientia's €250M raise, AlCure's \$15M raise and Insilico Medicine's \$10M raise.
- Chapter XIV: Q1 2018 Investment Rounds, M&A Deals and Notable Events summarizes some of the most notable investment rounds, M&As and other notable events in Q1 of 2018, including but not limited to AtomWise's \$45M raise, XtalPi's \$15M raise, and twoXAR's \$10M raise.
- Chapter XV: Q2 2018 Investment Rounds, M&A Deals and Notable Events summarizes the major investments, M&As and other notable events (e.g. joint ventures, public announcements, etc.) that have occurred within the AI for Drug Discovery space specifically in Q2 of 2018, including but not limited to ThoughtSpot's \$145M raise, Benevolent.AI's \$115M raise, Celsius Therapeutics' \$65M raise, and Datavant's \$40.5M raise

Chapter XI

Comparison of Leading Al Companies

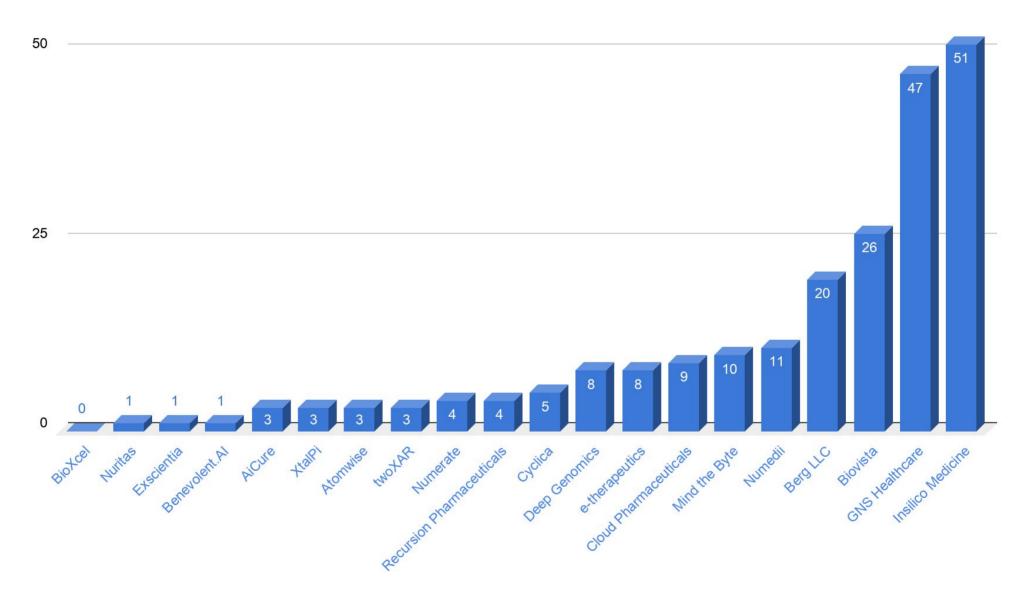
Comparison of Top-20 AI for Drug Discovery Companies

Funding, \$m (as of 1 July 2018)

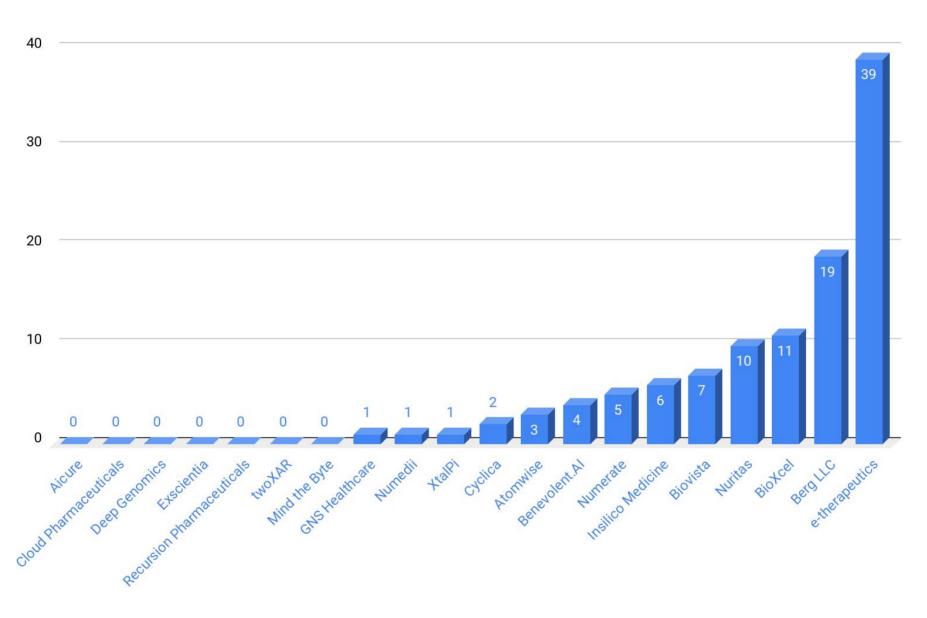


Comparison of Top-20 AI for Drug Discovery Companies

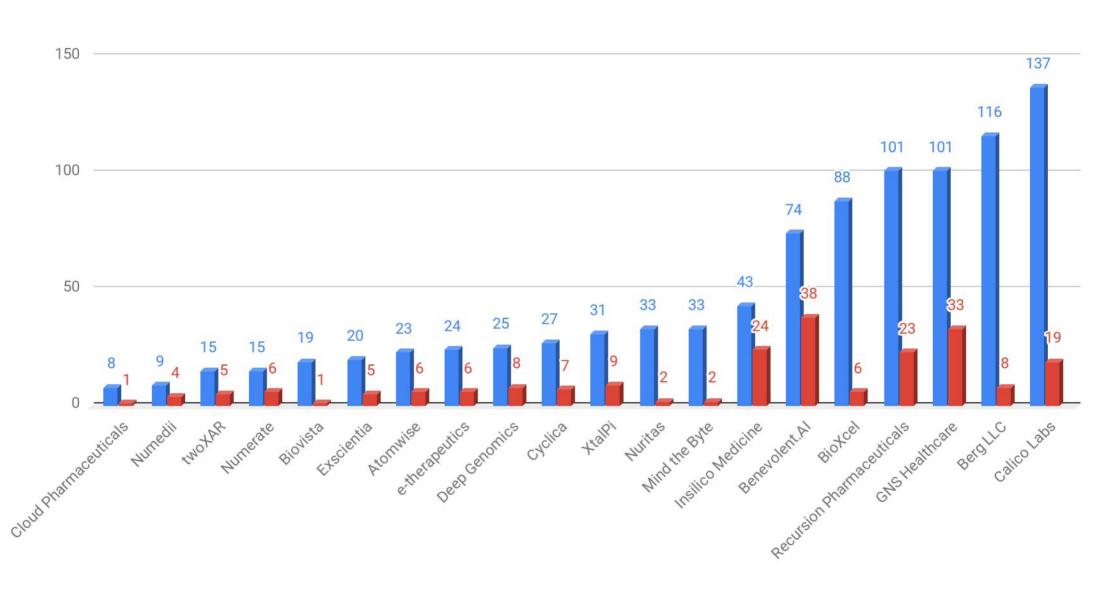
Number of Scientific Publications



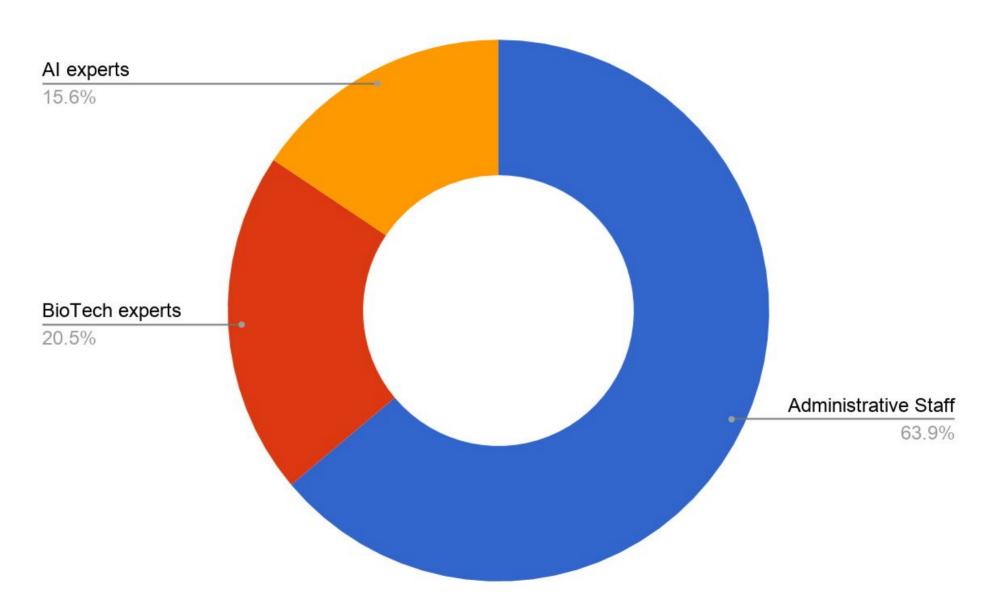
Number of Patents



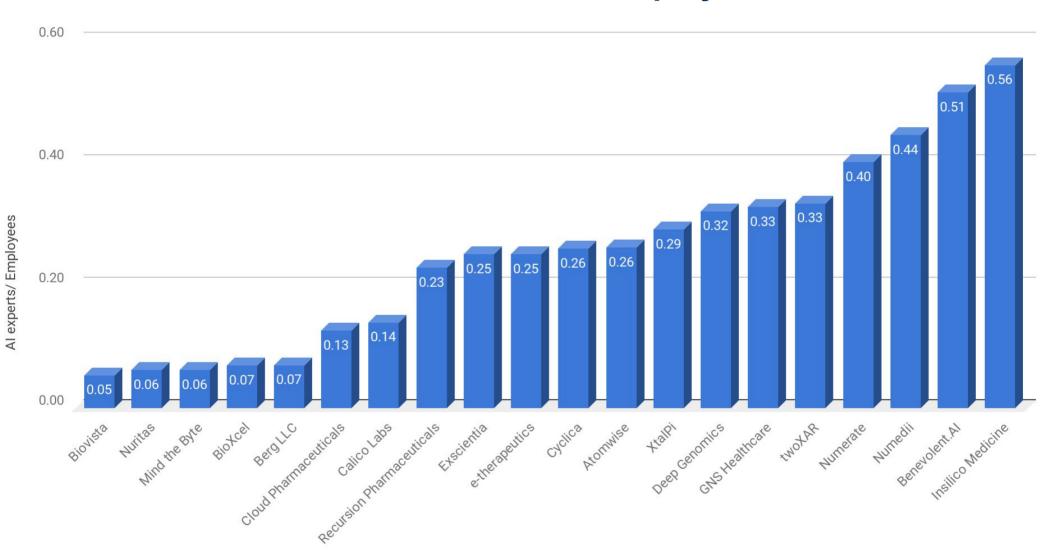
Total Number of Employees / Al experts



Al experts vs BioTech experts vs Administrative Staff



True Al companies The ratio: Al experts vs Total Number of Employees



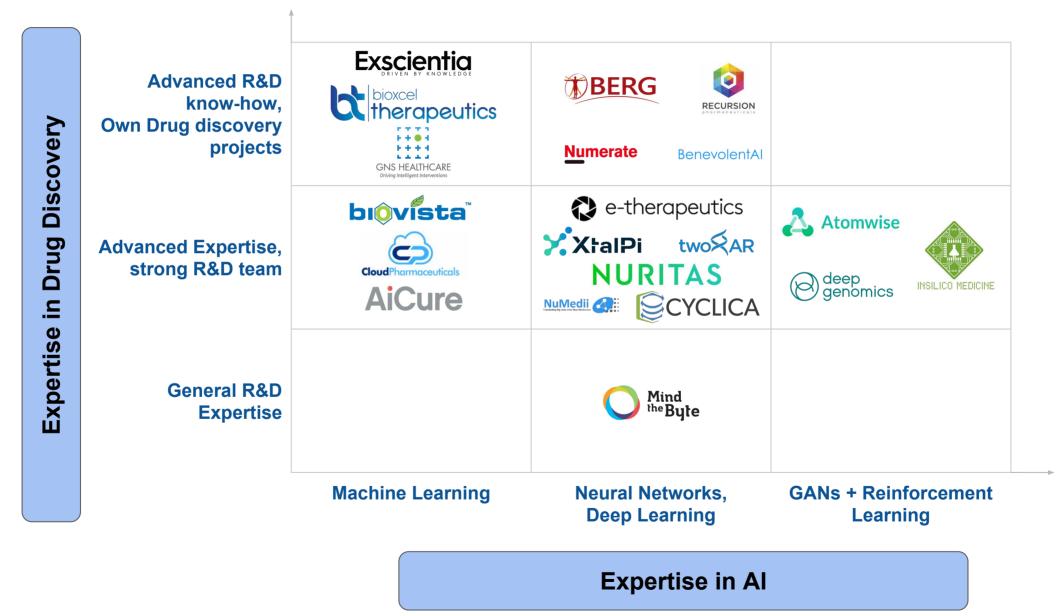
Company	Scientific publications covering Al for Drug Discovery	Number of Al experts in the team / total number of employees	Public talks on Al for Drug Discovery	Validation
Atomwise	+	11/13	+	n/a
Benevolent.Al	+	18/74	+	n/a
Deep Genomics	+	10/26	-	n/a
Exscientia	+	2/12	+	+
GNS Healthcare	+	21/98	-	n/a
Insilico Medicine	+	24/43	+	+
NuMedii	+	4/9	+	+
Numerate	-	4/15	+	+
Recursion Pharmaceuticals	+	85/12	+	+
twoXAR	+	1/15	+	+

Company	Scientific publications covering Al for Drug Discovery	Number of AI experts in the team / total number of employees	Public talks on Al for Drug Discovery	Validation
Berg LLC	-	3/11	+	n/a
Mind the Byte	-	2/33	+	n/a
Biovista	+	1/19	+	+
AiCure	_	9/43	+	+
Cloud Pharmaceuticals	+	1/8	+	n/a
e-therapeutics	+	4/25	+	n/a
Nuritas	-	2/33	+	+
XtalPi	-	1/25	+	n/a
Cyclica	-	7/27	+	+
BioXcel	-	4/88	+	+

Companies	Computation method	Data Type		
Atomwise	DL	Chemical notations; QSAR		
Benevolent.Al	ML, DL, symbolic Al	Text; images; EHRs; omics		
Deep Genomics	n/a	n/a		
Exscientia	ML	Chemical notations; high-content screening; SAR		
GNS Healthcare ML		n/a		
Insilico Medicine DL, GANs, GANs + RL, symbolic Al		Omics; EHR		
NuMedii	Big data analysis, DL, ML	Raw human, biological, pharmacological and clinical data, normalized and annotated.		
Numerate	AI, cloud computing	Chemical notations; screening; high-content screening;		
Recursion Pharmaceuticals n/a		Images, high content screening data		
twoXAR n/a		Omics data, high content screening		

Companies Computation method		Data Type		
Berg LLC	DL	Human Data		
Mind the Byte	Big Data	protein ligand interactions		
Biovista ML		correlations between drugs, molecular targets, pathways, adverse events and diseases		
AiCure ML		n/a		
Cloud Pharmaceuticals	legacy ML, cheminformatics	Chemical notations		
e-therapeutics Big Data		Chemical notations		
Nuritas DL		n/a		
XtalPi Quantum physics; machine learning; cloud computing		n/a		
Cyclica	Al	Chemical notations		
BioXcel ML		n/a		

Expertise in AI for Drug Discovery R&D / AI



Expertise in Al for Drug Discovery Chemistry / Biology



Expertise in Biology

Classification of Al applications for R&D and Drug Discovery process

Data Mining	Biology Research		Drug Discovery			
		Compound Generation	Compound Binding	ADME/Tox Predictions	Drug Development	Biomarker Discovery
		Atomwise Better medicines faster.	Atomwise Better medicines faster.			
benevolent.ai				benevolent.ai		
deep						deep
		e ^x scientia	e ^x scientia	e ^x scientia		
					F Y Y T T T T T T T T T T T T T T T T T	
	INSILICO MEDICINE	INSILICO MEDICINE	INSILICO MEDICINE	INSILICO MEDICINE	INSILIOO MEDICINE	INSILICO MEDICINE
						NuMedii 🚓 🗎
		<u>Nu</u> merate		<u>Nu</u> merate		
		RECURSION				
	two≶AR	twoṢAR				

Classification of Al applications for R&D and Drug Discovery process

Data Mining	Biology Research		Drug Discovery			
		Compound Generation	Compound Binding	ADME/Tox Predictions	Drug Development	Biomarker Discovery
					AiCure	
	NURITAS					
	♠ e-therapeutics					
		Biovista to seek - to brow - to act				
	BERG	BERG				BERG
		CloudPharmaceuticals				
			©CYCLICA ■			
	Mind the Byte		Mind the Byte			
			Bioxcel			
				XtalPi		

Competitive Landscape

Hypothesis Knowledge Discovery	Target ID Biology	Compound Generation	Compound Binding	ADME Tox	Clinical Trials	Personalized Medicine	Real World Insights
INSILICO MEDICINE	INSILICO MEDICINE	INSILICO MEDICINE	INSILICO MEDICINE	INSILICO MEDICINE	INSILICO MEDICINE	INSILICO MEDICINE	INSILICO MEDICINE
BenevolentAl IBM Watson	IBM Watson	inSili.com	Exscientia Atomwise	Exscientia Numerate	IBM Watson	IBM Watson	IBM Watson
SPARKBEYOND nference	two AR NuMedii		SCHRÖDINGER.		SPARKBEYOND WuXiNextCODE	MEDICINE,	nference e rativ
	Standigm BERG		XtalPi		DEEP 6	one GRA L	iCarbonX 碳云智能
	deep genomics				Mendel.ai #trials.ai OWKIN	<u>v</u> erily	SPARKBEYOND
	WuXiNextC DE healx iCarbonX 磁元智能				23 OWKIN	Over 1000 companies worldwide	

Most Promising Players

Corporations











Al companies



BenevolentAl









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