



## A BRIEF HISTORY OF THE SSDBM CONFERENCE SERIES

## **30<sup>TH</sup> ANNIVERSARY**

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SSDBM conference July 9-11, 2018

A. Shoshani

## Outline

- How did this conference series start
- Research topics evolution over time
- Future challenges
- Light-hearted anecdotes
- Next conference Santa Cruz, California

#### 30 SSDBM conferences over 37 years

#### PREVIOUS CONFERENCES

2018, Bozen-Bolzano, Italy 2017, Chicago, Illinois 2016, Budapest, Hungary 2015, San Diego, California 2014. Denmark 2013, Baltimore 2012, Crete, Greece 2011, Portland, Oregon 2010, Heidelberg, Germany 2009. New Orleans 2008, Hong Kong 2007, Banff, Canada 2006, Vienna, Austria 2005, Santa Barbara, California 2004, Santorini, Greece 2003, Cambridge, Massachusetts 2002, Edinburgh, Scotland 2001, Fairfax, Virginia 2000, Berlin, Germany 1999, Cleveland, Ohio 1998, Capri, Italy 1997, Olympia, Washington 1996, Stockholm, Sweden 1994, Charlottesville, Virginia 1992, Ascona, Switzerland 1990, Charlotte, North Carolina 1988, Rome, Italy 1986, Luxembourg 1983, Los Altos, California 1981, Menlo Park, California

#### **OBSERVATIONS**

- Great locations
- Great social experience
- Small crowd, no parallel sessions
- All volunteer work
- Based on popular interest
- I attended all, but one
- I had papers in most
- Next: Santa Cruz, California

## **Department of Energy Labs**



Office of Science Labs Other Offices Labs

# **DOE's Leadership Class Facilities**

#### **Oak Ridge Leadership Computing Facility**

Titan Cray XK7 20 petaflops hybrid-architecture 18,688 AMD 16-core Opteron 6274 CPUs (a total of 299,008 processing cores) 18,688 NVIDIA Kepler GPUs 710 terabytes of memory 10 petabyte disk

#### **Argonne Leadership Computing Facility**

Mira IBM Blue Gene/Q 10 petaflops 786,432 processors 768 terabytes of memory 7.6 petabytes disk

# 3000 Mpc/h 50 Mpc/h

NERSC The National Energy Research Scientific Computing Center (NERSC) -LBNL Hopper Cray XE6 1.28 Petaflops/sec, 153,216 compute cores,

- 212 Terabytes of memory, and
- 2 Petabytes of disk.

#### **ESnet**

Energy Sciences Network (ESnet) Upgraded recently to 100 Gb/s on main connections



## **Example of Large Data Volume in Science**

Large Hadron Collider: to find the God particle

- sensors capable of 140PB/s
- reduce 99.99% of data by hardware triggers
- Keep 15 PB per year
- 27 km tunnel
- ~10,000 superconducting magnets
- Operating temperature 1.9 Kelvin
- Construction cost:
  US\$9Billion
- Power consumption: ~120 MW



## **Data models and SSDBM**

- Pre-1970
  - Hierarchical model
    - Integrated Data Store (IDS), by GE
    - Model based on efficient physical organization
      - E.g. projects → employees, employee → children
      - Specialized query interfaces (procedural: follow pointers)
    - Later: XML databases
    - Problem: data model does not capture more complex associations: projects <-> employees
- Post-1970
  - Relational model
    - Separation of logical data model from physical data model (physical data independence)
    - Logical-level query language (SQL)
    - Mapping required query optimization, indexing, physical data layout,
    - Multiple implementation based on a standard query language

# Why Scientists Don't Use Data Management Systems?

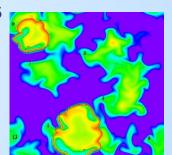
(when I Joined LBNL in 1976)

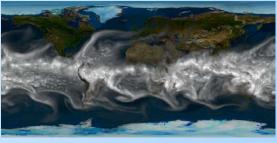
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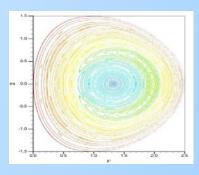
## What does "Scientific Data Management" mean?

#### **Target Scientific Applications**

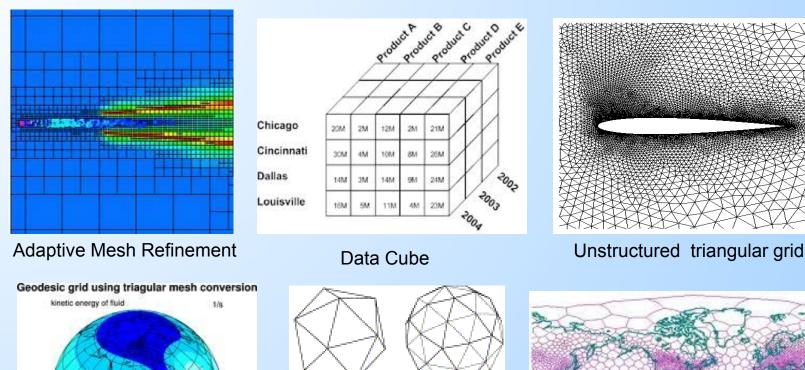
- Climate, Combustion, Fusion, Accelerator design, Cosmology,
- Three pillars of science
  - Theory, Experiments, Simulations, and later Data Analysis (fourth paradigm)
- Algorithms, techniques, and software
  - Representing scientific data data models, metadata (structured/unstructured array models, geodesic models, sequence data, streaming data )
  - Managing I/O methods for removing I/O bottleneck
  - Accelerating efficiency of access data structures, indexing
  - Facilitating data analysis data manipulations for finding patterns and meaning in the data
  - Support visual analytics accelerate extraction of subsets for real-time visualization

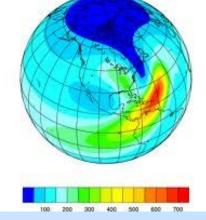






## **Scientific Data Models**





Geodesic data model

(a) Replace resolutions (b) N=2 (c) Of the second s

Geodesic triangular data model

(d) N=19

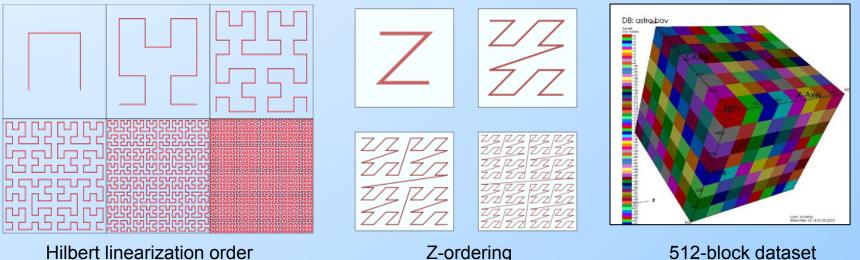
(c) N=4

Unstructured grid: Voronoi tesselation

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## **Physical Data Structure**

- Linearization of data based on data model •
  - By coordinate order based on most prevalent access
  - Hilbert or Z-ordering to support local neighborhood access
  - Partitioning data into blocks for parallel processing
  - Assigning block to different processors
  - Striping blocks on disk



Hilbert linearization order

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512-block dataset colored by thread ID A. Shoshani

## Scientific data models have special operators

- Spatial structures (e.g. climate, airplane wing)
  - Region operators, slices from 3D to 2D,
- Space over time structures
  - Spatial overlap over time-steps to track pattern progress
- Temporal data
  - Before/after operators, time-overlap operators
- Time-series data (e.g. sensor data)
  - Statistical operators over regular time-intervals
- Sequence data (e.g. biology)
  - Have special alphabet (4 base-pairs for DNA, 22 for protein)
- Irregular 3D structures
  - Protein folding operators
- etc., etc.

#### Data Management

 support of physical data structures and optimization of operations over scientific logical data structures

#### Data Analysis

 support for manipulations of logical data structures to enhance data understanding

#### Visualization

 facilitating real-time visual exploration of space-time data, as well as analysis of properties of various data structures

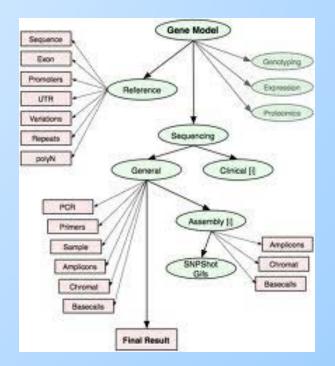
## **On Scientific Metadata**

Metadata is essential to describe how the data was generated/collected

- Self-describing data formats (using headers and footers) e.g. netCDF
- Hierarchical data formats allowing organization of data as well as annotation e.g. HDF5
- External information: who, what, when, provenance, codes, device specifics,
- Ontologies, Controlled Vocabularies

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NROWS 159
XLLCENTER -180.000000
YLLCENTER -73.000000
CELLSIZE 1.000000
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198.498071E-3 114.513593E-3 82.1898865E-3 54.02
155.341667E-3 139.135374E-3 66.8215432E-3 84.58
153.669087E-3 94.3665907E-3 24.1716725E-3 18.82
135.130462E-3 123.930034E-3 88.6469984E-3 91.19
188.821454E-3 202.7815E-3 197.85104E-3 188.2052
198.55063E-3 201.404518E-3 220.585076E-3 193.95
226.080799E-3 211.438835E-3 235.117227E-3 204.0
244.197898E-3 204.614865E-3 229.894697E-3 235.3
207.355252E-3 200.230193E-3 206.504128E-3 199.0
197.759218E-3 212.223286E-3 241.780236E-3 267.7
222.131406E-3 191.566126E-3 203.036597E-3 236.2
299.368517E-3 237.536505E-3 233.033214E-3 245.6
273.180655E-3 241.16174E-3 213.813175E-3 209.55
333.870927E-3 355.628877E-3 303.901906E-3 275.0
221.546563E-3 243.796025E-3 275.234046E-3 272.5
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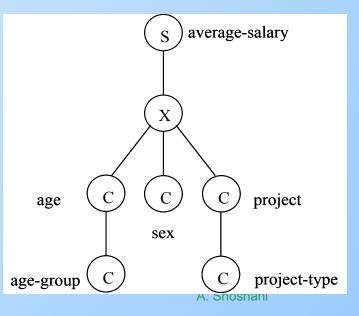
netCDF data structure



#### HDF5 hierarchical data formateshani

## First SSDBM (1981) – focus on statistical data

- Menlo Park, CA
- Looking at Socio-Economic data
  - Population by (state, city, race, age, sex)
  - Socio-economic scientists did not use database systems
  - Data model does not fit relational models
    Statistical Data Bases
    Logical Model
- Statistical data model
  - Multi-dimensional + hierarchies over dimensions
  - Became popular with SIGMOD conferences

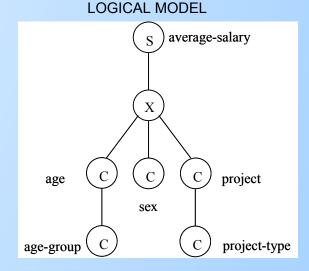


## First SSDBM (1981) – focus on statistical data

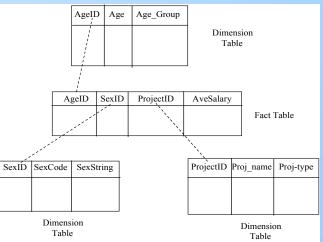
- OLAP
  - Later SDBs were re-introduced as OLAP, plus operators (role-up, drill-down, )
  - Paper on "OLAP vs. Statistical Databases" – PODS 1997
  - Later OLAP was visualized as "data cubes", plus operators (Jim Gray)
  - Implementation of OLAP databases by Microsoft, Oracle, Sybase
  - Lesson: specialized systems developed for this type of a data model
  - System S

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- 1981: <u>Richard A. Becker</u>: Data Manipulation in the S System for Interactive Data Analysis.
- R is an implementation of the S programming language



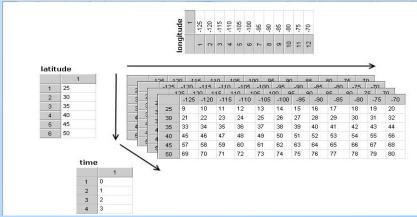
#### ROLAP REPRESENTATION



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## Third SSDBM (1986) – Luxemburg

- Rojer Cubbit
- Got involved in statistical office of EU
- SSDBM started alternating between US and EU
- Introducing Scientific data
- Why? Scientists in general did not use database management systems
- VLDB 1994:
  - "Characteristics of Scientific Databases" VLDB 1984 (Arie Shoshani, Frank Olken, Harry K. T. Wong)
  - Identified array data as an important model for scientists
  - Data kept in specialized file formats
    - NetCDF, HDF5, FITS,
    - Having their own libraries
  - This is still the case today!!!



## **SSDBM (1996-1998)**

- NSF got interested Maria Zemankova
  - Suggested to alternate every year between Europe and USA
  - Before that it was every other year
- 1997 Olympia, WA

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- Interest in Environmental Data was introduced <u>Francis P. Bretherton</u>, <u>William L. Hibbard</u>: Metadata: A Case Study from the Environmental Sciences.
- Also Knowledge Discovery
  <u>Usama M. Fayyad</u>: Data Mining and Knowledge Discovery in Databases:
  Implications for Scientific Databases
- "Summarizability" of Statistical database introduced <u>Hans-Joachim Lenz</u>, <u>Arie Shoshani</u>: Summarizability in OLAP and Statistical Data Bases
- 1998 Capri
- Interest in Multidimensional Arrays was presented <u>Norbert Widmann</u>, <u>Peter Baumann</u>: Efficient Execution of Operations in a DBMS for Multidimensional Arrays
- Product: Rasdaman, open-source

# **SSDBM (2001-2004)**

2001 – Fairfax, VA

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- Interest in Earth Systems was presented James Frew, Rajendra Bose: Earth System Science Workbench: A Data Management Infrastructure for Earth Science Products
- 2002 Edinburgh
  - Interest in Biology and Gene Expression was presented <u>Albert Burger, Richard A. Baldock, Yiya Yang, Andrew M. Waterhouse, Derek</u> <u>Houghton, Nick Burton, Duncan Davidson</u>: The Edinburgh Mouse Atlas and Gene-Expression Database: A Spatio-Temporal Database for Biological Research
- 2004 Santorini
  - Interest in Scientific Workflows was presented <u>Ilkay Altintas</u>, <u>Chad Berkley</u>, <u>Efrat Jaeger</u>, <u>Matthew B. Jones</u>, <u>Bertram</u> <u>Ludäscher</u>, <u>Steve Mock</u>: Kepler: An Extensible System for Design and Execution of Scientific Workflows
  - Led to Kepler, an open-source product

# **SSDBM (2008-2012)**

#### 2008 – Hong Kong

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- Interest in Scientific Ontology Databases was presented Paea LePendu, Dejing Dou, Gwen A. Frishkoff, Jiawei Rong: Ontology Database: A New Method for Semantic Modeling and an Application to Brainwave Data.
- 2011 Portland
  - Interest in Scientific Database Systems was presented <u>Michael Stonebraker</u>, <u>Paul Brown</u>, <u>Alex Poliakov</u>, <u>Suchi Raman</u>: The Architecture of SciDB
  - Product: open source SciDB
- 2012 Crete
  - Interest in Data Fusion was presented David Maier, V. M. Megler, António M. Baptista, Alex Jaramillo, Charles Seaton, Paul J. Turner: Navigating Oceans of Data.

# **SSDBM (2013-2017)**

#### 2013 – Baltimore

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- Interest in Big Data was presented (keynote)
  <u>Michael J. Franklin</u>: Making Sense of Big Data with the Berkeley Data Analytics Stack.
- Interest in Streaming Data was presented <u>Hamid Mousavi\*, Carlo Zaniolo</u>: Fast Computation of Approximate Biased Histograms on Sliding Windows over Data Streams
- 2016 Budapest
  - Interest in User-Defined-Functions (UDF) was presented Mark Raasveldt, Hannes Mühleisen: Vectorized UDFs in Column
  - Stores
  - Product: open source MonetDB/Python
- 2017 Chicago
  - Interest in N-dimensional Arrays was presented <u>Veranika Liaukevich</u>, <u>Dimitar Mišev</u>, <u>Peter Baumann</u>, <u>Vlad Merticariu</u>: Location and Processing Aware Datacube Caching

## **Final Thoughts**

- Work with domain scientists and identify their data problems
  - Their logical/abstract data model
  - Their operators on that data models, including functions on the data (UDFs)
  - Their metadata, ontology, controlled vocabularies
  - Their data constraints
- Finds out how they store their data specialized file formats
  - Do not try to force them to reshaped their data into your system (too big of a task, they will loose interest)
- Build something useful to them, and integrate in their environment
  - That will keep their attention for continued collaboration
- Submit your paper(s) to SSDBM

# LIGHT-HEARTED ANECDOTES

## Fun memories

#### 1988, Rome, Italy

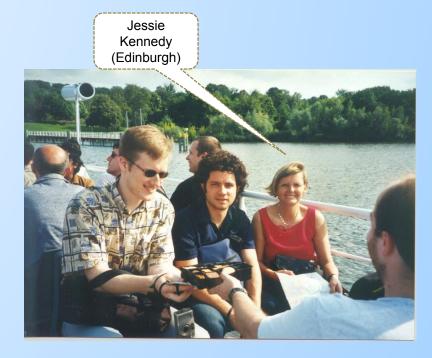
- Gucci bags to all + Channel perfume for woman
- Banquet at an estate outside Rome, six course
- 1996, Stockholm, Sweden
- River ride to forest, walk to banquet
- 1997, Olympia, Washington
- Nature walk to ocean
- 1998, Capri, Italy
  - One afternoon free to visit blue grotto
- 2000, Berlin, Germany
  - River boat ride
- 2002, Edinburgh, Scotland
  - Yearly fireworks spectacular display
- 2004, Santorini, Greece
  - Boat ride to the islands swimming in sea
- 2005, Santa Barbara, California
  - Banquet: barbecue on beach
  - 2007, Banff, Canada
    - Spectacular nature setting in the park



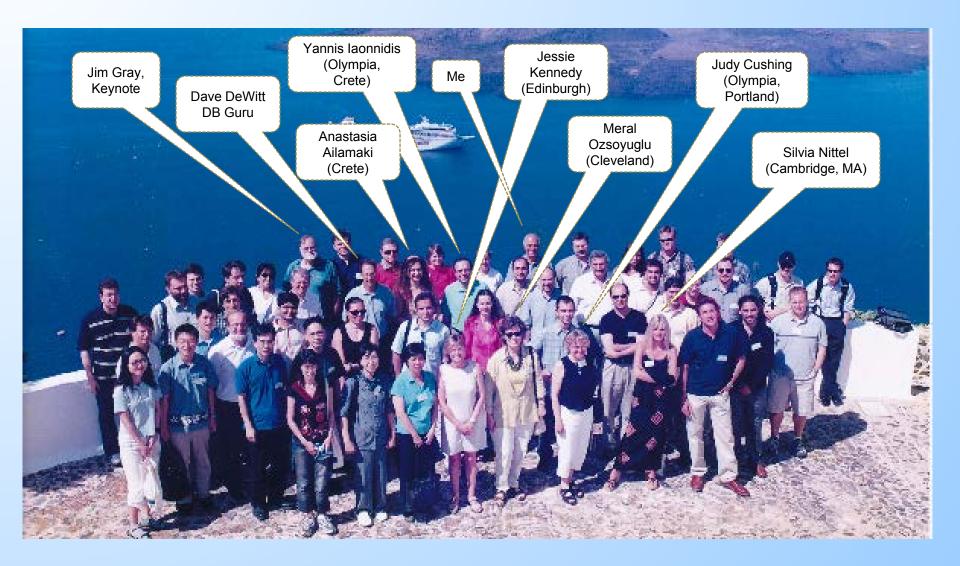
- 2010, Heidelberg, Germany
  - Held at European Media Lab beautiful gardens
- 2011, Portland, Oregon
  - Great beer at location near river
- 2012, Crete, Greece
  - Beautiful hotel with view of Mediterranean

# **Berlin (2000)**





# Santorini (2004)



## **Banff (2007)**



## New Orleans (2009)



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## **Crete (2012)**



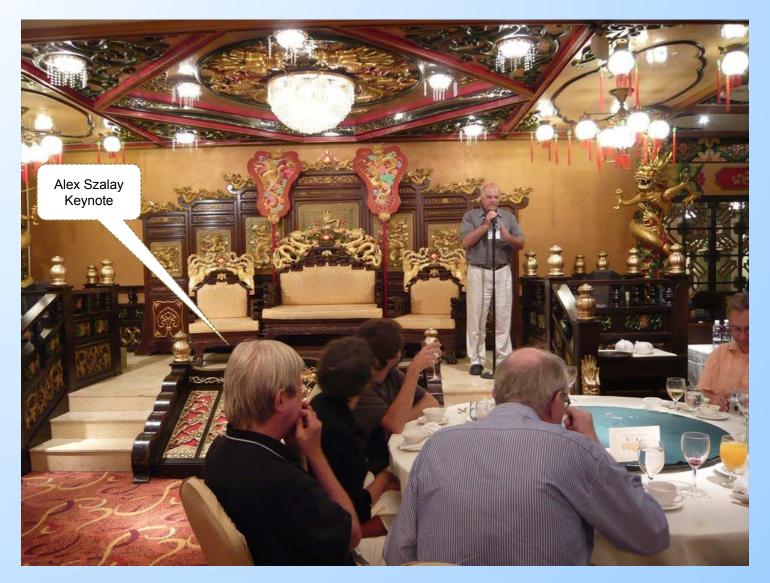
# Hong Kong (2008)



# Hong Kong (2008)



## Hong Kong – rain, rain, everywhere



# Aalborg (2014)



## Budapest (2016)



# THE END