



Review

“Models in Meteorology and Climatology” Fifty Years on

Roger G. Barry

Distinguished Professor Emeritus of Geography, National Snow and Ice Data Center, CIRES, University of Colorado, Boulder, CO 80309

* **Correspondence:** Email: rbarry@nsidc.org.

Abstract: A review is presented of contributions made by the author and graduate students over the fifty years since the publication of a chapter on “Models in meteorology and climatology” by the author in 1967. Advances in the applications of general circulation models, remote sensing, and climate change and paleoclimatology are briefly described in the context of the development of climate science. Publication of the first use of a GCM to simulate Ice Age climate is noted. The application of optical and passive microwave remote sensing to mapping snow cover, glaciers, sea ice and frozen ground are discussed. Our focus was particularly on Arctic conditions. Many of the algorithms were developed in association with the National Snow and Ice Data Center that the author directed from 1976 to 2008.

Keywords: Models; remote sensing; climate change

1. Background

“Models in Geography” was published in 1967 just as I was preparing to relocate from the University of Southampton to the University of Colorado, Boulder, in the following year. The writing of my chapter on models in meteorology and climatology [1] coincided with the beginning

of my long collaboration with Richard Chorley on the first edition of “*Atmosphere, weather and climate*”, which appeared in its ninth edition in 2010—a success we never imagined possible [2]!

The chapter made brief mention of general circulation models, which were first released in the 1970s and employed by one of my doctoral students, as I will recount below. The growth of numerical modeling is undoubtedly the major achievement of the meteorological profession over the last four decades. The other primary advance has been in the field of paleoclimatology and climate change that was barely recognized as appropriate for study in the 1960s. Other advances have been made possible by technological developments—the wide use of satellite remote sensing, faster computers and massive databases, and novel instrumentation systems such as ARGOS floats monitoring the world’s oceans. This progress in the discipline will be reviewed here and I will also highlight the contributions that I and many of my graduate students have made.

My own trajectory reflects many of the developments in climate science since 1960. My exposure to arctic meteorology and glacial history at McGill University, Montreal and the McGill Subarctic Research Laboratory at Schefferville, PQ by the late Professor F.K. Hare and Dr. Jack D. Ives, respectively, led me into a lifelong interest in cold climates and snow and ice. This history is traced in a review paper [3]. My early work in synoptic climatology evolved into Arctic and mountain climatology, climate change and paleoclimatology. A new direction occurred after 1976 when I became Director of the World Data Center-A for Glaciology, that became the National Snow and Ice Data Center (NSIDC) in 1982. This led me into glaciology and permafrost studies, remote sensing of snow cover, glaciers, sea ice and frozen ground, and data management, as the center grew from two staff in 1976 to ninety in 2008 when I stepped down as Director.

2. Numerical Models of the General Circulation

Among the earliest numerical models of the general circulation of the atmosphere was that developed at the National Center for Atmospheric Research (NCAR) in Boulder, CO by Akira Kasahara and Warren Washington [4]. This model was used by my doctoral student, Jill Williams, to perform the first global Ice Age experiment [5]. Comparison was made between a control run and one with surface boundary conditions for the Last Glacial Maximum (LGM). Jill went on to examine the effects of snow cover on the circulation [6]. A proposal to the National Science Foundation to compare the results of the NCAR, Geophysical Fluid Dynamics Laboratory (GFDL), and University of Oregon models was approved, but regrettably was never able to be implemented due to the unwillingness of the other groups to share their model outputs. The application of climate models in paleoclimatic reconstruction was reviewed in Barry [7]. A later student, Gerry Meehl, went on to modeling research at NCAR after earlier completing his MA (1978) and PhD (1986) degrees with me. He subsequently became a leading player in the Intergovernmental Panel on Climate Change (IPCC) Assessment Reports [8]. A diagnostic analysis of observed Arctic pressure patterns compared with those simulated by the Goddard Institute for Space Sciences

(GISS) GCM was carried out by Crane and Barry [9] using synoptic pressure pattern types. Barry and Carleton [10] published a major advanced text on dynamic and synoptic climatology that included a discussion of general circulation models. The availability and utility of cryospheric data sets for model validation was discussed by Barry [11] and a review of models developed for different components of the cryosphere was published [12]. Regional models of the atmospheric circulation in the Arctic were described in a textbook by Serreze and Barry [13,14].

In 1972, a topographic model for solar radiation receipts was coded by Larry Williams and used in assessments of conditions favoring glacierization in the mountains of eastern Baffin Island [15] and later in a study of radiation potential for vegetation growth in a valley in the highlands of New Guinea [16]. A model for atmospheric emittance of infrared radiation in mountain areas was developed at Niwot Ridge, Colorado by LeDrew [17]. Snow cover modeling, using the NCAR Community Climate Model CCM3, was pursued by Susan Marshall (PhD 1989) [18], and Mike Morassutti [19] studied albedo parameterization in sea ice models. In 1996 Lauren Hay undertook an assessment of the Rhea orographic precipitation model in southwest Colorado [20], demonstrating its validity.

GCMs have rapidly evolved over the last two decades. Atmospheric GCMs were coupled initially to slab oceans and then to full ocean GCMs, eventually incorporating sea ice models. Horizontal resolutions were steadily increased and the vertical domain was extended into the upper stratosphere. Land surface models were incorporated and biogeochemical exchanges were added. A major development over the last decade has been the expansion of Climate Model Intercomparison Projects (CMIP 3 and 5) as a background for the Intergovernmental Programme on Climate Change (IPCC) Assessment Reports 4 and 5 in 2007 and 2013, respectively. I was a review editor for the cryosphere chapter of the Scientific Assessment, volume 1 in 2007 and of the polar regions chapter of volume 2.

3. Remote Sensing

While the first meteorological satellite was launched in 1960, widespread use of satellite data for climatological research awaited the creation of gridded products that were readily accessible and freely available from data archives and could be processed by fast computers. These conditions began to be met in the 1990s through NASA's Earth Observation System, although studies using hard-copy images began in the 1970s and 80s. A mapping study of landfast ice along the Beaufort Sea coast of Alaska was carried out by Barry et al. [21] using Landsat imagery. Andrew Carleton (PhD 1982) [22,23] made use of Defense Meteorological Satellite Program (DMSP) negative transparencies, then archived at the National Snow and Ice Data Center, to analyze synoptic systems in the Southern Hemisphere. This imagery was later used by Robinson et al. [24] to analyze snow melt and albedo of Arctic sea ice and to study Arctic spring cloudiness [25,26]. Later it was used to map the global occurrence of night-time

lightning flashes [27]. Key and Barry [28] used Advanced Very High Resolution (AVHRR) data in a study of Arctic cloud detection. Key et al. [29] extended this work using fuzzy set algorithms in cloud classification. Early work with passive microwave data for Arctic sea ice extent and concentration was performed by Robert Crane (PhD 1981). Crane et al. [30] using Electrically-Scanning Microwave Data (ESMR), and by Mark Anderson (PhD 1982) Anderson et al. [31] using Scanning Multichannel Microwave Radiometer (SMMR) data. Axel Schweiger (MA 1987) used SMMR-derived snow cover data to compare with station observations of snow cover in Germany [32]. SMMR and drifting buoy data for 1979–1985 were used by Barry and Maslanik [33] to examine Arctic sea ice characteristics and atmosphere-ice interactions. AVHRR and SMMR data were merged in a study of Arctic sea ice and clouds by Maslanik et al. [34]. Jeff Key (PhD 1988), Jim Maslanik (PhD 1988), Mark Serreze (PhD 1989), Alfred McLaren (PhD 1986) and Martin Miles (PhD 1992) were all part of an Office of Naval Research funded project on Arctic Ocean ice, 1986–1992. McLaren undertook a comparison of submarine sonar data on sea ice draft from the 1958 USS *Nautilus* and the 1970 USS *Queenfish* transects of the Arctic Ocean [35,36]. He had been commander of the *USS Queenfish*. Key and McLaren [37] analyzed the statistical characteristics of under-ice keels reported by the *USS Queenfish*. Mark Serreze analyzed sea ice drift in the Arctic Ocean in relation to atmospheric forcing [38,29], while Martin Miles mapped leads in Arctic sea ice from DMSP imagery [40]. A study of plumes from Arctic leads based on airborne lidar measurements was undertaken by Schnell et al. [41]. Andrew Tait (PhD 1996) [42,43] developed an algorithm for passive microwave data to estimate snow water equivalent.

The characteristics, possible causes, and feedbacks involved in the amplification of global warming in the Arctic were detailed by Serreze and Barry [44]. Building on the PhD work of Shari (Fox) Gearheard in 2004 on traditional Inuit knowledge about the environment, Weatherhead et al. [45] analyzed weather persistence at an Arctic station and identified some commonalities with Inuit observations.

Richard Armstrong (PhD 1985) moved from field studies of snow processes to developing algorithms to calculate snow water equivalent (SWE) [46] and developed gridding procedures—the Equal Area Scalable Earth Grid (EASE)—at the National Snow and Ice Data Center (NSIDC), University of Colorado, Boulder, that are widely used for archival and distribution of satellite data products [47]. EASE grid version 2 was released in 2012. Later collaboration of Armstrong with T-J. Zhang at NSIDC led to the development of passive microwave algorithms to map ground freezing over the northern continents [48].

An overview of remote sensing of the cryosphere was presented by Barry [49]) while many aspects of the various components of the cryosphere were detailed in a book on the global cryosphere by Barry and Gan [50]. This addressed snow cover, avalanches, glaciers, ice sheets, ground ice, freshwater ice, sea ice, ice shelves, the past history of ice on earth, and projected future conditions. The status of the components of the Arctic cryosphere in the 21st century was reviewed

by Barry [51]. The major changes in summer Arctic sea ice, mass balance of glaciers, ice cap and the Greenland ice sheet, and permafrost thawing were documented.

4. Climate Change and Paleoclimatology

In the 1960s the study of climate change and paleoclimatology was in its infancy. Radiocarbon dating was only a decade old and knowledge of Quaternary glaciations was sketchy. Climatic data were mostly undigitized and difficult to access. Barry [52] digitized the climate records from the stations installed in 1952, under the leadership of John Marr, along the east slope of the Colorado Front Range up to 3,740 m and analyzed the data for 1952–1970. Ray Bradley (PhD 1976) [53] digitized weather records from military forts in the western United States and examined secular climatic fluctuations in southwest Colorado [54]. Bradley [55] went on to publish a text on Quaternary paleoclimatology and a series of works on climate change and paleoclimatology over the next three decades. Records collected at the summit of Pike's Peak, Colorado during 1874–1888 were digitized and analyzed by Diaz et al. [56]. Henry Diaz (PhD 1985) and George Kiladis (PhD 1985) collaborated on studies of global anomalies associated with extremes in the Southern Oscillation [57] and Diaz edited a book on El Niño and the Southern Oscillation [58].

A major advance in the documentation of trends in atmospheric circulation and climatic variables was made possible by the advent of re-analyses, which assembled and quality controlled all available historical observations and input them into a consistent numerical model. Kalnay et al [59] provided the first such retrospective data set known as the National Centers for Environmental Prediction (NCEP)/NCAR re-analysis spanning 40 years, that has since been extended to cover the period from 1948 to present. The European Centre for Medium Range Weather Forecasting (ECMF) Reanalysis (ERA-40) spans 1957–2002; subsequently, several other such data sets with higher resolution have been produced and are widely used.

Another area of paleoclimatological research has involved the application of global climate models with appropriate Milankovich and other forcings, and boundary conditions, to simulate past climatic states. A Paleoclimate Modelling Intercomparison Project (PMIP) has intercompared model results for the Last Glacial Maximum and the Holocene thermal maximum.

5. Concluding Remarks

The last half-century has witnessed major advances in the development and application of models in meteorology and climatology. Subfields concerned with GCMs, climate change, and remote sensing have seen great increases in the associated literature, which is reflected in the unprecedented number of new journals and texts devoted to climate research and related remote sensing and geophysical sciences. I began my career at McGill University in 1958–1959 using punched cards and a sorter. At University of Liverpool in 1960 I used the first-generation English

Electric Deuce computer, programmed in machine language, with punched cards of upper air data from Asheville, NC. At University of Southampton I used a Pegasus computer and autocode, with paper tape. Finally, at University of Colorado in 1968 I employed a programmer for a CDC750. I began work in remote sensing using ERS-1 images in 1974 and progressed to analysis of ESMR data on Arctic sea ice in 1982. Digital analysis of passive microwave data was implemented by doctoral student Rob Crane and Mark Anderson in 1985. Climatology in the 1950s was essentially bookkeeping of climate records. By the 1970s, research on climate change and paleoclimates was growing rapidly, aided by increasing data availability. The role of greenhouse gases on global climate was beginning to be recognized and teleconnections were being investigated.

Many of my graduate students made substantial contributions to the field during their association with me and have continued to do so during their subsequent careers.

Conflict of Interest

All authors declare no conflict of interest in this review.

References

1. Barry RG (1967) Models in meteorology and climatology, In Haggett, P. and Chorley, R.J. (eds.) *Models in geography*. London, Methuen, 97-144.
2. Barry RG, Chorley RJ (2010) *Atmosphere, weather and climate*. 9th edn. London: Routledge. 435.
3. Barry RG (2015) The shaping of climate science: Half a century in personal perspective. *Hist Geo Spat Sci* 6: 87-105.
4. Kasahara A, Washington WM (1967) NCAR Global General Circulation Model of the atmosphere. *Mon Wea Rev* 94: 389-402.
5. Williams J, Barry RG, Washington WM (1974) Simulation of the atmospheric circulation using the NCAR Global Circulation Model with Ice Age boundary conditions. *J Appl Met* 13: 305-317.
6. Williams J (1975) The influence of snow-cover on the atmospheric circulation and its role in climatic change: An analysis based on results from the NCAR global circulation model. *J Appl Met* 14: 137-152.
7. Barry RG (1975) Climate models in paleoclimatic reconstruction. *Palaeogeogr Palaeoclimatol Palaeoecol* 17: 123-137.
8. Meehl GA, Stocker T, Collins WD, et al. (2007) Global climate projections. In Solomon, S. and Qin, D-H. (eds). *Climate change Assessment Report of the Intergovernmental Panel on Climate Change*. Cambridge: Cambridge University Press. Chapter 10.
9. Crane RG, Barry RG (1988) Comparison of the MSL synoptic pressure patterns of the Arctic as observed and simulated the GISS general circulation model. *Met Amos Phys* 39: 169-183.
10. Barry RG, Carleton AM (2001) *Dynamic and synoptic climatology*. London: Routledge. 161-166.

11. Barry RG (1997) Cryospheric data for model validations: requirements and status. *Ann Glaciol* 25: 371-375.
12. Marshall S, Roads J, Barry RG (2009) Cryosphere models. In R. A. Meyers (ed.-in-chief), *Encyclopedia of complexity and system science*. Dordrecht: Springer, 2: 1704-1718.
13. Serreze MC, Barry RG (2005) *The Arctic climate system*. Cambridge: Cambridge University Press, 385.
14. Serreze MC, Barry RG (2014) *The Arctic climate system*, Cambridge: Cambridge University Press. 404.
15. Barry RG, Williams LD, Andrews JT (1972) Application of computed global radiation for areas of high relief. *J Appl Met* 11: 526-533.
16. Barry RG (1978) Diurnal effects on topoclimate on an equatorial mountain. *Arbeiten der Zentralanstalt für Meteorologie und Geodynamik (Vienna)*, Publ. 32: 1-8.
17. LeDrew EF (1975) The estimation of clear sky atmospheric emittance at high altitudes. *Arct Alp Res* 7: 227-236.
18. Marshall S, Roads JO, Glatzmeier G (1994) Snow hydrology in a general circulation model. *J Climate* 7: 1251-1269.
19. Morassutti MP (1989) Surface albedo parameterization in sea-ice models. *Progress Phys Geog* 13: 348-366.
20. Hay LE, McCabe GJ (1998) Verification of the Rhea-Orographic-Precipitation Model. *J Amer Water Resour Assoc* 34: 103-111.
21. Barry RG, Moritz RE, Rogers JC (1979) The fast ice regimes of the Beaufort and Chukchi Sea coasts, Alaska. *Cold Regions Sci Technol* 1: 129-152.
22. Carleton AM (1979) A synoptic climatology of satellite observed extratropical cyclone activity for the Southern Hemisphere winter. *Archiv Met Geophys Bioklim* B27: 265-279.
23. Carleton AM (1981) Monthly variability of satellite derived cyclone activity for the Southern Hemisphere. *J Climatol* 1: 21-28.
24. Robinson DA, Scharfen G, Barry RG, et al. (1987) Analysis of interannual variations of snow melt on Arctic sea ice mapped from meteorological satellite imagery. In: B.E. Goodison, R.G. Barry and J. Dozier, (eds)., *Large-Scale Effects of Seasonal Snow Cover*. IAHS Publ No 166, Wallingford, UK: 315-327.
25. Barry RG, Crane RG, Schweiger A, et al. (2010) Arctic cloudiness in spring from satellite imagery. *Int J Climatol* 7: 423-451.
26. McGuffie K, Barry RG, Schweiger A, et al. (1988) Intercomparisons of satellite-derived cloud analyses for the Arctic Ocean in spring and summer. *Int J Remote Sens* 9: 447-467.
27. Barry RG, Scharfen GR, Knowles KW, et al. (1994) Global distribution of lightning mapped for night-time visible band DMSP satellite data. *Révue Generale d'Électricité*. 6: 13-16.
28. Key JR, Barry RG (1989) Cloud cover analysis with Arctic AVHRR data: cloud detection. *J Geophys Res* 94: 18521-18535.

29. Key JR, Maslanik JA, Barry RG (1989) Cloud classification from satellite data using fuzzy set algorithms: a polar example. *Int J Remote Sens* 10: 1823-1842.
30. Crane RG, Barry RG, Zwally HJ (1982) Analysis of atmosphere-sea ice interactions in the Arctic Basin using ESMR microwave data. *Int J Rem Sens* 3: 259-276.
31. Anderson MR, Crane RG, Barry RG (1985) Characteristics of Arctic Ocean ice determined from SMMR data for 1979: Case studies in the seasonal sea ice zone. In: G. Ohring and H.J. Bolle (eds), *Advances in Space Research, Space observations for climate studies*. 5: 257-261.
32. Schweiger AJ, Armstrong R, Barry RG (1987) Snow cover parameter retrieval from various data sources in the Federal Republic of Germany. In: B.E. Goodison, R.G. Barry, J. Dozier (eds), *Large-Scale Effects of Seasonal Snow Cover. IAHS Publ. No. 166*, Wallingford, UK: IAHS Press. 353-3-64.
33. Barry RG, Maslanik JA (1989) Arctic sea ice characteristics and associated atmosphere-ice interactions in summer inferred from SMMR data and drifting buoys: 1979 to 1985. *Geo J* 18: 35-44.
34. Maslanik JA, Key JR, Barry RG (1989) Merging AVHRR and SMMR data for remote sensing of ice and cloud in polar regions. *Internat J Rem Sens* 10: 1691-1696.
35. McLaren AS (1989) The under-ice thickness distribution of the Arctic Basin as recorded in 1958 and 1970. *J Geophys Res* 94: 4971-4983.
36. McLaren AS, Barry RG, Bourke RH (1990) Could Arctic ice be thinning? *Nature* 345: 762.
37. Key JR, McLaren AS (1989) Periodicities and keel spacing in the under-ice draft of the Canada Basin recorded by the USS *Queenfish* August 1970. *Cold Regions Sci Technol* 16: 1-10.
38. Serreze MC, Barry RG, McLaren AS (1989) Seasonal variations in sea ice motion and effects on sea ice concentrations in the Canada Basin. *J Geophys Res* 94: 10955-10997.
39. Serreze MC, McLaren AS, Barry RG (1990) Seasonal variations of sea ice motion in the Transpolar Drift Stream. *Geophys Res Lett* 16: 811-814.
40. Miles MW, Barry RG (1998) A 5-year satellite climatology of winter sea ice leads in the western Arctic. *J Geophys Res* 103: 21723-21734.
41. Schnell RC, Barry RG, Miles MW, et al. (1989) Lidar detection of leads in Arctic sea ice. *Nature* 339: 530-532.
42. Tait A (1998) Estimation of snow water equivalent using passive microwave radiation data. *Remote Sens Environ* 64: 286-291.
43. Tait AB, Hall DK, Foster JL, et al. (2000) Utilizing multiple data sets for snow-cover mapping. *Remote Sens Environ* 72: 111-126.
44. Serreze MC, Barry RG (2011) Processes and impacts of Arctic amplification: A research synthesis. *Global Planet Change* 77: 85-96.
45. Weatherhead EC, Gearheard S, Barry RG (2010) Changes in weather persistence: insight from Inuit knowledge. *Global Environ Change* 20: 523-528.

46. Armstrong RL, Brodzik MJ (2002) Hemispheric-scale comparison and evaluation of passive microwave snow algorithms. *Annal Glaciol* 34: 38-44.
47. Armstrong RL, Brodzik MJ (1995) An earth-gridded SSM/I data set for cryospheric studies and global change monitoring. *Adv Space Res* 10: 155-163.
48. Zhang T, Barry RG, Armstrong RL (2004) Application of satellite remote sensing techniques to frozen ground studies. *Polar Geog* 28: 163-196.
49. Barry RG (2014) Cryosphere, measurements and application. In E. Njoku (ed), *Encyclopedia of Remote Sensing*. Dordrecht: Springer, 104-118.
50. Barry RG, Gan TY (2011) *The global cryosphere: Past, present and future*. Cambridge: Cambridge University Press. 477.
51. Barry RG (2017) The Arctic cryosphere in the 21st century. *Geog Rev* 107: 69-88.
52. Barry RG (1973) A climatological transect on the east slope of the Front Range, Colorado. *Arct Alp Res* 5: 89-110.
53. Bradley RS (1976) *Precipitation History of the Rocky Mountain States*. Boulder: Westview Press.
54. Bradley RS, Barry RG (1973) Secular climatic fluctuations in southwestern Colorado. *Mon Wea Rev* 101: 264-270.
55. Bradley RS (1985) *Quaternary paleoclimatology: Methods of paleoclimatic reconstruction*. London: Chapman and Hall.
56. Diaz HF, Barry RG, Kiladis GN (1982) Climatic characteristics of Pike's Peak, Colorado (1874 to 1888) and comparisons with other Colorado stations. *Mountain Res Devel* 2: 359-367.
57. Kiladis GN, Diaz HF (1989) Global climate anomalies associated with extremes in the Southern Oscillation. *J Clim* 2: 1069-1090.
58. Diaz HF, Markgraf V (eds) (1992) *El Niño: Historical and paleoclimatic aspects of the Southern Oscillation*. Cambridge: Cambridge University Press.
59. Kalnay E, Kanamitsu M, Kistler, et al. (1996) The NCEP/NCAR 40-year reanalysis project. *Bull Amer Met Soc* 77: 437-472.



AIMS Press

© 2017 the Author(s), licensee AIMS Press. This is an open access article distributed under the terms of the Creative Commons Attribution License (<http://creativecommons.org/licenses/by/4.0>)