# SHORT HISTORY of BIG DATA & STREAMING PROGRAMMING TECHNOLOGY

### **Jeffrey Ricker**

- 1991BS Mechanical Engineering (Robotics) Tulane University
- 1996US DOD High Performance Computing Modernization Program
- 1997 DARPA Shaolin Project
- 1998 Founded XMLSolutions Corp
- 2004 Founded Distributed Instruments LLC
- 2013 Amazon Big Data
- 2015 Founded The Ricker Lyman Robotic Company

### Objective

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Provide historical context of technology evolution leading up to streaming big data

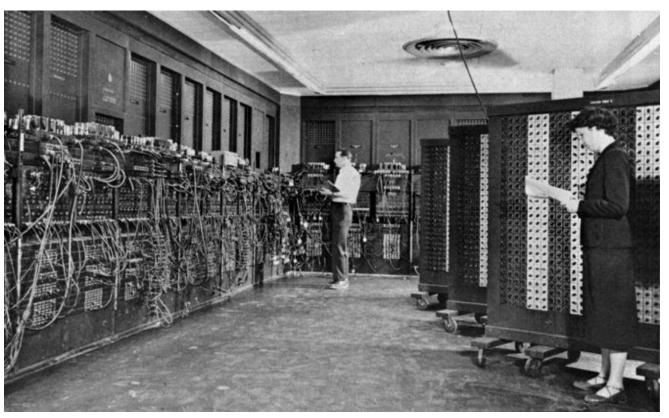
### Agenda

- 1. High performance computing
- 2. Open source
- 3. Hadoop (big data)
- 4. Functional programming
- 5. Streaming programming
- 6. Why history?

# High Performance Computing

### Size matters

### **1946 ENIAC**



### 1964 CDC 6600



### 1976 Cray 1



### 1991 CM-5



### **1994 Beowulf cluster**



### 2018 Summit

Summit has 4,356 nodes, each one equipped with two 22-core **Power9** CPUs, and six **NVIDIA Tesla V100 GPUs**. The nodes are linked together with a Mellanox dual-rail EDR InfiniBand network.



### **High Performance Computing**

1940-1970: the first supercomputers

1975-1990: the Cray era

1990-2010: the cluster era

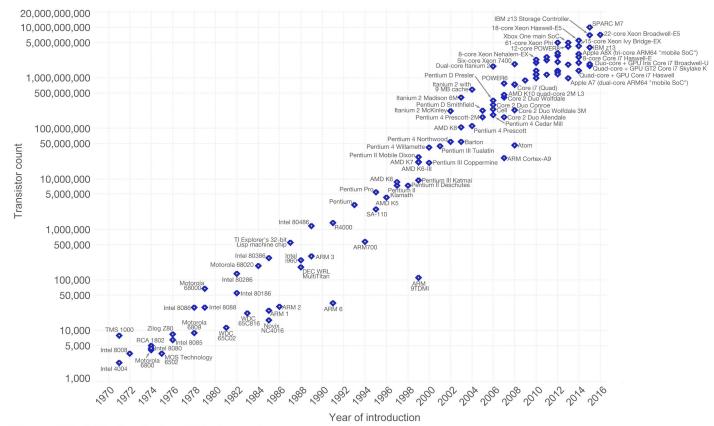
2000-2020: the GPU and hybrid era

2020-: ???

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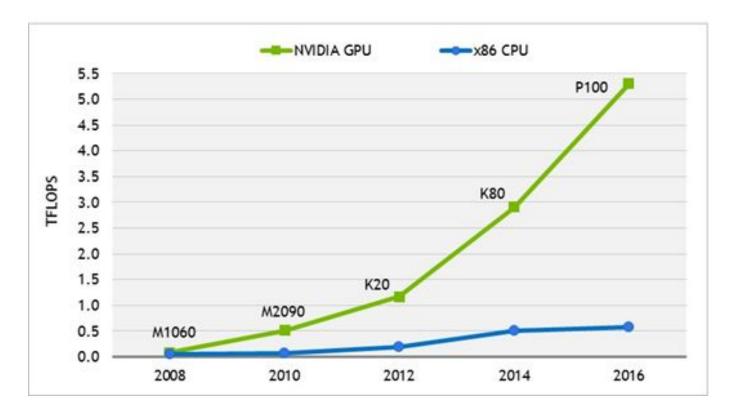
#### Moore's Law – The number of transistors on integrated circuit chips (1971-2016) Our World in Data

Moore's law describes the empirical regularity that the number of transistors on integrated circuits doubles approximately every two years. This advancement is important as other aspects of technological progress – such as processing speed or the price of electronic products – are strongly linked to Moore's law.



Data source: Wikipedia (https://en.wikipedia.org/wiki/Transistor\_count) The data visualization is available at OurWorldinData.org. There you find more visualizations and research on this topic.

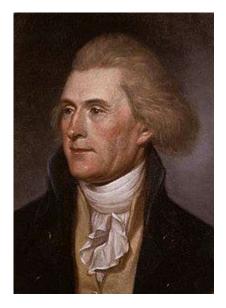
### **GPU** evolution



# **Open Source**

## A business model of innovation

#### 1790





#### The United States.

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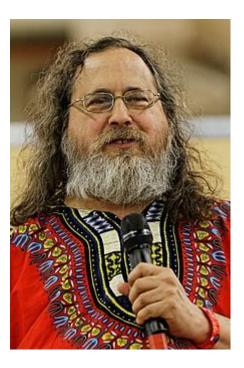
X000001 July 31, 1790

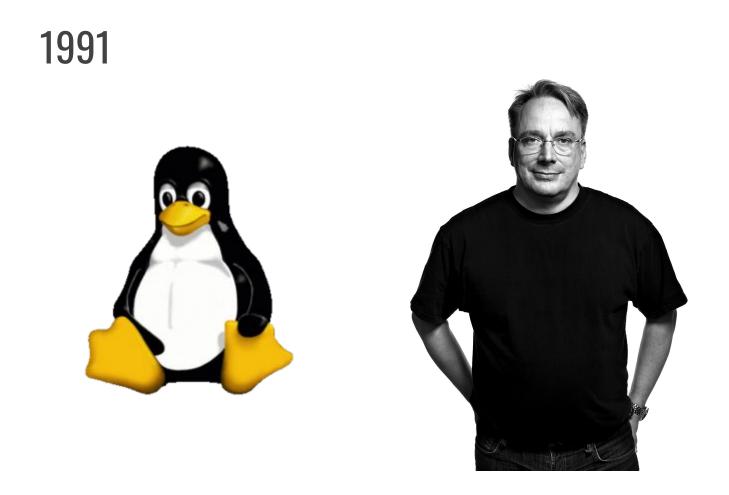
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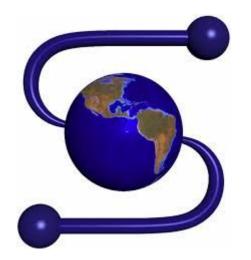




















### Key events in open source

1984 Richard Stallman (MIT) starts GNU project

1989 GPL

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1991 Linus Torvalds releases Linux

1993 Mosaic browser Red Hat founded

1994 Netscape MySQL launched

1996 Apache launched

1997 Eric Raymond "The Cathedral and the Bazaar"

1998 Netscape open sources Mozilla Firefox

1999 Apache Foundation IBM announces \$1 billion investment in Linux

2006 Hadoop incubator

# Hadoop

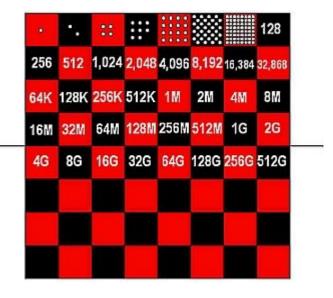
## How distributed computing went mainstream

### **Original search**

What's New Check Email	<b>VAHOO!</b>	My - ?
Yahoo! Auctions bid & sell for free	Win 6 days in Hawaii! Go to fox.com FOX	Park Your Domain Free
	Search advanced	search
Yahoo! Mai	il - Get your free e-mail account to	oday!
	earch - <u>Maps</u> - <u>Travel Agent</u> - <u>Classified</u> o <u>l</u> - <u>Today's News</u> - <u>Sports</u> - <u>Weather</u> - '	
Arts & Humanities	News & Media	In the News
Literature, Photography	Full Coverage, Newspapers, TV	<u>King Hussein of Jordan</u> dies
Business & Economy	Recreation & Sports	Online: Lewinsky video
Companies, Finance, Jobs	Sports, Travel, Autos, Outdoors	testimony
Computers & Internet	Reference	<u>NASA comet mission</u>
Internet, WWW, Software, Games	Libraries, Dictionaries, Quotations	<u>NBA season opens</u>
Education	Regional	Weekend's top movies
Universities, K-12, College Entrance	Countries, Regions, US States	more
Entertainment	Science	Inside Yahoo!
Cool Links, Movies, Humor, Music	Biology, Astronomy, Engineering	<ul> <li><u>Y! Personals</u> - find a Valentine</li> </ul>
Government	Social Science	Shop for your Valentine
Military, Politics, Law, Taxes	Archaeology, Economics, Languages	
Health	Society & Culture	<ul> <li><u>Y! Clubs</u> - create your own</li> </ul>
Medicine, Diseases, Drugs, Fitness	People, Environment, Religion	more

### **Legend of Paal Paysam**





### 1997 Lucene

Doug Cutting builds full text search library

Analyze ordinary text with the purpose of building an index.

Index is a data structure that maps each term to its location in text, so that when you search for a term, it immediately knows all the places where that term occurs.

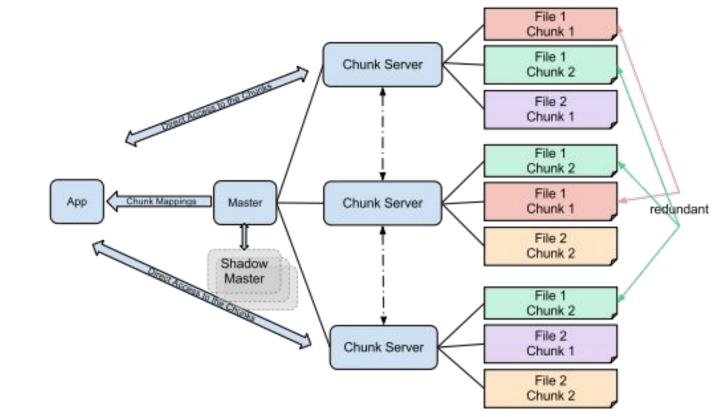
Add Nutch: a web crawler

### 2003 Google File System

- schemaless with no predefined structure, i.e. no rigid schema with tables and columns (and column types and sizes)
- **durable** once data is written it should never be lost
- capable of handling **component failure** without human intervention (e.g. CPU, disk, memory, network, power supply, MB)
- **automatically rebalanced** to even out disk space consumption throughout cluster

### Google file system

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### 2004 Google MapReduce

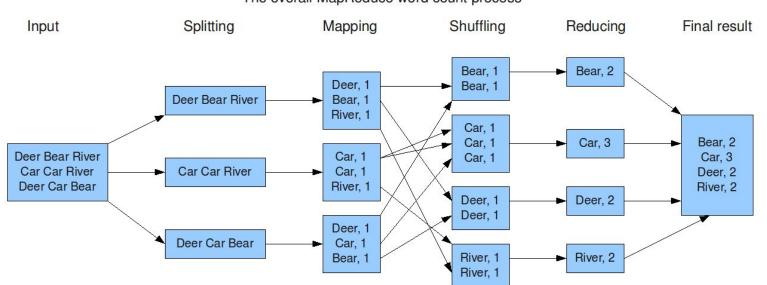
The three main problems that the MapReduce paper solved are:

- 1. Parallelization how to parallelize the computation
- 2. Distribution how to distribute the data
- 3. Fault-tolerance how to handle component failure

A program is sent to where the data resides.

There's simply too much data to be moved around.

### MapReduce



The overall MapReduce word count process

### Pre Hadoop

- 1997 Lucene started by Doug Cutting
- 2000 Lucene released to Source Forge
- 2001 Lucene becomes Apache project http://lucene.apache.org/
- 2001 Cutting and Mike Cafarella start Apache Nutch
- 2003.10 Google File System published
- 2004 Nutch Distributed File System
- 2004.01 Scala released
- 2004.12 Map Reduce published https://ai.google/research/pubs/pub62
- 2005.06 MapReduce integrated into Nutch

### Post Hadoop

2006.02 Hadoop incubator released

- 2006 Bigtable published https://ai.google/research/pubs/pub27898
- 2007.02 Yahoo reports 1000 node Hadoop cluster
- 2008.01 Hadoop becomes a top level Apache project
- 2008 HBase joins Hadoop

2008.05 ZooKeeper

- 2008.10 Pig (from Yahoo) and Hive (from Facebook)
- 2008 Cloudera founded
- 2012 Yahoo Hadoop cluster reaches 42,000 nodes
- 2012.08 YARN becomes subproject

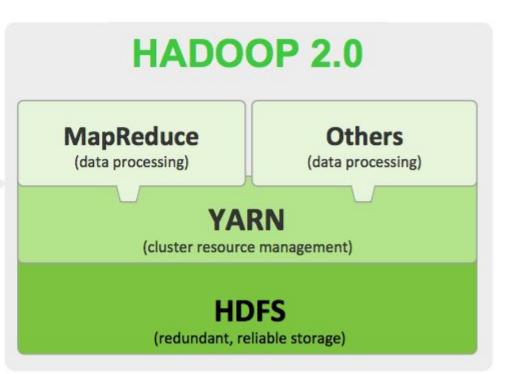
### 2012 YARN

## MapReduce

**HADOOP 1.0** 

(cluster resource management & data processing)





# Functional programming

## What is old is new again

### **Programming paradigms**

• Imperative

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- Structured
- Procedural
- Object-oriented
- Event-driven
- Declarative
- Functional
- Reactive

### **Gottfried von Leibniz**

(1) Create a 'universal language' in which all possible problems can be stated.

(2) Find a decision method to solve all the problems stated in the universal language.



Entscheidungsproblem

### **1936 Church & Turing**

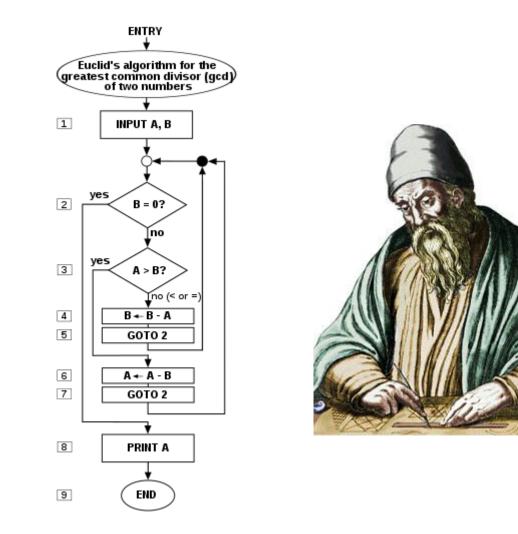




#### Turning machine



#### Algorithms



#### Lambda calculus

- A formal system in mathematical logic for expressing computation based on function abstraction and application using variable binding and substitution.
- The smallest universal programming language of the world. The  $\lambda$  calculus consists of a single transformation rule (variable substitution) and a single function definition scheme.

#### Lambda examples

(7 + 4) \* (8 + 5 \* 3)
→ 11 \* (8 + 5 \* 3)
→ 11 \* (8 + 15)
→ 11 \* 23
→ 253.



(defun factorial (n) (if (= n 0) 1 (\* n (factorial (- n 1)))))

#### **Functional programming languages**

1932 Lambda calculus -- Alonzo Church 1958 LISP -- John McCarthy 1970 Scheme 1986 Erlang 1990 Haskell 1995 JavaScript 2004 Scala 2005 F# 2007 Clojure

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# Stream Programming

### What, when, why, how?

#### A rose by any other name...

- Stream programming
- Stream processing
- Real-time analytics
- Streaming analytics
- Complex event processing (CEP)
- Real-time streaming analytics
- Event processing

#### **Earlier CEP frameworks**

• 2002Aurora

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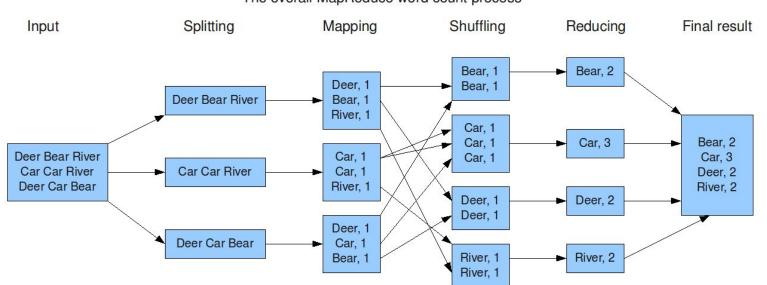
- 2005Borealis
- 2005 Apama
- 2007 Cayuga
- 2008 Esper
- 2011 Apache S4 (Yahoo)

#### What is CEP?

Trivial001 PushReact to a button pushed005 PushComplex0012 PushReact to a button pushed 3 times in 10<br/>seconds0014 PushALERT<br/>0021 Pushalert again?

0033 Push

#### MapReduce



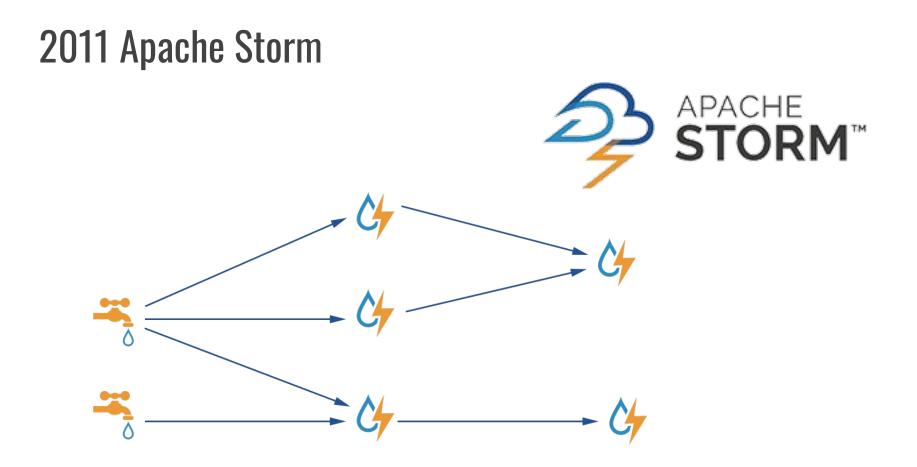
The overall MapReduce word count process

#### Workflows

Oozie Luigi Azkaban Airflow Pinball Cascading

Taskflow

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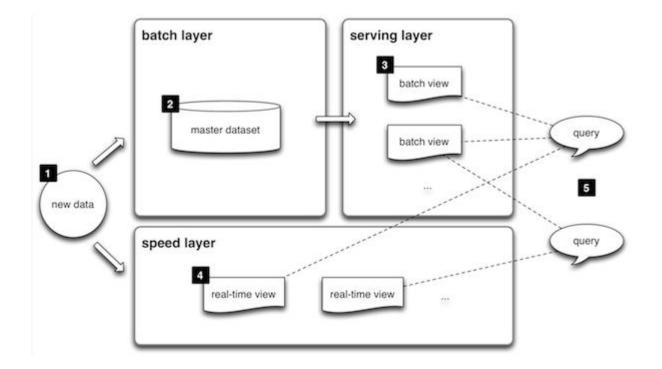
#### Streaming frameworks

2011Apache Storm

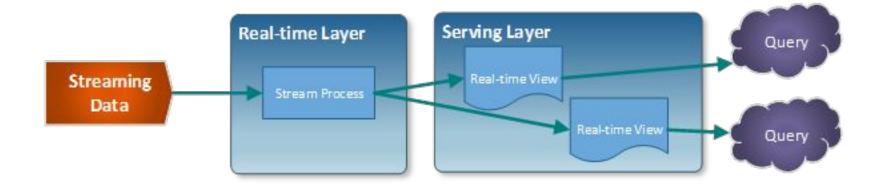
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2014**Apache Spark** Apache Samza 2015Apache Flink Apache Nifi 2016Apache Gearpump Apache Apex **Kafka Streams** Akka Streams

#### 2013 Lambda Architecture



#### 2015 Kappa architecture

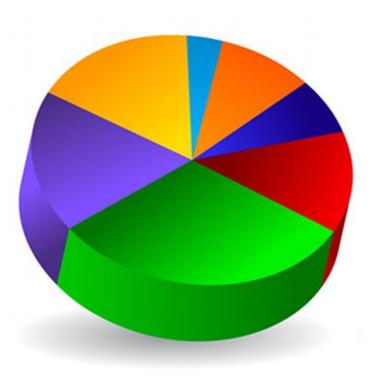


## Why history?

### The only constant is change

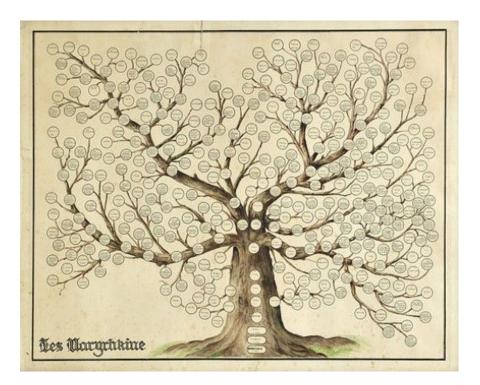
#### **Pie metaphor**

- Different technologies fill different roles, like slices of a pie
- Where slices meet neither solution is a perfect match
- The pie is always expanding
- The boundary between slices become large gaps
- New technologies arise to fill the gaps



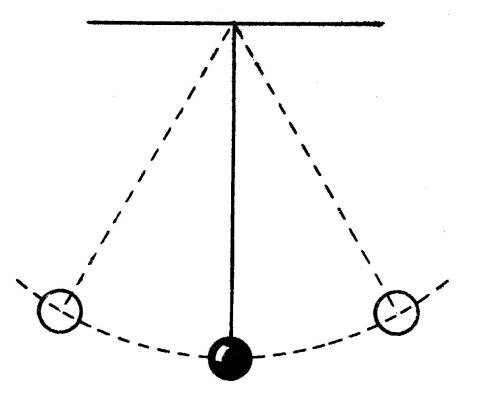
#### **Tree metaphor**

- There are many, many instances of the same thing
- Focus on root or branch technology before dealing with leaves
- What is old is new again

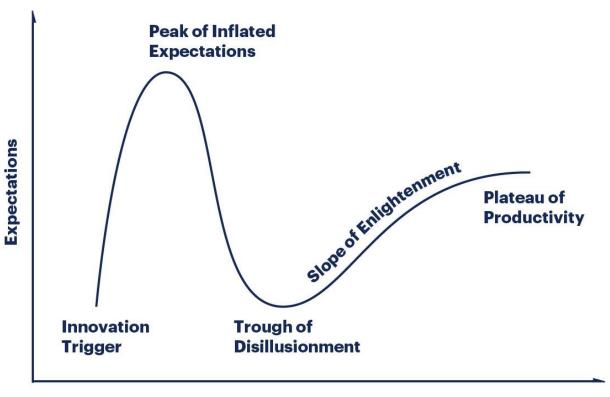


#### **Pendulum metaphor**

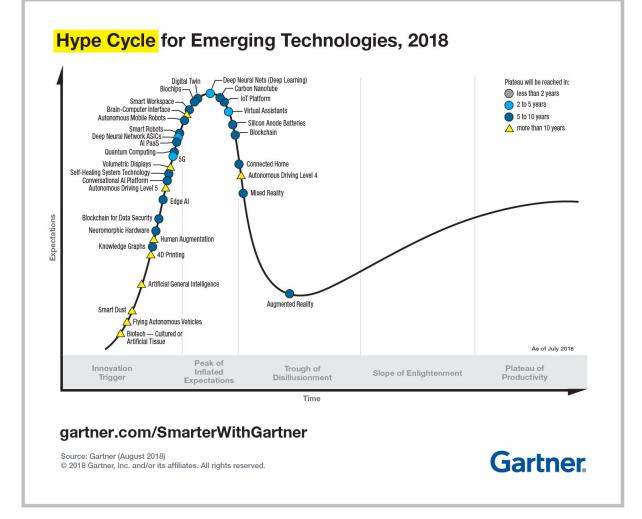
- Markets oscillate
- Centralized to decentralized
- Structured to unstructured
- Consolidated to fractured



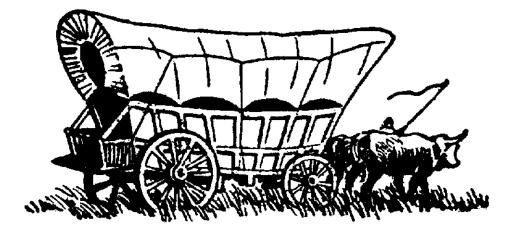
#### The hype cycle



#### Time



#### Build wagons, not cabins





## **THANK YOU!**

