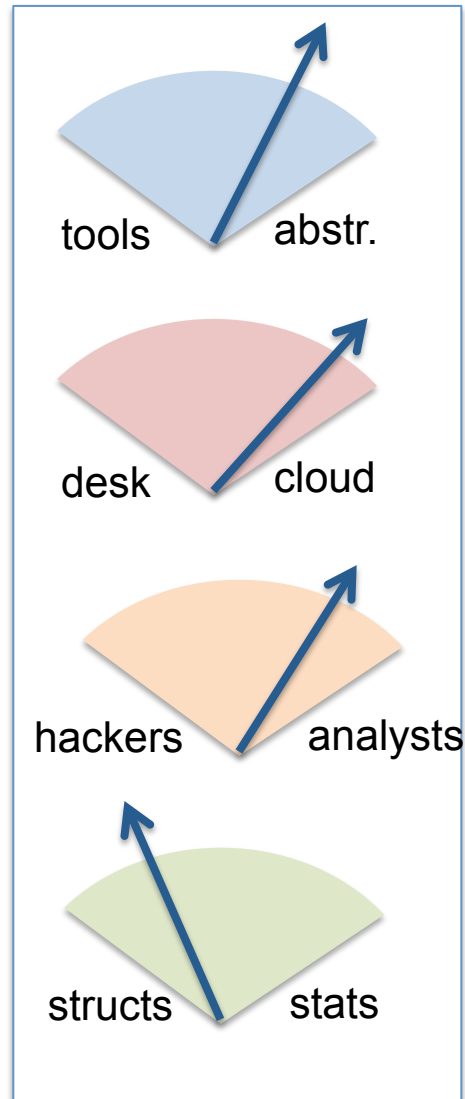
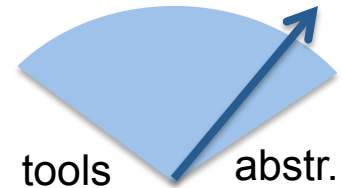


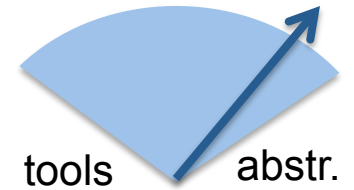
This Course





What goes around comes around

- Pre-2004: commercial RDBMS, some open source
- 2004 Dean et al. MapReduce
- 2008 Hadoop 0.17 release
- 2008 Olston et al. Pig: Relational Algebra on Hadoop
- 2008 DryadLINQ: Relational Algebra in a Hadoop-like system
- 2009 Thusoo et al. HIVE: SQL on Hadoop
- 2009 Hbase: Indexing for Hadoop
- 2010 Dietrich et al. Schemas and Indexing for Hadoop
- 2012 Transactions in HBase (plus VoltDB, other NewSQL systems)
- But also some permanent contributions:
 - Fault tolerance
 - Schema-on-Read
 - User-defined functions that don't suck

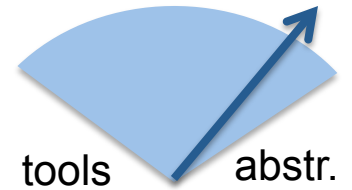


What are the *abstractions* of data science?

“Data Jujitsu”
“Data Wrangling”
“Data Munging”

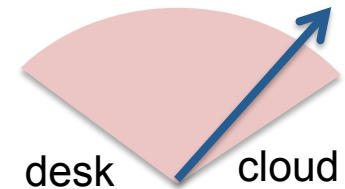


Translation: “We have no idea what this is all about”



What are the *abstractions* of data science?

matrices and linear algebra?
relations and relational algebra?
objects and methods?
files and scripts?
data frames and functions?



Data Access Hitting a Wall

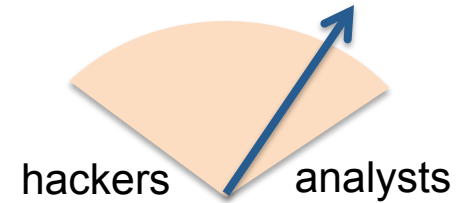
Current practice based on data download (FTP/GREP)

Will not scale to the datasets of tomorrow

- You can GREP 1 MB in a second
- You can GREP 1 GB in a minute
- You can GREP 1 TB in 2 days
- You can GREP 1 PB in 3 years.
- Oh!, and 1PB ~5,000 disks
- At some point you need **indices** to limit search
- **parallel** data search and analysis
- This is where databases can help
- You can FTP 1 MB in 1 sec
- You can FTP 1 GB / min (~1\$)
- ... 2 days and 1K\$
- ... 3 years and 1M\$

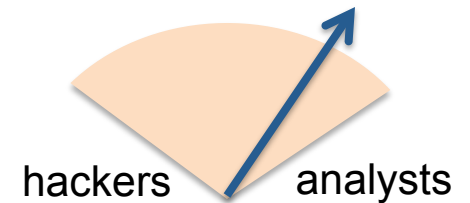


[slide src: Jim Gray]



US faces shortage of 140,000 to 190,000 people “with deep analytical skills, as well as **1.5 million managers and analysts** with the know-how to use the analysis of big data to make effective decisions.”

--Mckinsey Global Institute



Biologists are beginning to write very complex queries (rather than relying on staff programmers)

Example: Computing the overlaps of two sets of blast results

```
SELECT x.strain, x.chr, x.region as snp_region, x.start_bp as snp_start_bp
, x.end_bp as snp_end_bp, w.start_bp as nc_start_bp, w.end_bp as nc_end_bp
, w.category as nc_category
, CASE WHEN (x.start_bp >= w.start_bp AND x.end_bp <= w.end_bp)
THEN x.end_bp - x.start_bp + 1
WHEN (x.start_bp <= w.start_bp AND w.start_bp <= x.end_bp)
THEN x.end_bp - w.start_bp + 1
WHEN (x.start_bp <= w.end_bp AND w.end_bp <= x.end_bp)
THEN w.end_bp - x.start_bp + 1
END AS len_overlap
```

```
FROM [koesterj@washington.edu].[hotspots_deserts.tab] x
INNER JOIN [koesterj@washington.edu].[table_noncoding_positions.tab] w
ON x.chr = w.chr
WHERE (x.start_bp >= w.start_bp AND x.end_bp <= w.end_bp)
OR (x.start_bp <= w.start_bp AND w.start_bp <= x.end_bp)
OR (x.start_bp <= w.end_bp AND w.end_bp <= x.end_bp)
ORDER BY x.strain, x.chr ASC, x.start_bp ASC
```

We see thousands of queries written by non-programmers

