# Compiler, Heterogeneous Parallel Computing and Mathematical Optimization

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#### Background

- Foucus on machine learning Data Exploration ==> Model ==> Loss Function /  $||\ ||\ ||$  Iterative  $||\ ||\ /$  Accuracy <== code <== Optimization Algorithm
- three mountatians ==> one mountatian
- MLer() = compute\_ability(HPC) + algorithm(OPT) + model(DL, PGM, ML, Boosting, Ensemble etc)
- iterative, coordinate ascent and active learning:
  - iterative: again, again, again, . . . .
  - coordinate ascent: a simple heuristic algorithm, optimize one while fixed the others.
  - active learning: learn what you like, learn what you are capable of, and valuable of...
- minimize: the height of three mountations subject to: sum(time\_i) = 10000hours keep other states relatively stable and persistant



## Compiler

- Why Compiler?
  - deeper understanding about programming languages
  - part of it related to convex optimization and DL softwares: theano, MShadow
  - coding better
- LLVM
- kaleidoscope
- Julia
- Cxx.jl

#### LLVM, http://llvm.org



- What: formerly "Low Level Virtual Machine," today general purpose compiler infrastructure
- Who: many contributors from Apple, Google, Intel, Mozilla, Julia, etc.
  Used by Clang, Rust, Swift, Emscripten, WebKit (Safari)
- When: originally Chris Lattner's Masters and Ph.D theses, circa 2003
- License: University of Illinois / NCSA (permissive, BSD-style)
- Written in: C++
- Use in Julia: just in time compiler



# Classical compiler design -1

From "The Architecture of Open Source Applications," http://www.aosabook.org/en/llvm.html

Basic 3 phase compiler

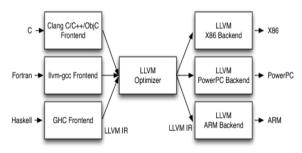


• One input language, one target architecture



## Classical compiler design -2

Modular compiler design



- Reuse core components across multiple languages and architectures
- LLVM intermediate representation (IR)
  - ▶ Sort of like "cross-platform assembly"
  - ► Try out @code\_llvm in Julia



#### introduction to Julia internal

# Heterogeneous Parallel Computing

- julia: multi-thread, multi-task MC demo
- CUDA C: Monto Caro demo
- ClusterManagement.jl

## Mathematical Optimization

- SVM
- L1 regulation

#### an machine learning example

• First kaggle TOP10%