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# AMATH 483/583 High Performance Scientific Computing

### Lecture 1: Introduction and Overview

Andrew Lumsdaine Northwest Institute for Advanced Computing Pacific Northwest National Laboratory University of Washington Seattle, WA

### **Overview**

- Hello Class!
- Course administration and mechanics
- HPC: Past, present, future
- Tour of course topics
- Code development
  - C++
  - Docker
  - bash

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# **Course Essentials**

- AMATH 483/583
- Tu/Th 12:00-1:20
- LOW 216
- https://lums658.github.io/amath583s19/
- Prerequisites: AMATH 301 or CSE 142
  - Some experience programming (C, C++, Python, Matlab)
- Course text (suggested): Parallel Programming: Concepts and Practice, Bertil Schmidt, Jorge Gonzalez-Dominguez, Christian Hundt, Moritz Schlarb.



	аматы	183/583				
High Performance Scientific Computing						
						University of Washington Spring 2019
	Meeting Time:	TTh 12:00pm - 1:20pm				
	Location:	LOW 216				
	Instructor:	Andrew Lumsdaine				
	Teaching Assistants	Doris Voina				
		Lowell Thompson				
	TA Office Hours:	TBD				
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# **Course Essentials**

 Course texts (suggested): Schmidt et al, Mattson et al







# **Course Materials on Github**

- PDF versions of the slides will be posted in advance of lecture
- Recordings of lecture are available online 90 minutes after lecture (via panopto / canvas – links will also be on course website)
- Subscribe to the podcast!

Hopefully well in advance



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# **Your Instructional Team**

- Andrew Lumsdaine
- Doris Voina
- Lowell Thompson

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	High Performance	Scientific Computing			
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• Contact info and office hours will be posted on Canvas and github

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# **Course Mechanics**

- 8 problem sets (60% of your grade, lowest score dropped)
- 2 take home exams (mid-term and final 20% of your grade each)
- 20% penalty per late day (with 4 grace days)
- One "challenge flag"
- Piazza for course discussions, Q/A
- See the course syllabus linked on the course web site
- When in doubt ask!



# **Computing Resources**

- Your laptop
- Linux or linux-like development environment
  - Docker (supported)
  - Mac OS X
  - Windows subsystem for Linux
- AWS
- (See course web page for more info)

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# **Academic Integrity**

- You are being evaluated in this course for how much you learn
- Not for someone else's work
- You may not claim someone else's work as your own (plagiarism)
- You may use any source you like for your work (with limits on AMATH 483/ 583 classmates)
- But you must cite your sources
- Penalty for plagiarism is zero score on entire problem set
  - Copying something if you say you copied it is not plagiarism
  - (Though you may not get full credit, you won't get the plagiarism zero)



### What's wrong with this picture?



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### What's wrong with this picture?



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# Technology

- Laptop use permitted in class (provisionally)
- PROVIDED
- The class create and maintain a course notebook via onenote (cf. course canvas page)

Extra credit for contributors

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### **More About Me**

- I reserve right to use aphorisms
- To tell "dad jokes"
- To tell "war stories"
- To learn from you



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# **Course Philosophy**

- Most of your learning will take place doing problem sets
- Learner-centered approach (learning outcomes)
  Hardware





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# What This Course is About

- How algorithms, data, software, and hardware interact to affect performance (and how to orchestrate them to get high performance)
- At the completion of this course, you will be able to
  - Write software that fully utilizes hardware performance features
  - Describe the principal architecture mechanisms for high performance and algorithmic and software techniques to take advantage of them

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- Recognize opportunities for performance improvement in extant code
- Describe a strategy for tuning HPC code
- Today and years from now

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# What this Course is not About

- Not a software engineering course (but you will learn some basics)
- Not a programming course (ditto)
- Not a hardware course (but you will learn essential models)
- Not a parallel programming course
- Not an operating systems course
- But, you *will* learn essentials in each of these areas and more importantly, how they *interact* to affect (and effect) performance
- (There are entire courses on each of these topics)



# The HPC Canon (as of 2019)

Technology	Paradigm	Hammer
CPU (single core)	Sequential	C compiler
SIMD/Vector (single core)	Data parallel	Intrinsics
Multicore	Threads	pthreads library
NUMA shared memory	Threads	pthreads library
GPU	GPU	CUDA
Clusters	Message passing	MPI

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### Then you have a supercomputer



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# Tour of the Course (HPC hardware)

- Basic CPU machine model
- Hierarchical memory (registers, cache, virtual memory)
- Instruction level parallelism
- Multicore processors
- Shared memory parallelism
- GPU
- Distributed memory parallelism



By Hteink.min - commons:File:Louvre Pyramid.jpg, CC BY-SA 3.0, https://en.wikipedia.org/w/index.php?curid=38292385

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# Tour of the Course (HPC Software)

- Elements of C++
- Elements of software organization
- Elements of software practice
- Elements of performance measurement and optimization



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### **Computing is Indispensable to Science and Engineering**

- The 3<sup>rd</sup> (and 4<sup>th</sup>?) pillar(s)
- Can carry out investigations where physical experiments would be too fast, too slow, too hot, too cold, too costly, too dangerous, etc
- Examples: Weather, climate, fusion, crash testing, etc. etc.
- HPC means more and better scientific discovery
- Better world, survival of the planet



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# **Essential Reading List: Science**

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# **Editorial Comment**



- The most exciting phrase to hear in science, the one that heralds new discoveries, is not "Eureka!" (I found it) but "That's funny"
  - Attributed to Isaac Asimov (and others)

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# **Shock Wave Processing of Advanced Reactive Materials** NiAl BN-TiB<sub>2</sub> TiN/B

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# **Uses of HPC (a sample)**

- Cosmology
- Earthquake
- Weather
- Climate modeling
- Automobile crash testing
- Aircraft design
- Jet engine design
- Stockpile stewardship
- Nuclear fusion

- Protein folding
- Modeling the brain
- Modeling bloodstream
- Epidemiology
- Rendering (CGI)
- Sigint
- Block chains
- Gene sequencing
- Etc



## **Name this Famous Person**





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### **Name This Famous Person**



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## **Supercomputers Then and Now**





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## Where Does High Performance Come From?



## **Name this Famous Person**





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# **Supercomputers Then and Now**





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# Top 500 (top500.org)

Rank	Site	System	Cores	Rmax (TFlop/s)	креак (TFlop/s)	Power (kW)
1	National Supercomputing Center in Wuxi China	<b>Sunway TaihuLight</b> - Sunway MPP, Sunway SW26010 260C 1.45GHz, Sunway NRCPC	10,649,600	93,014.6	125,435.9	15,371
2	National Super Computer Center in Guangzhou China	<b>Tianhe-2 (MilkyWay-2)</b> - TH-IVB-FEP Cluster, Intel Xeon E5-2692 12C 2.200GHz, TH Express-2, Intel Xeon Phi 31S1P NUDT	3,120,000	33,862.7	54,902.4	17,808
3	DOE/SC/Oak Ridge National Laboratory United States	<b>Titan</b> - Cray XK7 , Opteron 6274 16C 2.200GHz, Cray Gemini interconnect, NVIDIA K20x <b>Cray Inc.</b>	560,640	17,590.0	27,112.5	8,209
4	DOE/NNSA/LLNL United States	<b>Sequoia</b> - BlueGene/Q, Power BQC 16C 1.60 GHz, Custom IBM	1,572,864	17,173.2	20,132.7	7,890

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<b>Top500</b>	(top500.org)	
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5	DOE/SC/LBNL/NERSC United States	<b>Cori</b> - Cray XC40, Intel Xeon Phi 7250 68C 1.4GHz, Aries interconnect Cray Inc.	622,336	14,014.7	27,880.7 3,939
6	Joint Center for Advanced High Performance Computing Japan	<b>Oakforest-PACS</b> - PRIMERGY CX1640 M1, Intel Xeon Phi 7250 68C 1.4GHz, Intel Omni-Path Fujitsu	556,104	13,554.6	24,913.5 2,719
7	RIKEN Advanced Institute for Computational Science (AICS) Japan	K computer, SPARC64 VIIIfx 2.0GHz, Tofu interconnect Fujitsu	705,024	10,510.0	11,280.4 12,660
8	Swiss National Supercomputing Centre (CSCS) Switzerland	<b>Piz Daint</b> - Cray XC50, Xeon E5-2690v3 12C 2.6GHz, Aries interconnect , NVIDIA Tesla P100 Cray Inc.	206,720	9,779.0	15,988.0 1,312

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# **Shock Wave Processing of Advanced Reactive Materials** NiAl BN-TiB<sub>2</sub> TiN/B

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**Multiphysics Solver**  

$$\begin{aligned}
\varphi = \psi_{e}(F_{e},T) + \psi_{p}(\chi,T) + \psi_{T}(T) \\
-\rho_{0}T\left(\frac{\partial \dot{\psi}_{T}}{\partial T}\right) + \text{Div}Q = Q_{p} + Q_{e} + Q_{e} + \rho_{0}T \\
-\rho_{0}T\left(\frac{\partial \dot{\psi}_{T}}{\partial T}\right) + \text{Div}Q = Q_{p} + Q_{e} + Q_{e} + \rho_{0}T \\
Q_{p} = \begin{bmatrix} T_{r}P\left[F_{T}^{T} - T\left(\frac{\partial F_{T}}{\partial T}\right)^{T}\right] : \dot{F}_{p} - \frac{\partial \psi_{p}}{\partial \chi} \cdot \dot{\chi} - \\
-T\left[P\left(F_{T}^{T} : \dot{F}_{p}\right) - J_{p}J_{T}\frac{\partial W_{e}}{\partial F_{e}}F_{p}^{-T}F_{p}^{-T}T\right] : F_{e}F_{p}\frac{\partial F_{T}}{\partial T} + T\rho_{0}\left(\frac{\partial \dot{\psi}_{p}}{\partial T}\right) \\
Q_{e} = -T\left[P\left(\frac{\partial F_{T}}{\partial T}\right)^{T}F_{p}^{T} : \dot{F}_{e} + \left(J_{p}J_{T}\frac{\partial^{2}W_{e}}{\partial F_{e}\partial F_{e}} : \dot{F}_{e}F_{p}^{-T}F_{T}^{-T}\right] : F_{e}F_{p}\frac{\partial F_{T}}{\partial T}\right] + T\rho_{0}\left(\frac{\partial \dot{\psi}_{e}}{\partial T}\right) \\
Q_{e} = -T\left[P\left(\frac{\partial F_{T}}{\partial T}\right)^{T}F_{p}^{-T} : \dot{F}_{e}F_{p}\frac{\partial^{2}W_{e}}{\partial F_{e}\partial T}F_{p}^{-T}T_{T}^{-T}\right] : F_{e}F_{p}\frac{\partial F_{T}}{\partial T}\right] + T\rho_{0}\left(\frac{\partial \dot{\psi}_{e}}{\partial T}\right) \\
Q_{e} = -T\left\{\left[P\left(F_{T}^{-T} : \frac{\partial F_{T}}{\partial T}\right) - P\left(\frac{\partial F_{T}}{\partial T}\right)^{T}F_{T}^{-T} + J_{p}J_{T}\frac{\partial^{2}W_{e}}{\partial F_{e}\partial T}F_{p}^{-T}T_{T}^{-T}\right] : F_{e}F_{p}\frac{\partial F_{T}}{\partial T}\right] + T\rho_{0}\left(\frac{\partial \dot{\psi}_{e}}{\partial T}\right) \\
P\left|_{\alpha_{0}} = \rho_{0}\frac{\partial \psi_{e}}{\partial F_{e}}F_{p}^{-T}F_{T}^{-T} = J_{p}J_{T}\frac{\partial W_{e}}{\partial F_{e}}F_{p}^{-T}F_{T}^{-T} \\
Q_{e} = -F^{-1}\kappa F^{-1}\nabla_{0}T
\end{aligned}$$
Approximately the second seco

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Physics: Systems	of PDEs		
Elliptic	Parabolic	Hyperbolic	
$egin{array}{rcl}  abla \cdot oldsymbol{P} &=& oldsymbol{f}_0 &  ext{in} & \Omega_0 \ [\![oldsymbol{P} \cdot oldsymbol{N}_0]\!] &=& [\![oldsymbol{t}_c]\!] &  ext{on} & S_0 \ oldsymbol{P} \cdot oldsymbol{N}_0 &=& oldsymbol{t}_0 &  ext{on} & \partial\Omega_{t_0} \ oldsymbol{u} &=& oldsymbol{u}_p &  ext{on} & \partial\Omega_{u_0} \end{array}$	$\rho_0 c \dot{T} - \nabla_X \boldsymbol{Q} = \boldsymbol{Q}_f \text{ on } \Omega_0$ $\llbracket \boldsymbol{Q} \cdot \boldsymbol{N}_0 \rrbracket = 0 \text{ on } S_0$ $\boldsymbol{Q} = \boldsymbol{Q}_p \text{ on } \partial \Omega_{Q_0}$ $T = T_p \text{ on } \partial \Omega_{T_0}$	$\rho_0 \frac{\partial^2 \boldsymbol{u}}{\partial \boldsymbol{u}^2} - \nabla \cdot \boldsymbol{P} = \boldsymbol{f}_0 \text{ in } \Omega_0$ $\llbracket \boldsymbol{P} \cdot \boldsymbol{N}_0 \rrbracket = \llbracket \boldsymbol{t}_c \rrbracket \text{ on } S_0$ $\boldsymbol{P} \cdot \boldsymbol{N}_0 = \boldsymbol{t}_0 \text{ on } \partial \Omega_{t_0}$ $\boldsymbol{u} = \boldsymbol{u}_p \text{ on } \partial \Omega_{u_0}$ $\boldsymbol{u}(0) = \boldsymbol{u}_0 \text{ in } \Omega_0$ $\dot{\boldsymbol{u}}(0) = \boldsymbol{v}_0 \text{ in } \Omega_0$	
<ul> <li>constitutive law hyperelastic multiscale</li> </ul>	<ul> <li>constitutive law Fourier's law</li> </ul>	<ul> <li>constitutive law hyperelastic multiscale</li> </ul>	
<ul> <li>state variables damage visco-elastic</li> </ul>	<ul> <li>state variables porosity chemical reactions</li> </ul>	<ul> <li>state variables damage visco-elastic</li> </ul>	
$\rho_0 = J\rho$	<ul> <li>mass conservation</li> <li>based on physics</li> </ul>	$\rho_0 = J\rho$	
<ul> <li>solution strategy sparse iterative solver dual domain dec.</li> </ul>	•solution stratedy sparse iter. solver α-method integrator	<ul> <li>solution strategy sparse iterative solver dual domain dec. MD-AVI</li> </ul>	Courtesy Karel Matous, U. Notre Dame
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# **Problem Solving**

- Software development is difficult
- How do humans attack complex problems?
- Apply the same principles to software
- Modular / reusable
- Well defined interfaces and functionality
- Understandable



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## First basic truth of code



- Code is a communication medium with other developers
- And with a future version of yourself



• You can easily write code that no one (including you) can understand



# Two simple rules for writing software





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### "SO HOW DID YOUR TALK AT STANFORD GO?"





## **Developing your code**



- That includes • (especially) mental labor
- Use productivity tools •
- VS code (rec'd), Atom, Eclipse



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- Muscle memory for typing is not the same as productivity (know the difference)
  - Stretch yourself
- Use any environment where you are most productive
- We can only support one (VS code + clang + Linux)
- Assignments must work with autograder



# **HPC Legacy**

- Command-line and text based (tty)
- Fortran (or "C-tran")



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# Compiling

- To compile one source file to an executable
  - \$ c++ filename.cpp
  - (What is the name of the executable?)
- To compile multiple source files to an executable
  - \$ c++ one.cpp two.cpp three.cpp
- To create an object file
  - \$ c++ -c one.cpp –o one.o
- To create an executable from multiple object files
  - \$ c++ one.o two.o three.o –o myexecutable

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## Slice of C++

- C++11 (C++14, C++17, C++20) are quite modern languages
- But C++11 (et al) and libraries are *huge*
- We will use a focused slice of C++11
- Use some modern features
- Avoid legacy features (such as pointers)
- Avoid modern features (OO)

```
#include <cmath>
#include <iostream>
int main() {
    double a = 3.14;
    double b = std::sqrt(a);
    std::cout << b << std::endl;
    return 0;
}
```

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## The amath583/base Environment

- We will run a pseudo-linux (a bash shell) in a Docker container
- Provides a uniform environment for everyone to use (compiler etc)
- We can much more effectively support one environment
- Documentation in problem set and on line



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## shells

- sh: "Bourne shell" (Stephen Bourne, Bell Labs c.1977)
- ksh: Korn shell (David Korn, Bell Labs, c. 1983)
- csh: C shell (Bill Joy, UC Berkeley, 70s)
   and cousin tcsh which is what I use
- bash (Brian Fox, 1989)-
  - who knows what this stands for (without searching)
- All are Linux (Unix) processes with read-eval-print loops
- But also complete systems scripting language for dealing with Unix
   Unix philosophy: data in text format, small programs using text I/O



Bourne again shell
## SC'19 Student Cluster Competition Call-Out!

- Teams work with advisor and vendor to design and build a cutting-edge, commercially available cluster constrained by the 3000-watt power limit
- Cluster run a variety of HPC workflows, ranging from being limited by CPU performance to being memory bandwidth limited to I/O intensive
- Teams are comprised of six undergrad or high-school students plus advisor

https://sc19.supercomputing.org /program/studentssc/studentcluster-competition/

> Informational meeting: Tu 5PM-6PM Allen 203 Th 5PM-6PM Allen 203

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Cuda and Thrust programming examples © Nvidia

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