




1 ARC4CFD: Learning how to leverage High-Performance 2 Computing with Computational Fluid Dynamics

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Software

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7 Summary

8 Computational Fluid Dynamics (CFD) is a field of computational physics that has a very
9 high utilization of modern Advanced Research Computing (ARC) resources ([Cant, 2002](#)).
10 The spatial and temporal resolution required to solve modern CFD problems means that
11 it is well suited to take advantage of the full benefits of large-scale distributed memory
12 parallelization that is available on high-performance computing (HPC) systems on ARC
13 infrastructure. The field of CFD has a broad and diverse user base that transcends many of
14 the classical boundaries in science and engineering. As CFD tools have progressed over the
15 past decades, their robustness, predictive capabilities, and user-friendliness have drastically
16 improved, which means that these tools are increasingly being adopted by nontraditional
17 HPC users such as new graduate students, experimentalists, theoreticians, and student
18 design teams. Advanced Research Computing for Computational Fluid Dynamics, or
19 ARC4CFD, is an open source, asynchronous online course (<https://arc4cfid.github.io>) that
20 is developed to help learners with a basic understanding of fluid dynamics and CFD bridge
21 the knowledge gap toward the effective usage of CFD on modern ARC resources.

22 Statement of need

23 Although most science and engineering programs offer CFD courses, which have become
24 standard part of the curriculum in mechanical, civil, chemical, and aerospace engineering,
25 these courses generally focus on the fundamental understanding of the physics, modelling,
26 and numerics as well as the practical usage of CFD tools. At the end of a typical
27 undergraduate CFD course, the student has learned to use a CFD tool to solve small-scale
28 problems, understand the modelling assumptions, quantify numerical errors, and visualize
29 the results. The CFD problems used in the tutorials of these courses are designed to
30 run on students' personal or local workstations. The jump from small-scale CFD usage
31 on a local workstation to the effective utilization of this same CFD tool, on a much
32 larger problem size, on modern HPC systems is nontrivial and requires additional specific
33 training. Although generic HPC and parallel computing training is widely available,
34 targeted training material for CFD users on HPC systems is not readily found. Thus, these
35 learners must either: a) “translate” the knowledge from generic HPC training material
36 to the field of CFD, or b) rely on mentorship and external help to effectively utilize
37 these computational resources. As these CFD tools are continually improving, they are
38 increasingly being adopted to complement experimental campaigns, inform the design of
39 experiments, or help solve theoretical fluid dynamics problems. This underserved user base
40 is seeking focused training materials for the effective utilization of CFD on HPC systems,
41 as they do not have the same mentorship opportunities or access to expertise as graduate
42 students. ARC4CFD was developed to provide a CFD-specific training material for the

43 effective use of HPC systems in advanced research computing architectures. The course is
44 built in an asynchronous format for a broader adoption, and many hands-on problems
45 are integrated to help the learner further their understanding and learn independently.
46 We value the ability to freely share and exchange with the community, and thus the
47 focus is placed on an entirely open-source toolset, from meshing, solving, and visualizing
48 the results. Although this course is intended for use on remote HPC systems, and more
49 specifically on the Digital Research Alliance of Canada clusters, a user can easily follow
50 on a local multiprocessor computer, or any other HPC system.

51 ARC4CFD is intended to be an introductory course that combines concepts from CFD
52 and computing with an *end-user focus*. The course is built with the assumption that
53 students have: a) a undergraduate-level knowledge in fluid dynamics, b) introductory
54 knowledge in Computational Fluid Dynamics, and c) familiarity with navigating terminal
55 and bash commands on remote systems. The target audience is: - New graduate students in
56 computational physics or engineering. - Experimentalists and theoreticians complementing
57 their work with numerical simulations on HPC. - Undergraduate students on student
58 design teams interested in leveraging CFD with HPC.

59 Given the prerequisite knowledge and target audience, the end-user focus means that the
60 course needs to provide both the theoretical understanding of parallel computing and the
61 systematic, hands-on approach to set up an effective workflow for CFD on HPC. The
62 classes are developed to first provide a conceptual understanding and then apply that
63 understanding to specific CFD problems; a summative example is woven into the course
64 which follows the learner through the main CFD workflow.

65 Course structure and learning outcomes

66 The course is expected to take about 16 hours to complete and is divided into three
67 sections. Each section consists of several classes with individually-defined learning outcomes.
68 The sections are structured in a way that the learner can first develop a foundational
69 understanding of high-performance computing ([Section 1](#)), translate those concepts to
70 specific challenges in CFD and establish a systematic workflow ([Section 2](#)), and then
71 effectively manage the resulting research data ([Section 3](#)). The course guides the learner
72 through all the necessary steps towards the effective usage of CFD on HPC, by providing
73 a theoretical understanding of the concepts, which is supplemented with many practical
74 examples and interactive quizzes. Section 2, the core section of the course, provides most
75 of the CFD-specific knowledge for usage in HPC; for that reason, the classes in this section
76 were devised to directly map onto a CFD workflow on HPC system. Therefore, each step
77 in the CFD workflow is an individual class, so that we have:

- 78 • 2.1 Definition of the CFD workflow.
- 79 • 2.2 Plan the large-scale CFD simulation.
- 80 • 2.3 Estimate the HPC requirements.
- 81 • 2.4 Preprocess the CFD simulation.
- 82 • 2.5 Optimize the CFD for HPC.
- 83 • 2.6 Running the CFD on HPC.
- 84 • 2.7 A posteriori analysis.

85 The structure of Section 2 provides the learner with a comprehensive overview of a standard
86 workflow for a CFD problem on HPC systems. A summative example, which is based on
87 the simulation of a backward facing step, is integrated into the classes of Section 2 and
88 follows the main steps of the CFD workflow.

89 There are five learning outcomes for ARC4CFD. At the end of the course, the learner
90 should be able to:

- 91 1. Define the main concepts of parallel and high-performance computing.

- 92 2. Conduct an a priori estimate of the computational cost of a CFD simulation.
- 93 3. Explain the modelling impact of the assumptions on HPC cost.
- 94 4. Optimize the simulation parameters of a CFD problem for HPC.
- 95 5. Develop a research data management strategy for a CFD workflow.

96 The learning outcomes for each class are presented and reinforced with questions at the
97 end of each lecture.

98 **Philosophy of learning**

99 ARC4CFD is an asynchronous online course that accompanies the learner in develop-
100 ing skills to effectively utilize Advanced Research Computing for Computational Fluid
101 Dynamics. The course is built using an *integrative learning* approach in which concepts
102 from a wide range of scientific disciplines are brought together (e.g., parallel computing,
103 programming, numerics, fluid dynamics, CFD) and directly put into practice through
104 hands-on examples and quizzes. This course is built around the usage of an entirely
105 open-source meshing, solving, and visualization toolset. This is a key feature of the course
106 that we hope will encourage a broad adoption of the training material. For this reason,
107 the course is licensed under the Creative Commons BY-NC-SA license, and all the original
108 files (e.g., svg files or Python scripts) are included in the repository. The main open-source
109 toolkits used include: Gmsh (meshing), SU2 (CFD solver), OpenFoam (CFD solver),
110 Paraview (visualization), and Python (postprocessing and analysis).

111 The course is developed to: 1) emphasize the development of a systematic approach for
112 the effective utilization of CFD usage on ARC systems, 2) provide a high-level theoretical
113 understanding of the main concepts for using CFD on HPC, and 3) provide hands-on
114 examples for the learners to put these concepts into practice. The multimodal course
115 content includes written content, videos, interactive quizzes, and hands-on examples that
116 cover various aspects of ARC.

117 **Course features**

118 The asynchronous courses are built within a GitHub Pages website [ARC4CFD](#) using
119 the static site generator [Astro](#) and the [Astro Starlight](#) theme. This Astro template
120 enables highly interactive engagement through the use of self-correcting quizzes, direct
121 copy-pasting of code snippets, and visually appealing course navigation. The main website
122 is supplemented with a more traditional [Git repository](#) which contains all the examples
123 used in the course. Many of the courses feature a short introductory video to guide the
124 learners through the context of each class.

125 A unique aspect of the training material is found in Section 3 on Research Data Management
126 (RDM). As RDM approaches are continually being integrated into scientific disciplines, we
127 opted to provide some CFD-specific perspective to the RDM discussion. The content will
128 undoubtedly evolve with these concepts, but we hope that this training material will be of
129 assistance to CFD users that are increasingly being asked to develop Data Management
130 Plans (DMPs) as part of grant proposals.

131 **Story of the project**

132 This course was conceived primarily from the need to train new graduate students in the
133 Multi-Physics Interaction Lab at the University of Waterloo to bridge the gap between
134 their undergraduate CFD education and the effective utilization of these CFD tools on
135 high-performance computing. The typical undergraduate CFD coursework focuses on
136 the numerical modelling, and usage of CFD tools, whereas the majority of HPC training

137 material tends to emphasize the computer science aspects of HPC. The effective utilization
138 of modern Advanced Research Computing facilities requires the integration of knowledge
139 from both CFD and HPC. It was from the need to centralize the information on the usage
140 of CFD in ARC that the idea for this course was born. Previously, this information was
141 transmitted, piecemeal, to students as needed during their graduate training. This led to
142 inhomogeneous training, which often left unresolved knowledge gaps for these otherwise
143 highly qualified graduate students.

144 A timely opportunity arose during a sabbatical through a call for proposals from Compute
145 Ontario for the development of training material for underserved HPC users. This
146 opportunity provided the means to build a team to centralize the necessary information
147 and build this course. The team built the course by focusing on three user groups: 1) new
148 graduate students that plan to use HPC resources to run CFD simulations, 2) theoreticians
149 and experimentalists that want to use CFD on HPC to supplement their work, and 3)
150 undergraduate design team members who want to develop skills in HPC. Inspired by the
151 “12-steps to the Navier-Stokes” course (Barba & Forsyth, 2019), which is a staple of our
152 graduate student training, we tried to recreate a very systematic approach towards the
153 usage of CFD on HPC systems. The initial idea of building everything within a Jupyter
154 notebook eventually shifted to an interactive webpage with video content due to the
155 challenges of directly using HPC systems through a pythonic interface.

156 Looking ahead, this course will continue to evolve over the coming year and will serve as
157 the basis for a synchronous course that will be given as part of Compute Ontario’s summer
158 school. As learners benefit from the course and we continually adjust the course based on
159 user comments, we will be able to improve the content to meet the changing needs of new
160 graduate students in CFD, experimentalists and theoreticians, and undergraduates that
161 are interested to learn CFD on HPC.

162 Acknowledgments

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165 References

- 166 Barba, L., & Forsyth, G. (2019). CFD python: The 12 steps to navier-stokes equations.
167 *Journal of Open Source Education*, 2(16), 21. <https://doi.org/10.21105/jose.00021>
- 168 Cant, S. (2002). High-performance computing in computational fluid dynamics: Progress
169 and challenges. *Philosophical Transactions of the Royal Society of London. Series A:*
170 *Mathematical, Physical and Engineering Sciences*, 360(1795), 1211–1225.