Computer Science: The Ever-Expanding Sphere



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eScience Institute

Dean's Seminar Series, McCormick School of Engineering Northwestern University

April 2016





Today

- A reminder of the extraordinary progress that Computer Science has achieved
- A glimpse at what's happening today
- A 21st century view of the field
- The role of Computer Science in the modern university
 - One quick example: The University of Washington eScience Institute
- The role of Computer Science in the modern world
- Student response (enrollment trends)
- Institutional response

1969 – Forty seven years ago ...





W UNIVERSITY of WASHINGTON







\mathbf{W} university of washington







W UNIVERSITY of WASHINGTON













THE ARPA NETWORK DEC 1969 4 NODES





With nearly 5 decades of hindsight, which had the greatest impact?

Unless you're big into Tang^{*} and Velcro^{*} (or sex and drugs), the answer is clear ...





* Commonly – although erroneously – attributed to the space program

The exponential improvements that have characterized computing can be exploited in two ways

- Constant capability at exponentially decreasing cost
- Exponentially increasing capability at constant cost

















W UNIVERSITY of WASHINGTON



Today, these exponential improvements in technology (and also in algorithms!) are enabling a "big data" revolution

- A proliferation of sensors
 - Think about the sensors on your phone
- More generally, the creation of almost all information in digital form
 - It doesn't need to be transcribed in order to be processed
- Dramatic cost reductions in storage
 - You can afford to keep all the data
- Dramatic increases in network bandwidth
 - You can move the data to where it's needed



- Dramatic cost reductions and scalability improvements in computation
 - With Amazon Web Services, 1000 computers for 1 day costs the same as 1 computer for 1000 days
- Dramatic algorithmic breakthroughs
 - Machine learning, data mining fundamental advances in computer science and statistics
- Ever more powerful models producing ever-increasing volumes of data that must be analyzed



So, exactly what's meant by "big data"?



Serious answer: "big data" is enabling computer scientists to put the "smarts" into everything

- Smart homes
- Smart cars
- Smart health
- Smart robots
- Smart crowds and human-computer systems
- Smart education
- Smart interaction (virtual and augmented reality)
- Smart cities
- Smart discovery





Smart homes (the leaf nodes of the smart grid)



Shwetak Patel, University of Washington 2011 MacArthur Fellow









Smart cars

DARPA Grand Challenge

Tesla Model S



DARPA Urban Challenge



Adaptive cruise control





Google Self-Driving Car



Self-parking



Smart health



Larry Smarr - "quantified self"





Evidence-based medicine



Institute for Systems Biology



P4 medicine

Smart robots









Smart crowds and human-computer systems



Zoran Popovic UW Computer Science & Engineering



David Baker UW Biochemistry

21:55:24 GMT foldit BETA Solve Puzzles for Science	PUZZLES CATEGORIE BLOG FEEDBACK	ES GROUPS PLAYERS RECIPES CONTESTS Forum Wiki Faq about credits
	bifc discovery establ	GET STARTED: DOWNLOAD Windburg Windburg (XP/Vistar778) Windburg (XP/Vistar778) COSX (10.7 or later) COSX (10.7 or later) COSX (10.7 or later) CIIck here. Are you a student? CIIck here. Are you an educator? Click here. SEARCH Google Search CONSCIPCION
Be creative and build extract	ordinary tiny machines!	RECOMMEND FOLDIT
What's New	<u></u>	USER LOGIN
Developer Preview Release Soon		Username: *
Hey everyone,		Password: *
We're about to push an update to the developer preview that and fixes listed below:	t will introduce the features	Log in
Tools: * Remix: Remix has been significantly reworked. Running Ri interface which allows you to select among a list of ontions	emix will now pop up an The tool will also now only	Request new password

Smart education



Zoran Popovic UW Computer Science & Engineering









Arts

Smart interaction

Microsoft HoloLens





for XBOX 360.

GOOGLE CARDBOARD

Experience virtual reality in a simple, fun, and affordable way.



Smart interaction – content creation



Steve Seitz UW Computer Science & Engineering + Google Seattle



Experiences like you're actually there.



Cardboard Camera Google Inc. Tools *****:6,117 * Everyone You don't have any devices Add to Wishlist Install











Smart cities









Smart discovery: "The Fourth Paradigm"

- 1. Empirical + experimental
- 2. Theoretical
- 3. Computational
- 4. Data-Intensive









Jim Gray





Each augments, vs. supplants, its predecessors – "another arrow in the quiver"

A 21st century view of Computer Science: A field unique in its societal impact



Is this stuff computer science?

Medicine & Global Health

Transportation

Education

Scientific Discovery

> Neural Engineering

Energy & Sustainability

Technology Policy and Societal Implications

> Security, Privacy, & Safety

Advancing the Developing World

Interacting with the Physical World: "The Internet of Things"

Elder Care

Accessibility

"The last electrical engineer"

"I am worried about the future of our profession. ... I see the world as an inverted pyramid. It balances precariously on the narrow point at the bottom. ... This point is being impressed into the ground by the heavy weight at the wide top of the inverted pyramid where all the applications reside. ... Electrical engineering will be in danger of shrinking into a neutron star of infinite weight and importance, but invisible to the known universe. ... Somewhere in the basement of Intel or its successor ... the last electrical engineer will sit."

Bob Lucky *IEEE Spectrum* May 1998



"Computer Science: The ever-expanding sphere"



"Computer Science: The ever-expanding sphere"



The role of Computer Science in the modern university



 The Center for Sensorimotor Neural Engineering, an NSF Engineering Research Center



• The **Center for Game Science**, funded by the Gates Foundation and DARPA to create revolutionary games for scientific discovery and for learning





- The eScience Institute, funded by the Moore, Sloan, Washington Research, and National Science Foundations to bring advances in data-intensive discovery to researchers campus-wide
- dub "design-use-build" a campus-wide collaboration that has made UW one of the top institutions in the nation in humancomputer interaction



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- Urban@UW, a campus-wide urban science collaboration
- The **Taskar Center for Accessible Technology** develops and deploys technologies that increase independence and improve quality of life for individuals with motor and speech impairments
- **Change**, a campus-wide collaboration exploring how technology can improve the lives of underserved populations in low-income regions
- The **Tech Policy Lab**, a joint effort of CSE, the School of Law, and the Information School, funded by Microsoft





- **GIX** the Global Innovation Exchange a new kind of education that is global, project-based, and integrates technology, design, and entrepreneurship
- The Intel Science and Technology Center for Pervasive Computing, led by UW, with researchers from Cornell, Georgia Tech, Rochester, Stanford, and UCLA

One quick example: The University of Washington eScience Institute

"All across our campus, the process of discovery will increasingly rely on researchers' ability to extract knowledge from vast amounts of data... In order to remain at the forefront, UW must be a leader in advancing these techniques and technologies, and in making [them] accessible to researchers in the broadest imaginable range of fields." [2007 concept paper]



Major sources of support for our "core effort"

- University of Washington
 - \$725,000/year for staff support
 - \$600,000/year for faculty support
- National Science Foundation
 - \$2.8 million over 5 years for graduate program development and Ph.D. student funding (IGERT)
- Gordon and Betty Moore Foundation and Alfred P. Sloan Foundation
 - \$37.8 million over 5 years to UW, Berkeley, NYU
- Washington Research Foundation
 - \$9.3 million over 5 years for faculty recruiting packages, postdocs
 - Also \$7.1 million to the closely-aligned Institute for Neuroengineering











FOUNDATION

Washington Research
Genesis of the Moore/Sloan "Data Science Environments" effort

- The Foundations have a focus on novel advances in the physical, life, environmental, and social sciences
- They recognized the emergence of data-intensive discovery as an important new approach that would lead to new advances
- They perceived a number of impediments to success
- They sought partners who were prepared to work together in a <u>distributed collaborative experiment</u> focused on tackling these impediments













Our original core faculty team (much expanded now)





Cecilia Aragon Human Centered Design & Engr.



Magda Balazinska Emily Fox **Computer Science** Statistics & Engineering



Carlos Guestrin CSE





CSE







Thomas Richardson Statistics, CSSS Mathematics



Werner Stuetzle Statistics





David Beck Chemical Engr.



Biology



Tom Daniel



Bill Noble **Genome Sciences**



Ginger Armbrust Oceanography



Josh Blumenstock iSchool



Geography



Tyler McCormick Sociology, Statistics, CSSS



Andy Connolly Astronomy



John Vidale Earth & Space Sciences



CSE





Applied

Our original core faculty team (much expanded now)



Among our activities

- Educational initiatives at the Bachelors, Masters, and Doctoral levels, plus professional education certificate programs and Coursera MOOCs
- Hires of "pi-shaped" faculty (facilitated by the Provost and the Washington Research Foundation)
- A vibrant program of dual-mentored postdocs and graduate students
- A permanent staff of superb Ph.D.-level Data Scientists spanning disciplines
- A collaboratory: the WRF Data Science Studio
- Myriad training and mentoring activities: short-courses, workshops, office hours
- Deep partnerships, plus an "incubation program" for data-intensive research projects



One example of a deep partnership

Role of microbes in marine ecosystems

• Ginger Armbrust (Oceanography), Bill Howe (CSE + eScience Institute)





UNIVERSITY of WASHINGTON



SQLShare: Database-as-a-Service for Science

Try SQLShare | Tutorial | Publications | Developers | How to Cite SQLShare

Python API | R API | REST API

SQLShare: Upload Data, Get Answers, Share Results

SQLShare is a database service aimed at removing the obstacles to using relational databases: installation, configuration, schema design, tuning, data ingest, and even application design. You simply upload your data and immediately start querying it.

Integrating across physics, biology, and chemistry

Query across data sets in real-time: "not just faster...different!"



Dan Halperin, Research Scientist, eScience Institute



Konstantin Weitz Graduate student, CSE

Connecting across distributed labs





Completely automated

Credit: Ginger Armbrust, University of Washington

One of dozens of incubation projects



Predictors of Permanent Housing for Homeless Families

- Project leads: Neil Roche and Anjana Sundaram, The Bill and Melinda Gates Foundation
- DSSG Fellows: Fablina Ibnat, Jason Portenoy, Chris Suberlak, Joan Wang
- ALVA students: Cameron Holt, Xilalit Sanchez
- Data Scientist Mentors: Ariel Rokem, Bryna Hazelton

In Snohomish, Pierce, and King counties

- There are over **4,000** homeless families in the Tri-county area every year
- Families spend on average **8 months** moving from shelter to shelter
- Goal of the Bill & Melinda Gates Foundation and Building Changes: Cut family homelessness in half by 2020 and reduce the time a family spends homeless to 1 month



Credit: Fablina Ibnat, University of Washington

Homeless families may take many pathways through programs



Create data cleaning pipeline for messy Homeless Management Information Systems data



Credit: Fablina Ibnat, University of Washington

Develop visualizations to show how homeless families move through programs



Credit: Fablina Ibnat, University of Washington

Conduct analysis to identify predictors of permanent housing



parents number

by family characteristics Credit: Fablina Ibnat, University of Washington

Correlation with successful outcome,

The role of Computer Science in the modern world

- Every 21st century citizen needs to have facility with "computational thinking" problem analysis and decomposition (stepwise refinement), abstraction, algorithmic thinking, algorithmic expression, stepwise fault isolation (debugging), modeling
 - Computational thinking is not "this particular operating system" or "that particular programming language"
 - Computational thinking is not even programming.
 It's a mode of thought a way of approaching the world
 - Programming is the hands-on, inquiry-based way that we teach computational thinking and the principles of computer science



- 2. Fields from Anthropology to Zoology are becoming *information* fields, and that those who can bend the power of the computer to their will computational thinking, but also computer science in greater depth will be positioned for greater success than those who can't
 - Data science is a perfect example

- 3. Pretty much all of the STEM jobs are in computer science
 - In the computing industry, which is not Dilbert it's an intellectually exciting, highly creative and interactive, "power to change the world" field
 - In all sorts of other fields where people educated as computer scientists – not merely people with some computer science background – are essential



STEM job growth, 2014-24 (US Bureau of Labor Statistics)





- Engineers (17-2000)
- Life scientists (19-1000)
- Physical scientists (19-2000)
- Social scientists and related workers (19-3000)
- Mathematical science occupations (15-2000)

Data from the spreadsheet at http://www.bls.gov/emp/ind-occ-matrix/occupation.xlsx

STEM job openings (growth + replacement), 2014-24 (US BLS)



Computer occupations (15-1100)

- Engineers (17-2000)
- Life scientists (19-1000)
- Physical scientists (19-2000)
- Social scientists and related workers (19-3000)
- Mathematical science occupations (15-2000)

Data from the spreadsheet at http://www.bls.gov/emp/ind-occ-matrix/occupation.xlsx

$\mathbb W$ university of washington

16% of *all* new wages, across *all* fields

CODE.ORG ASK A QUESTION STUDENT OF THE MONTH TEACHER OF THE MONTH

C O D E

16% of all new wages in the U.S. are in computer science

11% of all job openings in the U.S. are in computing categories, and these jobs account for 16% of all new wages. Computing is the second largest occupation category in the U.S. when it comes to total **new** wages, just behind Management Occupations (which include software management positions) and just ahead of Healthcare and Practitioner Occupations.

Here's how we calculated this:

First, we looked at the average count of **new** jobs per occupational category over the past 6 months. According to the **Conference Board**, there were 5,130,483 help wanted online ads in March of 2016. Of these job openings, 566,466 or 11% were in the SOC-15 computer and mathematical science categories* in the Standard Occupational Classification system.

Next, we looked at the **Bureau of Labor Statistics** data on mean salaries. For example, the average salary across all occupations is \$48,320. The average salary across computing jobs (the SOC 15 category) is \$86,170.

For each category, we multiplied the number of job openings times the average salary for the category to estimate the total new wages in that category. Looking at 6 months worth of data, 16.2% of all new wages are in the computing fields.



Credit: Code.org

Fields with workforce gaps in Washington State (Baccalaureate level and above)



Data from Table 2 at http://www.wsac.wa.gov/sites/default/files/2013.11.16.Skills.Report.pdf

King County WA's Aerospace Workforce

KING COUNTY AEROSPACE TALENT PIPELINE

				Bachelor	's Degree							
Annual Average Demand and Supply All Occupations by Education				Occupation	Emplo	Employment		Annual Demand and Supply, 2018-2023				
				Ranked by Annual Openings (2018-2023)	2013 202		2023 2013-2023	Scale: 0 - 162 annual openings in sector				Gap
700 -			1	Computer systems analysts	11,311		3.2%	Demand Supply	22		135	(113)
600 -	599	560	2	Industrial engineers	3,175	3,289	0.4%	Demand Supply	10	77		(67)
222		300	3	Aerospace engineers	2,942	2,899	-0.1%	Demand Supply		65	126	61
500 -			4	Computer network architects	2,611	3,027	1.5%	Demand Supply	38	62		25
400			5	Budget analysts	1,162	1,247	0.7%	Demand Supply	37	57		20
300			6	Mechanical engineers	2,472	2,846	1.4%	Demand Supply	34			(19)
200 -			7	Logisticians	2,730	2,673	-0.2%	Demand Supply	30			(17)
100		411 Graduates	8	Electrical engineers	2,521	2,963	1.6%	Demand Supply	28			(12)
100		149 UI Claims	9	Operations research analysts	1,305	1,546	1.7%	Demand Supply	25			(14)
0	Demand	Supply	10	Engineers, all other	2,039	2,356	1.5%	Demand Supply	23			(13)
(mmunity tributesing		February	v 2, 2016		,	1	WO DEVEL OF SEA	RKF OPMEN TTLE - K	OR T COUL	

- Q: What field has the <u>largest total</u> <u>number of current employees</u> in King County's aerospace industry?
- Q: What field has the <u>greatest</u> <u>predicted number of new</u> <u>employees needed</u> by King County's aerospace industry from 2013-2023?

DRAFT

- Q: What field has the <u>greatest</u> <u>predicted compound annual</u> <u>growth rate</u> for King County's aerospace industry from 2013-2023?
- Q: What field has the <u>greatest</u> <u>predicted annual gap between</u> <u>supply and demand</u> for King County's aerospace industry from 2013-2023 (where "supply" is not "degrees granted" but rather the industry's current ability to hire)?

Students are responding to all three imperatives

- 1. Demand for introductory courses is booming
- 2. Demand for upper-division and graduate courses by non-majors is booming
- 3. Demand for the major is booming



UW CSE introductory course enrollment (1-year rolling average)



Top 10 first-choice majors of UW confirmed incoming freshmen



Top 25 concentrations at Harvard

2007-08

Economics Government Social Studies Psychology English & American Literature & Language History Anthropology **History & Literature Biochemical Sciences** Applied Mathematics Molecular & Cellular Biology Human Evolutionary Biology Neurobiology Biology Mathematics Sociology Chemistry Physics Visual & Environmental Studies History & Science Computer Science Engineering & Applied Science (AB) Chemical & Physical Biology **Environmental Science & Public Policy** Fine Arts / History of Art & Architecture

2015-16

Economics Government Computer Science Applied Mathematics Psychology Social Studies Neurobiology Statistics Human Developmental & Regenerative Biology English History Sociology **History & Literature** Integrative Biology Molecular & Cellular Biology Mathematics Physics Chemistry Human Evolutionary Biology History & Science Engineering & Applied Science (SB) **Biomedical Engineering** Anthropology Philosophy Visual & Environmental Studies

Distribution of science majors at Harvard



Credit: Harry Lewis

Berkeley upper-division CS enrollment from L&S outside of CS



K-12 too: CS AP participation, while still pathetic, is now growing



Code.org will cause all of this to accelerate



Every student in every school should have the opportunity to learn computer science



Code Studio student creations



The Hour of Code Leaderboards

Total participation: 236,723,715 served. Students have written 11,151,730,618 lines of code.





Hadi Partovi Code.org

Institutional response: K-12



Our Nation is at risk. Our once unchallenged preeminence in commerce, industry, science, and technological innovation is being overtaken by competitors throughout the world. This report is concerned with only one of the many causes and dimensions of the problem, but it is the one that undergirds American prosperity, security, and civility.

If an unfriendly foreign power had attempted to impose on America the mediocre educational performance that exists today, we might well have viewed it as an act of war. As it stands, we have allowed this to happen to ourselves.

Recommendation A: Content

We recommend that State and local high school graduation requirements be strengthened and that, at a minimum, all students seeking a diploma be required to lay the foundations in the Five New Basics by taking the following curriculum during their 4 years of high school: (a) 4 years of English; (b) 3 years of mathematics; (c) 3 years of science; (d) 3 years of social studies; and (e) <u>one-half year of computer science</u>.



IBM PC XT 4.77 MHz 8088 128 KB RAM PC DOS 2.0

Scroll forward 30 years, to 2013

Energy (see also Forces and motion) binding energy in molecules, 109, 110, 111, 112, 239-240 cause-and-effect mechanisms, 125-126, 237 chemical energy, 111, 122, 123, 148, 223 in chemical processes and everyday life, 128-130 conservation of, 110, 120-121, 123, 124-126, 128, 148, 153, 154, 175, 223, 238 crosscutting concepts, 84 definitions of, 120-124 electric and magnetic fields, 64, 109, 121, 122, 133, 135, 239 electrical energy, 123, 125, 128 and forces, 126-127 grade band endpoints, 122-124, 125-126, 127, 129-130 kinetic (motion) energy, 110, 111, 121, 122, 123, 124, 126 mechanical energy, 122-123 modeling and mathematical expressions, 123-124, 126 patterns, 121 photosynthesis, 104, 128, 129, 130, 146, 147, 148, 153, 154, 180, 187, 189, 223 "producing" or "using" in everyday life, 128-130 scale of manifestations and, 121, 122, 123-124, 127, 238 in systems, 120-121, 123, 124-126, 128 terminology, 96, 122 thermal energy, 121, 122, 123, 125, 130, 136, 180, 181 (see also Heat) transfer between objects or systems, 93, 110, 120, 121-122, 124-126 stored (potential) energy, 96, 121-122, 123, 124, 126, 127, 128, 129, 130, 221

Forces and motion

cause-and-effect mechanisms, 113, 114, 115-116, 127 Coulomb's law, 117, 118 electromagnetism, 88, 109, 111, 113, 116, 117-118, 121, 123, 126, 127, 239 energy transfers, 116, 120, 127 friction, 115, 116, 117, 122, 125, 128-129, 130 grade band endpoints, 115-116, 127 gravity/gravitational forces, 64, 88, 92, 100, 113, 116, 117-118, 121-122, 123, 126, 127, 169, 173, 175, 176, 179, 180, 181-182, 184, 185 measurement, 114, 115 models, 93, 116, 117, 118, 127 momentum, 115, 116 Newton's laws, 114, 115, 116, 118, 175 patterns in, 115, 116-117, 118, 119, 121, 127, 130, 173, 174, 175, 178, 181, 185 scale and, 114, 116-117, 118, 175 strong nuclear force, 88, 111, 113, 116, 117, 118, 240 and structure and function, 117 in systems and system models, 88, 94, 113, 115, 116, 119, 120, 127, 176 weak nuclear force, 88, 111, 112, 113, 116, 117, 118



Which begat the Next Generation Science Standards ...



Elementary (K-5)							
Storylines: K-2 3-5 PDFs: K 1 2 3 4	5						
K. Forces and Interactions: Pushes and Pulls K. Interdependent Relationships in Ecosystems: Animals, Plants, and Their Environment K. Weather and Climate 1. Waves: Light and Sound 1. Structure, Function and Information Processing 1. Space Systems: Patterns and Cycles 2. Structure and Properties of Matter	Interdependent Relationshi Earth's Systems: Processe K-2. Engineering Design S. Forces and Interactions Interdependent Relationshi Intertrance and Variation of Weather and Climate Energy	ps in Ecosystems s that Shape the Ear ps in Ecosystems (Traits	Waves th4. Structure, Function, and Information Processing 4. Earth's Systems: Processes that Shape the Earth 5. Structure and Properties of Matter 5. Matter and Energy in Organisms and Ecosystems 5. Earth's Systems 5. Space Systems: Stars and the Solar System 3-5. Engineering Design				
PS: Physical Sciences							
Middle School (6-8) Storyline PDF		High School (9-12	2) Storyline PDF				
MS. Structure and Properties of Matter MS. Chemical Reactions MS. Forces and Interactions MS. Energy MS. Waves and Electromagnetic Radiation		HS. Structure and Properties of Matter HS. Chemical Reactions HS. Forces and Interactions HS. Energy HS. Waves and Electromagnetic Radiation					
LS: Life Sciences							
Middle School (6-8) Storyline PDF		High School (9–12) Storyline PDF					
MS. Structure, Function, and Information Processi MS. Matter and Energy in Organisms and Ecosyste MS. Interdependent Relationships in Ecosystems MS. Growth, Development, and Reproduction of O MS. Natural Selection and Adaptations	ng ems rganisms	HS. Structure and Function HS. Matter and Energy in Organisms and Ecosystems HS. Interdependent Relationships in Ecosystems HS. Inheritance and Variation of Traits HS. Natural Scientific and Evolution					
ESS: Earth and Space Sciences							
Middle School (6-8) Storyline PDF		High School (9–12) Storyline PDF					
MS. Space Systems MS. History of Earth MS. Earth's Systems MS. Weather and Climate MS. Human Impacts		HS. Space Systems HS. History of Earth HS. Earth's Systems HS. Weather and Climate HS. Human Sustainability					
ETS: Engineering, Technology, and Application	s of Science						
Middle School (6-8) Storyline PDF		High School (9-12) Storyline PDF					
MS. Engineering Design		HS. Engineering Design					

Pathetic ... but despite all, progress is being made

- In 3 out of 4 high schools nationwide, computer science that includes programming is not offered
 - But that's far better than just a year or two ago!
- In 22 of the 50 states, computer science does not count towards the math or science graduation requirement
 - But that's far better than just a year or two ago!





LEADERSHIP PRESIDENT OBAMA

Obama Is Putting \$4 Billion into Computer Science Education

by Michal Addady @michal_addady

dy JANUARY 31, 2016, 11:35 AM EDT





Institutional response: higher education

- Many positive signs
 - "Schools of Computer Science" are proliferating
 - Whatever the prefix, the key thing is that Computer Science be viewed as a unit of the entire university
 - Computer science programs need to <u>act</u> this way
- However
 - Some tendency to view current situation as a transient
 - E.g., hire lecturers; usefaculty from other fields
 - Facilities are a huge problem
 - Must accommodate scale
 - Must respond to evolving nature of the field


Room for growth: Annual STEM job openings (BLS) vs. degrees granted (NSF)



BLS job projection data: http://www.bls.gov/emp/ind-occ-matrix/occupation.xlsx S&E Indicators degree data: http://www.nsf.gov/statistics/2016/nsb20161/uploads/1/12/at02-01.xlsx Is this a great time or what?





http://lazowska.cs.washington.edu/NU.pdf, pptx