## BIST Founding Conference Growing together, advancing science



# BIG DATA IN BIOINFORMATICS

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# BIG DATA IS BIOINFORMATICS

### BiG data is bioinformatics

- Heterogeneous data
  - numerical
  - non-numerical
    - Structures at different levels (from molecules to organisms)—images
    - Sequences
    - Longitudinal/dynamic—movies
  - Multi-dimensional
- Collected at multiple sites
  - Produced by indivual small labs to large international consortiums
- Shared through the internet
  - Real time acces
- Need of integrative analysis



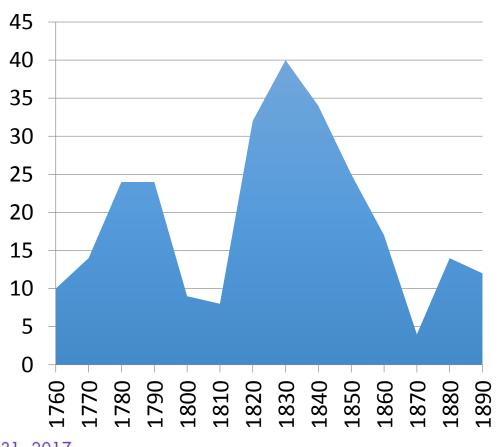
Google search: X-informatics (june 4,2015)

<b>bio</b> informatics	24,500,000	
chemoinformatics	275,000	
<b>astro</b> informatics	27,800	
neuroinformatics	331,000	
<b>socio</b> informatics	14,100	
<b>geo</b> informatics	548,000	
<b>meteo</b> informatics	146	
econoinformatics	2,010	
<b>eco</b> informatics	92,800	
physicoinformatics	5,390	

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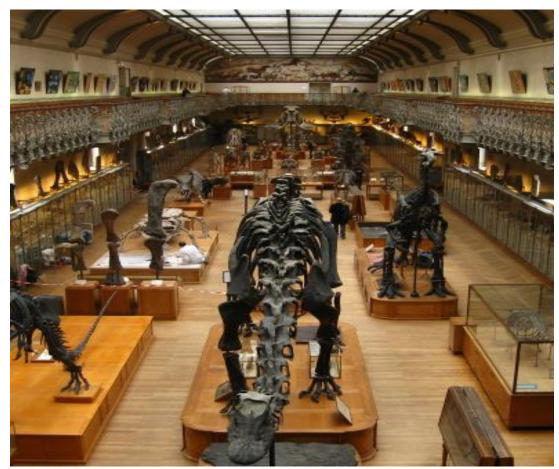




# Number of scientific expeditions

# of commissioned years





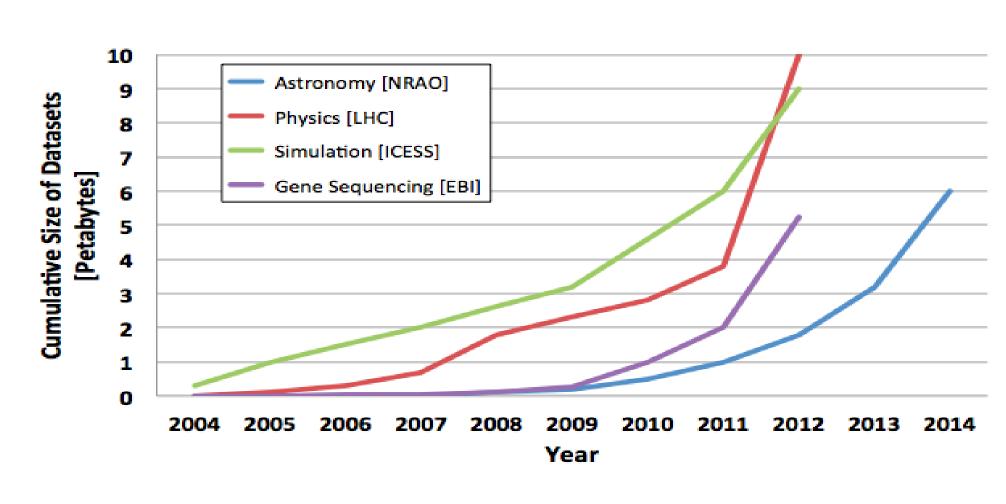


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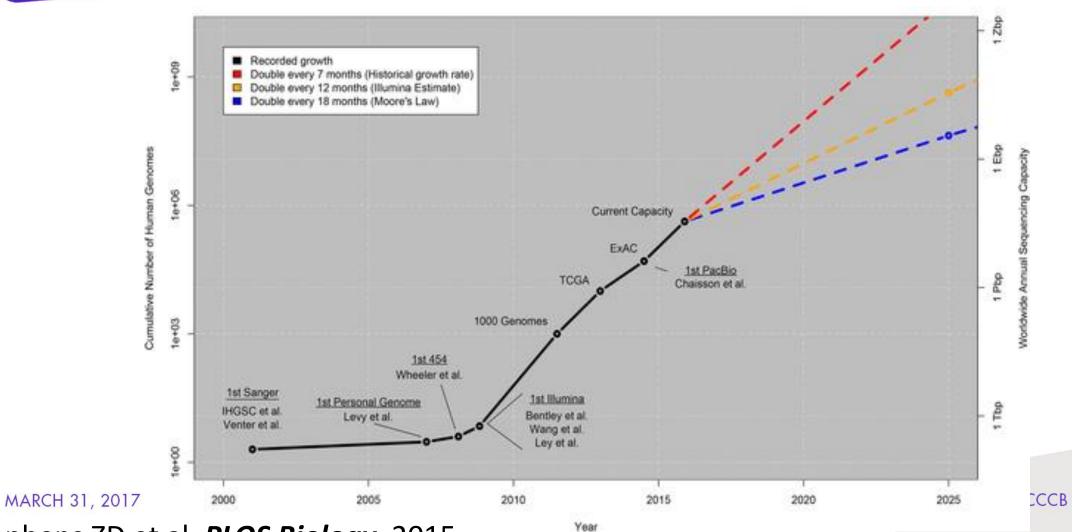
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Cedric Notredame, CRG









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Stephens ZD et al. PLOS Biology, 2015



## Big Data: Astronomical or Genomical?

Data Phase	Astronomy	Twitter	YouTube	Genomics
Acquisition	25 zetta-bytes/year	0.5-15 billion tweets/year	500-900 million hours/year	1 zetta-bases/year
Storage	1 EB/year	1-17 PB/year	1-2 EB/year	2-40 EB/year
Analysis	In situ data reduction	Topic and sentiment mining	Limited requirements	Heterogeneous data and analysis
	Real-time processing	Metadata analysis		Variant calling, ~2 trillion central processing unit (CPU) hours
	Massive volumes			All-pairs genome alignments, ~10,000 trillion CPU hours
Distribution	Dedicated lines from antennae to server (600 TB/s)	Small units of distribution	Major component of modern user's bandwidth (10 MB/s)	Many small (10 MB/s) and fewer massive (10 TB/s) data movement

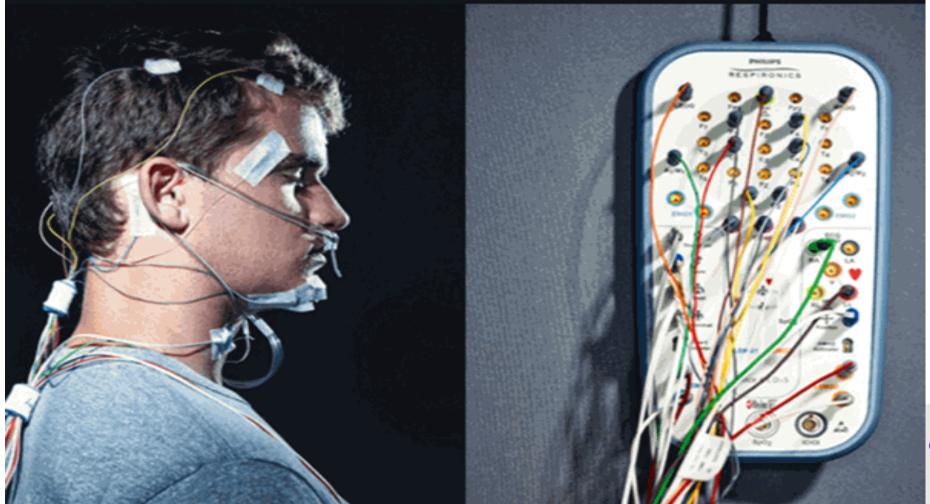
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PLOS BIOLOGY

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### We are the Big Data



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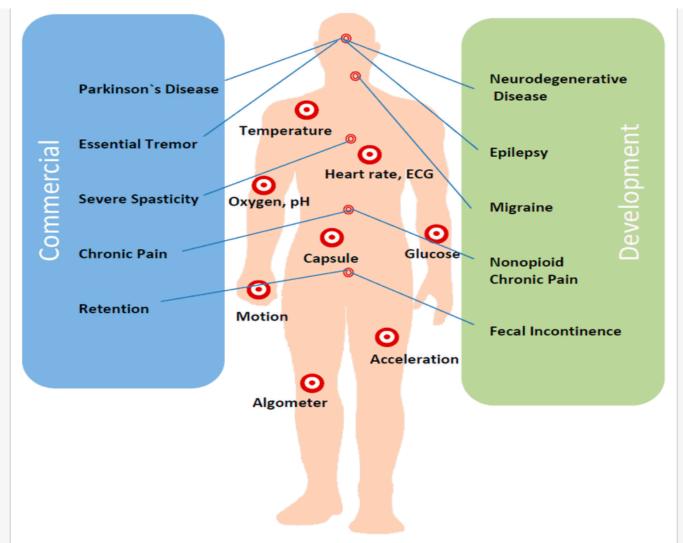
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### Wearable medical devices



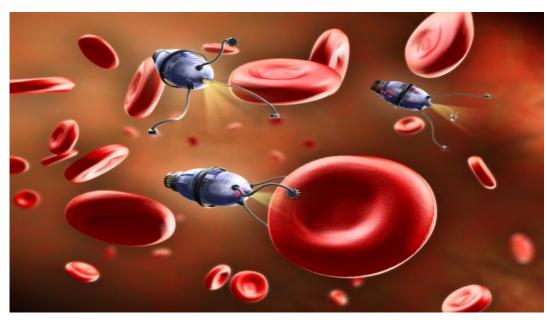


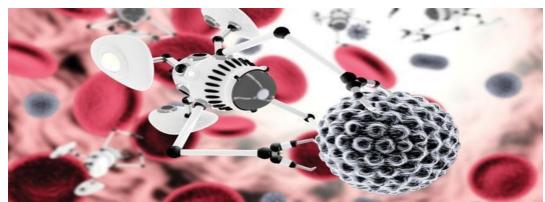


## Implantable wearable devices

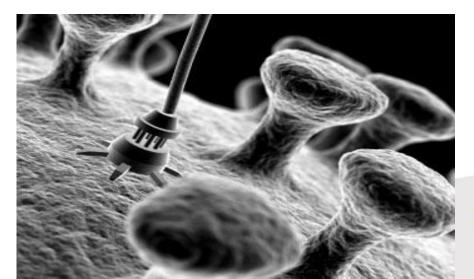


### Nanowearables



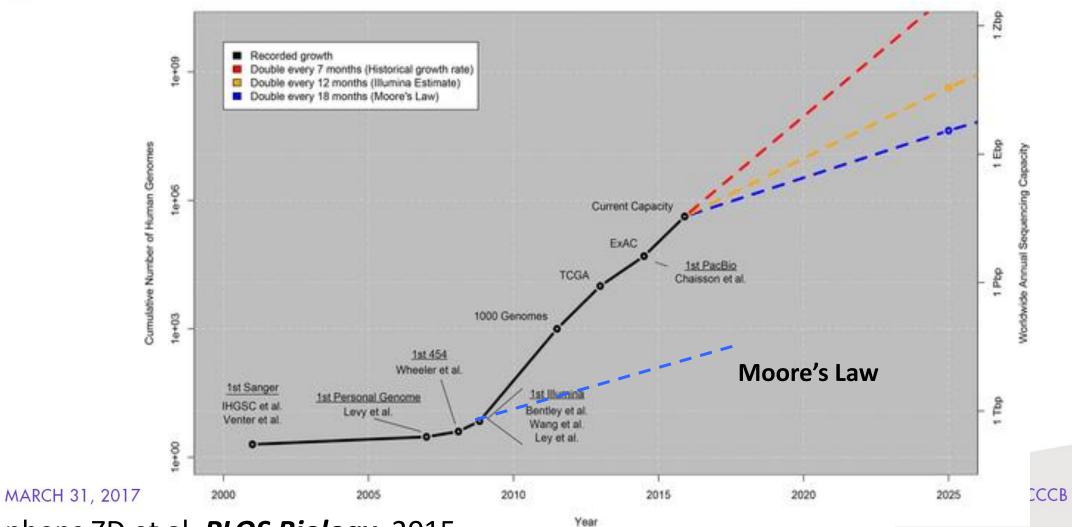






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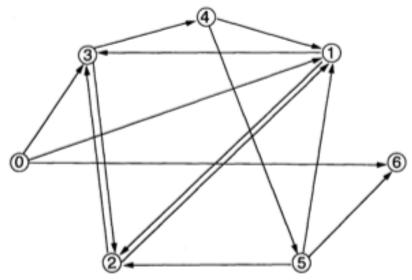
Stephens ZD et al. PLOS Biology, 2015



### Molecular Computation of Solutions to Combinatorial Problems

Leonard M. Adleman

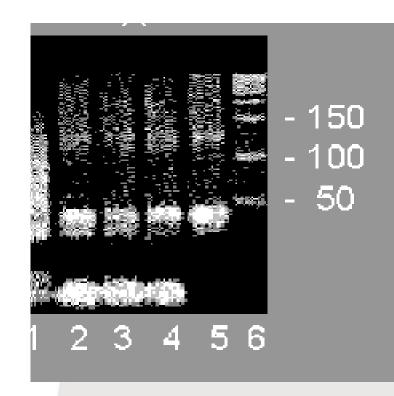
The tools of molecular biology were used to solve an instance of the directed Hamiltonian path problem. A small graph was encoded in molecules of DNA, and the "operations" of the computation were performed with standard protocols and enzymes. This experiment demonstrates the feasibility of carrying out computations at the molecular level.



**Fig. 1.** Directed graph. When  $v_{in} = 0$  and  $v_{out} = 6$ , a unique Hamiltonian path exists:  $0 \rightarrow 1$ ,  $1 \rightarrow 2$ ,  $2 \rightarrow 3$ ,  $3 \rightarrow 4$ ,  $4 \rightarrow 5$ ,  $5 \rightarrow 6$ .



**Fig. 2.** Encoding a graph in DNA. For each vertex i in the graph, a random 20-mer oligonucleotide  $O_i$  is

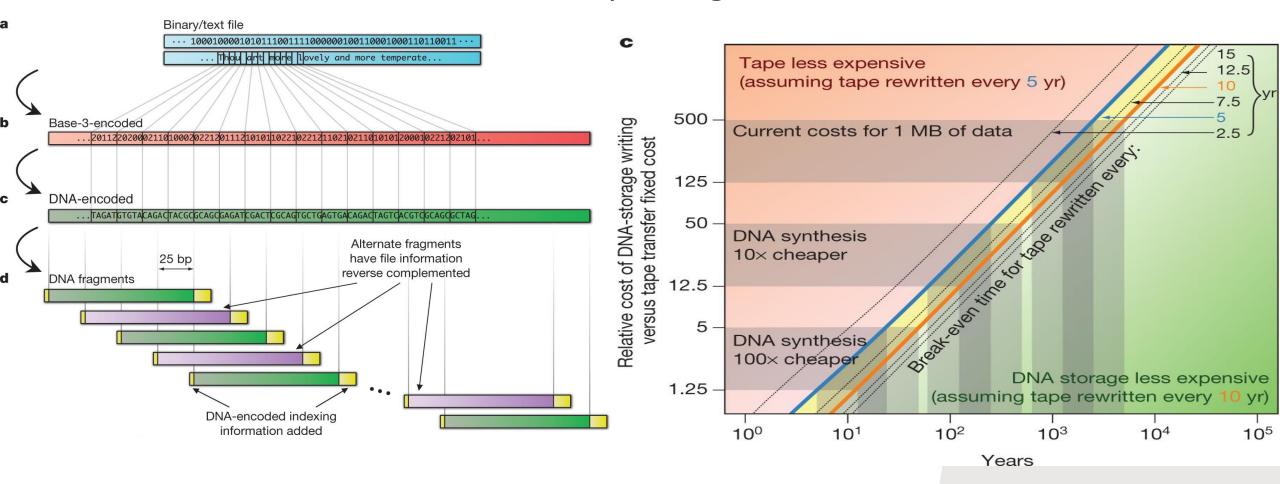




## Towards practical, high-capacity, low-maintenance information storage in synthesized DNA

Nick Goldman<sup>1</sup>, Paul Bertone<sup>1</sup>, Siyuan Chen<sup>2</sup>, Christophe Dessimoz<sup>1</sup>, Emily M. LeProust<sup>2</sup>, Botond Sipos<sup>1</sup> & Ewan Birney<sup>1</sup>

### 2 PB per 1 g DNA



### "Goldman prediction"

- 2PB per 1g DNA (2 x 10<sup>15</sup> bytes)
- Total world info (2013): 3ZBytes (3 x 10<sup>21</sup> bytes)
  - Aproximately 1.5 x 10<sup>6</sup> g (1,5 tonnes of DNA) to store all information
- Information doubling time: 2 years
- Mass of earth: 6 x 10<sup>27</sup> g (google)
- 1.5 x  $10^6$  x  $2^{x/2} \approx 6$  x  $10^{27} \rightarrow x \approx 140$  years
- the mass of total info in the world stored in DNA exceeds the mass of the Earth in year 2157



DNA STORAGE

## DNA Fountain enables a robust and efficient storage architecture

215 PB per 1 g DNA

Yaniy Erlich<sup>1,2,3\*</sup> and Dina Zielinski<sup>1</sup>

DNA is an attractive medium to store digital information. Here we report a storage strategy, called DNA Fountain, that is highly robust and approaches the information capacity per nucle otide. Using our approach, we stored a full computer operating system, movie, and other files with a total of  $2.14 \times 10^6$  bytes in DNA oligonucleotides and perfectly retrieved the information from a sequencing coverage equivalent to a single tile of Illumina sequencing. We also tested a process that can allow  $2.18 \times 10^{15}$  retrievals using the original DNA sample and were able to perfectly decode the data. Finally, we explored the limit of our architecture in terms of bytes per molecule and obtained a perfect retrieval from a density of 215 petabytes per gram of DNA, orders of magnitude higher than previous reports.