# 2018 Pacific Northwest Numerical Analysis Seminar

October 13, 2018 University of British Columbia, Vancouver

# **Program & Abstracts**





Pacific Institute for the Mathematical Sciences

# **Getting Started**



**Get connected:** The "eduroam" network is available at UBC. Another option is the "ubcvisitor" network. Open up a web browser, and you will be directed to the login page.

### FAQs

**Q: Where are the talks?** All talks will be in room 2012.

**Q: Where can I go for help on site?** If you need assistance or have a question during the meeting, please feel free to talk to Uri Ascher, Chen Greif, or Jessica Bosch.

**Q: Where can I get refreshments and meals?** For snacks or quick meals, visit <u>http://www.food.ubc.ca/feed-me/</u> or our website <u>https://www.cs.ubc.ca/~greif/PNWNAS2018/map.html</u>. Two coffee breaks are provided.

**Q:** Where can I get a cab to pick me up from the Venue? You can call Yellow Cab (604-681-1111) and request to be picked up at the back of the building at the intersection of West Mall and Biological Sciences Road.

#### Q: How can I get around?

- UBC Map link: <u>maps.ubc.ca/</u>
- **Public Transit:** Feel free to search and plan your public transport rides by visiting <u>http://www.translink.ca/</u>, where directions, ticket costs and bus schedules are indicated.
- Parking at UBC: <u>https://parking.ubc.ca/</u>

**Q:** Which bus brings me to the dinner place "Banana Leaf"? Bus #14 departs about every 10-15 minutes from UBC's Bus Loop, Bay 11. Exit the bus at Balaclava St. (Broadway at Balaclava St.). Banana Leaf is on the other side of the road.

#### Q: What emergency numbers should I know?

- Campus Security (604-822-2222)
- General Emergencies (911)
- UBC Hospital (604-822-7121)

There will be photography throughout this event for promotional purposes for use by UBC. If, for any reason, you wish not to have your photo taken or used in this manner, please contact Uri Ascher, Chen Greif, or Jessica Bosch.

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# Program

| 08:45 - 09:30 | Registration (ESB Atrium)   |
|---------------|---|
| 09:30 - 09:45 | Welcome: Chen Greif and Uri Ascher ( <i>ESB 2012</i> )  |
| 09:45 - 10:30 | <b>Plenary: Ron Estrin</b> ( <i>ESB 2012</i> )<br>The Merits of Keeping It Smooth: Implementing a Smooth Exact Penalty Function for Nonlinear Optimi-<br>zation |
| 10:30 - 11:00 | Coffee Break (ESB Atrium)   |
| 11:00 - 11:45 | <b>Plenary: Jay Gopalakrishnan</b> ( <i>ESB 2012)</i><br>Explicit Methods for Hyperbolic Systems on Unstructured Tent Meshes                                    |
| 11:45 - 12:30 | <b>Plenary: Steve Ruuth</b> ( <i>ESB 2012)</i><br>Linearly Stabilized Schemes for the Time Integration of Stiff Nonlinear PDEs                                  |
| 12:30 - 12:40 | Group Photo ( <i>ESB Atrium</i> )   |
| 12:40 - 14:00 | Lunch Break (on your own)   |
| 14:00 - 14:45 | <b>Plenary: Danny Kaufman</b> ( <i>ESB 2012)</i><br>Physics in the Rough: Geometric Algorithms for Coarsened Simulation   |
| 14:45 - 15:30 | <b>Plenary: Andy Wan</b> ( <i>ESB 2012)</i><br>Conservative Methods for Dynamical Systems   |
| 15:30 - 16:00 | Coffee Break (ESB Atrium)   |
| 16:00 - 16:45 | <b>Plenary: Sherry Li</b> ( <i>ESB 2012)</i><br>Clustering Techniques and Hierarchical Matrix Formats for Kernel Ridge Regression                               |
| 16:45 - 17:30 | <b>Plenary: Eldad Haber</b> ( <i>ESB 2012)</i><br>Computational Aspects of Deep Neural Networks   |
| 18:30 - 20:30 | <b>Group Dinner</b> ( <i>Banana Leaf; registration required</i> )<br>3005 W. Broadway, Vancouver, BC V6K 2G9  |

### Abstracts

#### 09:45 - 10:30

The Merits of Keeping It Smooth: Implementing a Smooth Exact Penalty Function for Nonlinear Optimization *Ron Estrin,* Institute for Computational and Mathematical Engineering, Stanford University

*Michael Friedlander,* Department of Computer Science, Department of Mathematics, University of British Columbia *Dominique Orban*, GERAD, Department of Mathematics and Industrial Engineering, Polytechnique Montréal *Michael Saunders,* Systems Optimization Laboratory, Department of Management Science and Engineering, Stanford University

We consider constrained nonlinear programs of the form

$$\underset{x \in \mathbb{R}^n}{\text{minimize}} \quad f(x) \quad \text{subject to} \quad c(x) = 0, \tag{NP}$$

where f and c are second-order smooth functions. Such models are ubiquitous in the computational sciences, used in applications such as optimal control, seismic imaging, and systems biology. We discuss a penalty function approach originally proposed by [1], where instead of minimizing (*NP*), we instead minimize the smooth, unconstrained penalty function:

$$\begin{array}{ll} \underset{x \in \mathbb{R}^n}{\text{minimize}} & \varphi_{\sigma}(x) \coloneqq f(x) - y_{\sigma}(x)^T c(x) \\ & y_{\sigma}(x) \coloneqq \arg\min_{y} \frac{1}{2} \|\nabla f(x) - \nabla c(x)^T y\|_2^2 + \sigma c(x)^T y. \end{array}$$

This penalty function is *exact* in the sense that minimizers of (*NP*) are minimizers of  $\phi_{\sigma}$  for a sufficiently large (but finite) penalty parameter.

Fletcher originally envisioned that this penalty function would be applied to small, dense problems. We challenge this notion by demonstrating how to compute the quantities necessary for most off-the-shelf optimization solvers with computational cost comparable to widely accepted methods for nonlinear optimization, such as sequential quadratic programming. In particular, we also demonstrate how to combine the penalty function with matrix-free optimization solvers, in order to target large-scale problems, particularly in the case of PDE-constrained optimization.

We discuss further extensions of the penalty function, including regularization for stability, problems with inequality constraints, and the use of inexact evaluations. We also provide some preliminary numerical results on some standard optimization test problems and PDE-constrained problems.

#### References

[1] R. Fletcher, A class of methods for nonlinear programming with termination and convergence properties, In J. Abadie, editor.
Integer and nonlinear programming, pp. 157–175. North-Holland, Amsterdam, 1970.

#### 11:00 - 11:45

#### Explicit Methods for Hyperbolic Systems on Unstructured Tent Meshes

#### Jay Gopalakrishnan, Portland State University

Tent-shaped spacetime regions appear to be natural for solving hyperbolic systems because one can ensure causality by constraining the height of the tent pole. Specifically, the domain of dependence of all points within a tent can be guaranteed to be contained within the tent by constraining the tent pole height. Moreover, a spacetime simulation region can be covered by advancing fronts of such tents. In this talk, we review known techniques to advance the numerical solution of a hyperbolic problem by progressively meshing a spacetime domain by tent shaped objects. Then we introduce new schemes, called Mapped Tent Pitching (MTP) schemes, which proceed by transforming tents into domains where space and time are separated, allowing standard methods to be used within tents. This technique also allows, for the first time, the use of fully explicit schemes within tents. After highlighting certain difficulties that arise with naive use of standard explicit Runge-Kutta time stepping algorithms in this context, the talk will conclude with themes from ongoing research into new explicit MTP schemes.

#### References

 J. Gopalakrishnan, J. Schöberl, and C. Wintersteiger, *Mapped tent pitching schemes for hyperbolic systems*, SIAM J. Sci. Comput., 39(6), pp. B1043–B1063, 2017.

#### 11:45 - 12:30

#### Linearly Stabilized Schemes for the Time Integration of Stiff Nonlinear PDEs

#### Steve Ruuth, Department of Mathematics, Simon Fraser University

In many applications, the governing PDE to be solved numerically contains a stiff component. When this component is linear, the use of an implicit time stepping method that is unencumbered by stability restrictions is preferred. On the other hand, if the stiff component is nonlinear, the complexity and cost per step of using an implicit method is heightened, and the use of explicit methods may be preferred. In this talk, we consider new and existing linearly stabilized schemes for the purpose of integrating stiff nonlinear PDEs in time. These schemes compute the nonlinear term explicitly and, at the cost of solving a linear system with a matrix that is fixed throughout, are unconditionally stable, thus combining the advantages of explicit and implicit methods. Applications are presented to illustrate the use of these methods.

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This is joint work with Kevin Chow (Simon Fraser University).

#### 14:00 - 14:45

#### Physics in the Rough: Geometric Algorithms for Coarsened Simulation

#### Danny Kaufman, Adobe Research, Seattle

Physical simulation is the job of constructing and implementing discrete structures to mimic behaviors in the world around us. From toy mass-spring systems to high-fidelity representations of reality, physical simulation plays a key role in how we exaggerate, interpret, mediate and predict events. Yet fundamental features of complex dynamic systems, including strong nonlinearities, frictional contact, impact and nonconvexity, pose significant challenges to computation at the high-speed rates required by modern research, entertainment, and industrial applications. To make these applications tractable we necessarily turn to highly coarse representations and often even low-precision solves. And while classical analysis can sometimes provide guarantees for our simulations at high resolutions with accurate solves, all bets are off when we violate these base assumptions. Nevertheless, physical systems must be modeled and, in turn, these models will necessarily be roughly discretized and simulated. It is thus critical to consider how the resulting behaviors of these rough simulations can best be understood, solved and validated. In turn this leads us to ask how can we compute predictive and compelling coarse simulations. Or put simply: what can we squeeze out of simulation "on the cheap"?

In this talk I will present some of our recent investigations towards answering these questions. First, I will discuss our work on designing a coarsening algorithm for the efficient yet predictive simulation of impacting elastica at practical-size time steps and spatial resolutions. Second, I will present a new optimization method for minimizing distortion under extreme deformations at efficient rates. Throughout I will focus on the role geometry plays in these domains and cover a range of applications that our methods enable ranging from the design optimization of 3D-printed jumping mechanisms, to the predictive simulation of emergent patterns in oscillated granular beds, and on to the live-broadcast animation of performed cartoons.

#### 14:45 - 15:30

#### **Conservative Methods for Dynamical Systems**

#### Andy Wan, Department of Mathematics and Statistics, University of Northern British Columbia

Many interesting dynamical systems possess geometric invariants or conserved quantities that are important for understanding their long term behaviours. Conservative methods are numerical methods which preserve these invariants on their numerical solutions. Unfortunately, classical methods, such as linear multistep methods and Runge-Kutta methods, are not conservative for general types of invariants [1]. While projection methods are in general conservative, they can lead to instability over long-term integration if their numerical solutions are projected on to a different connected component. Discrete gradient method [2] is another class of conservative methods, which expresses the differential equations in a skew-gradient tensor form. However, for large dynamical systems with multiple invariants, sparse representations of such tensor form are not known at this time.

In this talk, we introduce a new class of conservative methods, called the multiplier method [3], which can be applied to general dynamical systems with arbitrary forms of invariants, without the need for projection or finding sparse tensor representations. We illustrate this method on a variety of examples, such as non-Hamiltonian systems and large dynamical systems. Also, we will discuss an important connection between conservative methods and long-term stability. Specifically, under appropriate conditions, for conservative methods with a uniformly bounded displacement property, their global error is bounded for all time [4]. This is joint work with Alexander Bihlo (Memorial University of Newfoundland) and Jean-Christophe Nave (McGill University).

#### References

- [1] E. Hairer, C. Lubich, and G. Wanner, *Geometric numerical integration: structure-preserving algorithms for ordinary differential equations,* Springer, Berlin, 2006.
- [2] G. R. W. Quispel, R. I. McLachlan and N. Robidoux, *Geometric integration using discrete gradients*, Phil. Trans. R. Soc. Lond., 357, pp. 1021–1045, 1999.
- [3] A. T. S. Wan, A. Bihlo and J.-C. Nave, *Conservative methods for dynamical systems*, SIAM J. Numer. Anal., 55(5), pp. 2255–2285, 2017.
- [4] A. T. S. Wan and J.-C. Nave, On the arbitrarily long-term stability of conservative methods, To appear in SIAM J. Numer. Anal., 25 pages, 2018.

#### 16:00 - 16:45

#### Clustering Techniques and Hierarchical Matrix Formats for Kernel Ridge Regression

Sherry Li, Lawrence Berkeley National Lab

We present memory-efficient and scalable algorithms for kernel methods used in machine learning. Using hierarchical matrix approximations for the kernel matrix the memory requirements, the number of floating point operations, and the execution time are drastically reduced compared to standard dense linear algebra routines. We consider both the general H-matrix hierarchical format as well as Hierarchically Semi-Separable (HSS) matrices. Furthermore, we investigate the impact of several preprocessing and clustering techniques on the hierarchical matrix compression. Effective clustering of the input leads to a ten-fold increase in efficiency of the compression. The algorithms are implemented using the STRUMPACK solver library. These results confirm that classification using kernel ridge regression with the compressed matrix does not lose prediction accuracy compared to the exact kernel matrix and that our approach can be extended to O(1M) datasets, for which computation with the full kernel matrix becomes prohibitively expensive. We present numerical experiments in a distributed memory environment up to 1,024 processors of the NERSC's Cori supercomputer using well-known datasets to the machine learning community that range from dimension 8 up to 784.

#### 16:45 - 17:30

#### **Computational Aspects of Deep Neural Networks**

#### Eldad Haber, Department of Earth and Ocean Science, University of British Columbia

Partial differential equations (PDEs) are indispensable for modeling many physical phenomena and also commonly used for solving image processing tasks. In the latter area, PDE-based approaches interpret image data as discretizations of multivariate functions and the output of image processing algorithms as solutions to certain PDEs. Posing image processing problems in the infinite dimensional setting provides powerful tools for their analysis and solution. Over the last three decades, the reinterpretation of classical image processing tasks through the PDE lens has been creating multiple celebrated approaches that benefit a vast area of tasks including image segmentation, denoising, registration, and reconstruction. In this work, we establish a new PDE-interpretation of deep convolution neural networks (CNN) that are commonly used for learning tasks involving speech, image, and video data. Our interpretation includes convolution residual neural networks (ResNet), which are among the most promising approaches for tasks such as image classification having improved the state-of-the-art performance in prestigious benchmark challenges. Despite their recent successes, deep ResNets still face some critical challenges associated with their design, immense computational costs and memory requirements, and lack of understanding of their reasoning.

Guided by well-established PDE theory, we derive three new ResNet architectures that fall two new classes: parabolic and hyperbolic CNNs. We demonstrate how PDE theory can provide new insights and algorithms for deep learning and demonstrate the competitiveness of three new CNN architectures using numerical experiments.



## **Map Directory**

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| Site or Building Name & Address  | Grid                |
|--|---------------------|
| Abdul Ladha Science Student Ctr, 2055 East Mall<br>Acadia/Fairview Commonsblock & Front Desk, 2707 Tennis Cres.                  | D4<br>G7            |
| Acadia House, 2700-2720 Acadia Rd  | G7<br>F/H_6/7       |
| Acadia Park Residence (Student Pariniy Housing)  | G7                  |
| Allard Hall [Faculty of Law], 1822 East Mall   | B4                  |
| Aumni Centre (Robert H. Lee), 6163 University Biva<br>AMS Student Nest (new student union building), 6133 University             | D4<br>BlvdD4        |
| Anthropology & Sociology (ANSOC) Bldg, 6303 NW Marine Dr   | A3                  |
| Aquatic Centre (New - opening Jan. 2017), 6080 Student Union E<br>Aquatic Centre (Old). 6121 University Blvd                     | SivdC5              |
| Aquatic Ecosystems Research Lab (AERL), 2202 Main Mall   | E3                  |
| Asian Centre, 1871 West Mall   | B2                  |
| Auditorium Annex Offices A & B, 1924 West Mall   | uD3<br>C3           |
| Barn ("Owl" child care), 2323 Main Mall  | E3                  |
| Baseball Indoor Training Centre, 3085 West Mall<br>B.C. Binning Studios, 6373 University Blvd                                    | J5<br>D3            |
| Beaty Biodiversity Centre & Museum, 2212 Main Mall   | E3/4                |
| Belkin (Morris & Helen) Art Gallery, 1825 Main Mall<br>Berwick Memorial Centre, 2765 Osovoos Cres                                | <b>B3</b><br>G6     |
| Bioenergy Research & Demonstration Facility (BRDF), 2337 Low   | er Mall E2          |
| Biological Sciences Bldg, 6270 University Blvd   | D3                  |
| Biomedical Research Ctr, 2222 Health Sciences Mail<br>Bollert (Mary) Hall. 6253 NW Marine Dr.                                    | E4<br>A4            |
| Bookstore, 6200 University Blvd  | D4                  |
| Botanical Garden Centre/Gatehouse, 6804 SW Marine Dr   | H1                  |
| Botan Garden Pavilion (enter al Gatenouse, 6004 SW Manne<br>Botan. Gard. Greenhses/ Workshops, 3929 Wesbrook MallS               | outh Campus         |
| Brimacombe Building, 2355 East Mall  | F4                  |
| Brock Commons - Tallwood House (construction), 6088 Walter Ga<br>BROCK HALL: Student Services & Welcome Centre 1874 East N       | age RdB4<br>Mali C4 |
| Brock Hall Annex, 1874 East Mall   | C4                  |
| Buchanan Building (Blocks A, B, C, D, & E) [Arts], 1866 Main Mal   | IB3/4               |
| Building Ops Nurserv/Greenhouses, 6029 Nurseries RdS   | outh Campus         |
| C.K. Choi Building for the Institute of Asian Research, 1855 West  | t Mall B2           |
| Campus & Community Planning, 2210 West Mall  | E3<br>F5            |
| Campus Security, 2133 East Mall  | D4                  |
| Carey Centre / Theological College, 5920 Iona Drive/1815 Wesbr   | ook Mall B6         |
| Cecil Green Park Coach House, 6323 Cecil Green Park Rd<br>Cecil Green Park House, 6251 Cecil Green Park Rd                       | A3<br>A3            |
| Centre for Brain Health (Djavad Mowafaghian), 2215 Wesbrook M  | /all E5             |
| Centre for Comparative Medicine (CCM), 4145 Wesbrook MallS   | outh Campus         |
| Chan Gunn Pavilion (new sports med. construction), 2553 Wesbr  | ook MallG5          |
| Chemical & Biological Engineering Bldg, 2360 East Mall   |                     |
| Chemistry A Block - Chemistry Physics Building, 6221 University<br>Chemistry B.C.D & E Blocks, 2036 Main Mall                    | Bivd D4             |
| Child Care Services Administration Bldg, 2881 Acadia Rd  | H7                  |
| Child Care Services Bldgs, Osoyoos Crescent and Revelstoke Cr<br>CIRS (Centre for Interactive Research on Sustainability) 2260 W | tH7<br>ost Mall F3  |
| Civil & Mechanical Engineering Bldg (CEME), 6250 Applied Scier   | ice Lane E4         |
| Civil & Mechanical Eng. Labs ("Rusty Hut"), 2275 East Mall   | E4                  |
| Coal & Mineral Processing Lab, 2332 West Mail<br>Continuing Studies Bldg [English Language Institute], 2121 West                 | E3<br>MallD2        |
| Copp (D.H.) Building, 2146 Health Sciences Mall  | D5                  |
| Cunningham (George) Building, 2146 East Mall   | E4                  |
| David Lam Management Research Ctr, 2033 Main Mall  | C3                  |
| David Strangway Building, 5950 University Blvd   | D5                  |
| Donald Rix Building, 2389 Health Sciences Mail<br>Doug Mitchell Thunderbird Sports Centre, 6066 Thunderbird Blvd                 |                     |
| Dorothy Somerset Studios, 6361 University Blvd   | D3                  |
| Earth Sciences Building (ESB), 2207 Main Mall  | E3                  |
| Earthquake Engineering Research Facility (EERF), 2235 East Ma  | allE3               |
| Engineering High Head Room Lab, 2225 East Mall   | E4                  |
| Engineering Student Centre, 2335 Engineering Road<br>English Language Institute (ELL) — see Continuing Studies Buil              |                     |
| Environmental Services Facility, 6025 Nurseries RdS  | outh Campus         |
| Fairview Crescent Residence, 2600-2804 Fairview Cres   | F6                  |
| First Nations Longhouse, 1985 West Mall  |                     |
| Flag Pole Plaza (Main Mall & Crescent Rd)  | B3                  |
| Food, Nutrition and Health Bldg, 2205 East Mall<br>Forest Sciences Centre (Faculty of Forestry), 2424 Main Mall                  | E4<br>F4            |
| Forward (Frank) Building, 6350 Stores Rd   | E3                  |
| FPInnovations, 2601 & 2665 East Mall   | H4                  |
| Fraser Hall, 2550 Wesbrook Mall<br>Fraternity Village. 2880 Wesbrook Mall  | G6<br>Н6            |
| Frederic Wood Theatre, 6354 Crescent Rd  | B3                  |
| Friedman Bldg, 2177 Wesbrook Mall  | E5                  |
| Geography Building, 1984 West Mall   | C3                  |
| Gerald McGavin Building, 2386 East Mall  | F4                  |
| Gerald McGavin UBC Rugby Centre, 2765 Wesbrook Mall  | G5                  |
| Green College, 6201 Cecil Green Park Rd  | A4                  |
| Hebb Building, 2045 East Mall  | D4                  |
| Henry Angus Building [Sauder School of Business], 2053 Main Ma   | 04<br>allD3         |
| Hillel House, 6145 Student Union Blvd  | C4                  |
| Horticulture Building/Greenhouse, 6394 Stores Rd   | E2/3                |

| Site or Building Name & Address                                  | Grid         |
|--|--------------|
| lugh Dempster Pavilion, 6245 Agronomy Rd                         | F4           |
| CICS/CS (Institute for Computing, Information                    |              |
| & Cognitive Systems/Computer Science), 2366 Main Mall            | F4           |
| nstructional Resources Centre (IRC), 2194 Health Sciences Mal    | lE5          |
| nternational House, 1783 West Mall                               | B2           |
| n-Vessel Composting Facility, 6035 Nurseries Road                | outh Campus  |
| rving K. Barber Learning Centre, 1961 East Mall                  | C4           |
| ack Bell Building for the School of Social Work, 2080 West Mall  | D3           |
| Aaiser (Fred) Building [Faculty of Applied Science], 2332 Main N | 1all E3      |
| Kenny (Douglas T) Building, [Psychology] 2136 West Mall          | D3           |
| Nos Ciub, 2855 Acadia Ro   | G/           |
| (Inck (Leonard S.) Bidg, 6356 Agricultural Rd                    |              |
| opdooppo Arabitosturo Appox, 2271 Main Mall                      |              |
| anuscape Architecture Armex, 257 T Main Main                     | ۲۵           |
| ibrary Preservation Archives (PARC) 6049 Nurseries Rd            | outh Campus  |
| ife Sciences Centre, 2350 Health Sciences Mall                   | E5           |
| iu Institute for Global Issues 6476 NW Marine Dr                 |              |
| ower Mall Research Station 2259   ower Mall                      |              |
| acdonald (J.B.) Building [Dentistry], 2199 Wesbrook Mall         |              |
| AcLeod (Hector) Building, 2356 Main Mall                         |              |
| AcMillan (H.R.) Bldg [Faculty of Land & Food Systems], 2357 M    | 1ain Mall F3 |
| Marine Drive Residence (Front Desk in Bldg #3), 2205 Lower Ma    | II E2        |
| Aterial Recovery Facility, 6055 Nurseries Rd                     | outh Campus  |
| Nathematics Annex, 1986 Mathematics Rd                           | C3           |
| Nathematics Building, 1984 Mathematics Rd                        | C3           |
| Medical Sciences Block C, 2176 Health Sc. Mall                   | E4           |
| Aichael Smith Laboratories, 2185 East Mall                       | D4           |
| Auseum of Anthropology (MOA), 6393 NW Marine Dr                  | A2/3         |
| Ausic Building, 6361 Memorial Rd                                 | B/C3         |
| Valional Soccer Development Centre, 5065 Westhook Mail           | כח           |
| litaba Momorial Cardon, 1895 Lower Mall                          | D4<br>B/C2   |
| Jobel Biocare Oral Heath Centre, 2151 Weshrook Mall              | b/02<br>F5   |
| Norman MacKenzie House, 6565 NW Marine Dr                        | E0<br>B2     |
| NRC Institute for Fuel Cell Innovation. 4250 Wesbrook MallS      | outh Campus  |
| Old Administration Building, 6328 Memorial Rd                    | C3           |
| Did Auditorium, 6344 Memorial Rd                                 | C3           |
| Old Barn Community Centre, 6308 Thunderbird Blvd                 | G3           |
| Did Firehall, 2038 West Mall                                     | D3           |
| Drchard Commons, 6363 Agronomy Rd                                | F3           |
| Dsborne (Robert F.) Centre/Gym, 6108 Thunderbird Blvd            | G4           |
| acitic Museum of Earth (in EOS-Main), 6339 Stores Rd             | E3           |
| anhellenic House, 2770 Wesbrook Mall                             | Gb           |
| Peter Wall Institute for Advanced Studies (PWIAS), 6331 Crescel  | nt Ka B3     |
| Pharmaceutical Sciences Building, 2405 Westprook Mail            | F3           |
| Plant Science Field Station & Garage 2613 West Mall              |              |
| Point Grev Apartments 2875 Osovoos Cresc                         |              |
| Police (RCMP) & Fire Department 2990/2992 Wesbrook Mall          |              |
| PONDEROSA COMMONS, University Blvd & West Mall                   | D2/3         |
| Arbutus & Maple Houses, 6488 University Blvd.                    | D2           |
| Cedar House (Ponderosa Commons Front Desk), 2075 West            | MallD2       |
| Oak House, 6445 University Blvd                                  | D2           |
| Spruce House, 2118 West Mall                                     | D3           |

| Site or Building Name & Address                               | Grid         |
|---|--------------|
| Ponderosa Office Annexes: A, B, & C, 2011-2029 West Mall      | C/D2         |
| Ponderosa Office Annexes: E, F & G, 2008-2044 Lower Mall      | C/D2         |
| Power House, 2040 West Mall                                   | D3           |
| Pulp and Paper Centre, 2385 East Mall                         | F4           |
| Ritsumeikan-UBC House, 6460 Agronomy Rd                       | F2           |
| Rose Garden   | B3           |
| Rugby Pavilion, 2584 East Mall                                | G4           |
| Scarfe (Neville) Building [Education], 2125 Main Mall         | D3           |
| School of Population & Public Health (SPPH), 2206 East Mall   | E4           |
| SERC (Staging Environmental Research Ctr), 6045 Nurseries Re  | dS.Campus    |
| Sing Tao Building, 6388 Crescent Rd                           | B3           |
| Sopron House, 2730 Acadia Rd                                  | G7           |
| South Campus Warehouse, 6116 Nurseries Rd                     | South Campus |
| Spirit Park Apartments, 2705-2725 Osoyoos Cresc               | G8           |
| St. Andrew's Hall/Residence, 6040 Iona Dr                     | B5           |
| St. John Hospice, 6389 Stadium Road                           | H3           |
| St. John's College, 2111 Lower Mall                           | D2           |
| St. Mark's College, 5935 Iona Dr.                             | B6           |
| Stores Road Annex, 6368 Stores Rd                             | E3           |
| Student Family Housing (Acadia Park Residence)                | F/H-6/7      |
| Student Recreation Centre, 6000 Student Union Blvd            | C5           |
| Student Union Bldg (old) (Old SUB), 6138 Student Union Blvd   | C4           |
| EF3 (Technology Enterprise Facility 3), 6190 Agronomy Rd      | F4           |
| Thea Koerner House [Faculty of Graduate Studies], 6371 Cresce | ent Rd B3    |
| Theatre-Film Production Bldg, 6358 University Blvd            | D3           |
| Thunderbird Residence, 6335 Thunderbird Cresc                 | F3/4         |
| Thunderbird Arena (in Doug Mitchell Centre), 2555 Wesbrook Ma | allG5        |
| Thunderbird Stadium, 6288 Stadium Rd                          | J3           |
| Iotem Field Studios, 2613 West Mall                           | H2           |
| Totem Park Residence, 2525 West Mall                          | F/G2         |
| TRIUMF, 4004 Wesbrook Mail                                    | South Campus |
| Inum House (IRIUME VISION Residence), 5835 Inunderbird E      | 3IV0Gb       |
| UBC Bookstore, 6200 University Biva                           |              |
| UBC Football Academic Centre 6298 Stadium Rd                  |              |
| LIBC Hospital 2211 Wesbrook Mall                              |              |
| LIBC Parking Impound Lot 2451 East Mall                       | E0<br>F4     |
| LIBC Tennis Centre 6160 Thunderbird Blvd                      | G4           |
| University Centre (Leon & Thea Koerner) 6331 Crescent Rd      | B3           |
| University Services Building (USB) 2329 West Mall             | F2           |
| Vancouver School of Theology (VST), 6015 Walter Gage Rd       |              |
| Vantage College (in Orchard Commons, Fall 2016), 6363 Agrond  | omv Rd F3    |
| War Memorial Gymnasium, 6081 University Blvd                  | D5           |
| Wayne & William White Engineering Design Ctr. 2345 East Mall. | E4           |
| Wesbrook Bldg, 6174 University Blvd                           | D4           |
| Wesbrook Community Centre, 5998 Berton Ave                    | South Campus |
| Wesbrook Village commercial centre                            | South Campus |
| West Mall Annex, 1933 West Mall                               | C2           |
| West Mall Swing Space Bldg, 2175 West Mall                    | D2           |
| Wood Drying Laboratory, 2324 West Mall                        | E3           |
| Woodward IRC, 2194 Health Sciences Mall                       | E4/5         |
| Woodward Library, 2198 Health Sciences Mall                   | E4/5         |

Thunderbird Park

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S Birney Av WESBROOK

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TRIUMF Canada's National Laboratory for/Particle

and Nuclear Physics

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Botanical Garden Greenhouses/Workshops

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Environmental Services Facility

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Hampton Pla

VENUE

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MTInnovations

Material Recovery Facility



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