

## COMPUTER OPTIMIZATION OF MICROWAVE CIRCUITS

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Abstract This paper reviews the state of the art of methods and techniques suitable for use in the automatic optimization of microwave circuits by digital computer. A number of significant recent developments in the rapidly developing area of computer-oriented circuit theory and design which may be directly applied to high frequency or distributed circuits are emphasized. A fairly extensive classified bibliography on optimization methods and on some applications, primarily in the microwave area, is included.

The principal aim of this paper is to bring the microwave circuit designer up to date with developments in computer-oriented optimization methods and techniques and their application to microwave circuit design. To achieve this, the state of the art is reviewed in a tutorial manner, highlighting the talk with material taken from a variety of recent research papers, published during the last year or so. Promising areas for future work are indicated. A fairly extensive classified bibliography on optimization methods and on some applications, primarily in the microwave area, concludes the paper. Papers and books not necessarily in the microwave area are referenced if it is felt that the subject matter is, nevertheless, relevant.

The first question that a microwave circuit designer might have is what material should he read to convince himself that he can solve a wide variety of design problems using optimization techniques. Five articles [1]-[5] are referenced under the heading of Reviews of Network Optimization which should probably be found most useful. Special issues and books of more general interest [6]-[12] are also listed to place the articles on network optimization in the proper framework of computer-aided circuit design.

The designer who wishes to study mathematical optimization methods [13]-[18] in more depth is recommended particularly to refer to the books by Box *et. al.* [13] and Kowalik and Osborne [17]. Both books are lucid and yet sufficiently detailed and up to date. Combined with the review articles [14]-[16], [18] a fairly wide range of ideas can be covered.

As far as optimization methods [19]-[23] are concerned we have the well-known and widely used pattern search [21] and simplex method [23], which do not require evaluation of the first partial derivatives of the function to be optimized, and the Fletcher-Powell method [19], which does. More recently [20], Fletcher proposed a method which largely removes the need

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for the one-dimensional search required by the Fletcher-Powell method in common with some other methods, and which tends to slow down the optimization process. Numerical experience indicates that this new method along with the one proposed by Jacobson and Oksman [22] are serious contenders with the highly-regarded Fletcher-Powell method as far as efficiency is concerned.

The adjoint network method of evaluating network sensitivities is a simple and effective way of obtaining the first partial derivatives of the functions to be optimized as required by the more efficient optimization methods. In most cases of interest to microwave circuit designers, the computational effort required to obtain these derivatives is about the same as that usually required for one network analysis, and often less. A list of papers dealing with the adjoint network method using voltage and current variables is given in the bibliography [24]-[30]. In particular, the paper by Bandler and Seviora [24] is recommended. It provides a fairly thorough review of the adjoint network method for lumped and distributed linear networks in the frequency domain together with extensive tables of first-order sensitivity formulas. Of special interest to microwave circuit designers might be the adjoint network method using wave variables. A number of useful papers on this topic are listed [31]-[36], including ones dealing with second-order sensitivities.

A section in the bibliography deals with methods relating to optimal design in the Chebyshev or minimax sense [37]-[44]. These papers either deal with microwave examples or could be readily applied to microwave examples. With one exception [37] the ready availability of accurate first derivatives using the adjoint network method can be profitably exploited. Two gradient algorithms based on the idea of the razor search method [37] have been developed. One of them [38] requires the solution of simultaneous linear equations to determine a linear search direction of expected improvement. The other [39] requires the solution of a linear programming problem and is more suited to handling linear constraints. This method has been compared with the Osborne and Watson method [42] (similar to the Ishizaki-Watanabe method [41]) and found to be generally slower but more reliable.

Least pth approximation [45]-[49] is often felt to be easier to carry out in practice than minimax approximation and usually produces results that, for engineering purposes, are sufficiently close to the minimax results. The microwave filter designer's attention is drawn to the paper by Bandler and Charalambous [46] on generalized least pth objectives. Using these objectives filters may be readily designed to meet or exceed certain passband and stopband specifications using least pth approximation.

Finally, a list of references dealing with design problems of relevance are given. They include the design of matching networks and equalizers [50]-[57], filter design [58]-[65], the design of circuits involving active elements [66]-[78] and methods of relevance to antenna array design [79]-[82]. The author makes no apology for including some papers that do little credit to the field of computer-aided design optimization (although possibly worthwhile in other respects). They are included more because the problems they describe are eminently suitable to solution by optimization methods, than because they are instructive in optimization techniques. A great deal obviously remains to be done in applying the best methods to suitably formulated microwave circuit design problems and, thereby, to obtain the most desirable results.

BibliographyReviews of Network Optimization

- [1] J.W. Bandler, "Optimization methods for computer-aided design", IEEE Trans. Microwave Theory and Techniques, vol. MTT-17, pp. 533-552, August 1969.
- [2] S.W. Director, "Survey of circuit-oriented optimization techniques", IEEE Trans. Circuit Theory, vol. CT-18, pp. 3-10, January 1971.
- [3] G.C. Temes and D.A. Calahan, "Computer-aided network optimization the state-of-the-art", Proc. IEEE, vol. 55, pp. 1832-1863, November 1967.
- [4] G.C. Temes, "Optimization methods in circuit design", in Computer Oriented Circuit Design, F.F. Kuo and W.G. Magnuson, Jr., Eds. Englewood Cliffs, N.J.: Prentice-Hall, 1969.
- [5] A.D. Warren, L.S. Lasdon and D.F. Suchman, "Optimization in engineering design", Proc. IEEE, vol. 55, pp. 1885-1897, November 1967.

Special Issues and Books on Computer-Aided Design

- [6] D.A. Calahan, Computer-Aided Network Design. New York: McGraw-Hill, 1968.
- [7] G.J. Herskowitz, Ed., Computer-Aided Integrated Circuit Design. New York: McGraw-Hill, 1968.
- [8] IEEE Transactions on Circuit Theory, Special Issue on Computer-Aided Circuit Design, vol. CT-18, January 1971.
- [9] IEEE Transactions on Education, Special Issues on Educational Aspects of Circuit Design by Computer, vol. E-12, September and December 1969.
- [10] IEEE Transactions on Microwave Theory and Techniques, Special Issue on Computer-Oriented Microwave Practices, vol. MTT-17, August 1970.
- [11] F.F. Kuo and W.G. Magnuson, Jr., Eds., Computer Oriented Circuit Design. Englewood Cliffs, N.J.: Prentice-Hall, 1969.
- [12] Proceedings of the IEEE, Special Issue on Computer-Aided Design, vol. 55, November 1967.

Reviews and Books on Optimization Theory

- [13] M.J. Box, D. Davies and W.H. Swann, Non-linear Optimization Techniques. Edinburgh, Scotland: Oliver and Boyd, 1969.
- [14] D. Davis and W.H. Swann, "Review of constrained optimization", in Optimization, R. Fletcher, Ed. New York: Academic Press, 1969.
- [15] R. Fletcher, "A review of methods for unconstrained optimization", in Optimization, R. Fletcher, Ed. New York: Academic Press, 1969.
- [16] R. Fletcher, "Methods for the solution of optimization problems" in Computer-Aided Engineering (Proceedings of the Symposium held at the University of Waterloo, Canada, May 1971), G.M.L. Gladwell, Ed.

- [17] J. Kowalik and M.R. Osborne, Methods for Unconstrained Optimization Problems. New York: Elsevier, 1968.
- [18] L.S. Lasdon and A.D. Waren, "Mathematical programming for optimal design", Electro-Technology, vol. 80, pp. 55-70, November 1967.

#### Optimization Methods

- [19] R. Fletcher and M.J.D. Powell, "A rapidly convergent descent method for minimization", Computer J., vol. 6, pp. 163-168, June 1963.
- [20] R. Fletcher, "A new approach to variable metric algorithms", Computer J., vol. 13, pp. 317-322, August 1970.
- [21] R. Hooke and T.A. Jeeves, " 'Direct search' solution of numerical and statistical problems", J. ACM, vol. 8, pp. 212-229, April 1961.
- [22] D.H. Jacobson and W. Oksman, "An algorithm that minimizes homogeneous functions of n variables in n+2 iterations and rapidly minimizes general functions", Division of Engineering and Applied Physics, Harvard University, Cambridge, Mass., Technical Report No. 618, October 1970.
- [23] J.A. Nelder and R. Mead, "A simplex method for function minimization", Computer J., vol. 7, pp. 308-313, January 1965.

#### Sensitivity Computation (Voltages and Currents)

- [24] J.W. Bandler and R.E. Seviara, "Current trends in network optimization", IEEE Trans. Microwave Theory and Techniques, vol. MTT-18, pp. 1159-1170, December 1970.
- [25] J.W. Bandler and R.E. Seviara, "Computation of sensitivities for noncommensurate networks", IEEE Trans. Circuit Theory, vol. CT-18, pp. 174-178, January 1971.
- [26] S.W. Director and R.A. Rohrer, "The generalized adjoint network and network sensitivities", IEEE Trans. Circuit Theory, vol. CT-16, pp. 318-323, August 1969.
- [27] S.W. Director and R.A. Rohrer, "Automated network design - the frequency-domain case", IEEE Trans. Circuit Theory, vol. CT-16, pp. 330-337, August 1969.
- [28] G.A. Richards, "Second-derivative sensitivity using the concept of the adjoint network", Electronics Letters, vol. 5, pp. 398-399, August 1969.
- [29] R.E. Seviara, M. Sablatash and J.W. Bandler, "Least pth and minimax objectives for automated network design", Electronics Letters, vol. 6, pp. 14-15, January 1970.
- [30] G.C. Temes, "Exact computation of group delay and its sensitivities using adjoint-network concept", Electronics Letters, vol. 6, pp. 483-485, July 1970.

Sensitivity Computation (Waves)

- [31] J.W. Bandler and R.E. Seviola, "Sensitivities in terms of wave variables", Proc. 8th Annual Allerton Conf. on Circuit and System Theory, Urbana, Ill., pp. 379-387, October 1970.
- [32] J.W. Bandler and R.E. Seviola, "Direct method for evaluating scattering-matrix sensitivities", Electronics Letters, vol. 6, pp. 773-774, November 1970.
- [33] J.W. Bandler and R.E. Seviola, "Computation of equivalent wave source using the adjoint network", Electronics Letters, vol. 7, pp. 235-236, May 1971.
- [34] J.W. Bandler and R.E. Seviola, "Wave sensitivities of networks", to be published in IEEE Transactions on Microwave Theory and Techniques.
- [35] G. Iuculano, V.A. Monaco and P. Tiberio, "Network sensitivities in terms of scattering parameters", Electronics Letters, vol. 7, pp. 53-55, January 1971.
- [36] V.A. Monaco and P. Tiberio, "On linear network scattering matrix sensitivity", Alta Frequenza, vol. 39, pp. 193-195, February 1970.

Minimax Approximation

- [37] J.W. Bandler and P.A. Macdonald, "Optimization of microwave networks by razor search", IEEE Trans. Microwave Theory and Techniques, vol. MTT-17, pp. 552-562, August 1969.
- [38] J.W. Bandler and A.G. Lee-Chan, "Gradient razor search method for optimization", 1971 International Microwave Symposium, Washington, D.C., Digest of Technical Papers, pp. 118-119, May 1971.
- [39] J.W. Bandler and T.V. Srinivasan, "A new gradient algorithm for minimax optimization of networks and systems", Proc. 14th Midwest Symposium on Circuit Theory, Denver, Colo., pp. 16.5.1-16.5.11, May 1971.
- [40] J.W. Bandler, "Conditions for a minimax optimum", IEEE Trans. Circuit Theory, vol. CT-18, pp. 476-479, July 1971.
- [41] Y. Ishizaki and H. Watanabe, "An iterative Chebyshev approximation method for network design", IEEE Trans. Circuit Theory, vol. CT-15, pp. 326-336, December 1968.
- [42] M.R. Osborne and G.A. Watson, "An algorithm for minimax approximation in the nonlinear case", Computer J., vol. 12, pp. 63-68, February 1969.
- [43] A.D. Waren, L.S. Lasdon and D.F. Suchman [5].
- [44] G.A. Watson, "On an algorithm for nonlinear minimax approximation", Comm. ACM, vol. 13, pp. 160-162, March 1970.

Least pth Approximation

- [45] J.W. Bandler and R.E. Seviola [24].

- [46] J.W. Bandler and C. Charalambous, "Generalized least pth objectives for networks and systems", Proc. 14th Midwest Symposium on Circuit Theory, Denver, Colo., pp. 10.5.1-10.5.10, May 1971.
- [47] G.C. Temes and D.Y.F. Zai, "Least pth approximation", IEEE Trans. Circuit Theory, vol. CT-16, pp. 235-237, May 1969.
- [48] G.C. Temes [4].
- [49] R.E. Seviara, M. Sablatash and J.W. Bandler [29].

#### Matching Network and Equalizer Design

- [50] J.W. Bandler, "Optimum noncommensurate stepped transmission-line transformers", Electronics Letters, vol. 4, pp. 212-213, May 1968.
- [51] J.W. Bandler and P.A. Macdonald, "Cascaded noncommensurate transmission-line networks as optimization problems", IEEE Trans. Circuit Theory, vol. CT-16, pp. 391-394, August 1969.
- [52] J.W. Bandler and P.A. Macdonald [37].
- [53] J.W. Bandler, "Computer optimization of inhomogeneous waveguide transformers", IEEE Trans. Microwave Theory and Techniques, vol. MTT-17, pp. 563-571, August 1969.
- [54] Y. Ishizaki and H. Watanabe [41].
- [55] B.W. Leake, "An application of razor search to semi-lumped networks", 1970 International Microwave Symposium, Newport Beach, Calif., Digest of Technical Papers, pp. 138-140, May 1970.
- [56] M.A. Murray-Lasso and E.B. Kozemchak, "Microwave circuit design by digital computer", IEEE Trans. Microwave Theory and Techniques, vol. MTT-17, pp. 514-526, August 1969.
- [57] P.J. Tu, "A computer-aided design of a microwave delay equalizer", IEEE Trans. Microwave Theory and Techniques, vol. MTT-17, pp. 626-634, August 1969.

#### Filter Design

- [58] J.W. Bandler and A.G. Lee-Chan [38].
- [59] C. Brancher, F. Maffioli and A. Premoli, "Computer optimization of cascaded noncommensurable-line lowpass filters", Electronics Letters, vol. 6, pp. 513-515, August 1970.
- [60] H.J. Carlin and O.P. Gupta, "Computer design of filters with lumped-distributed elements or frequency variable terminations", IEEE Trans. Microwave Theory and Techniques, vol. MTT-17, pp. 598-604, August 1969.
- [61] R.N. Gadenz and G.C. Temes, "Computation of dissipation-induced loss distortion in lumped/distributed networks", Electronics Letters, vol. 7, pp. 258-260, May 1971.
- [62] G.R. Haack, "Optimal design of coaxial low-pass filters", IEEE Trans. Microwave Theory and Techniques, vol. MTT-17, pp. 169-170, March 1969.

- [63] H.S. Hewitt, "A computer designed, 720 to 1 microwave compression filter", IEEE Trans. Microwave Theory and Techniques, vol. MTT-15, pp. 687-694, December 1967.
- [64] L.S. Lasdon and A.D. Waren, "Optimal design of filters with bounded, lossy elements", IEEE Trans. Circuit Theory, vol. CT-13, pp. 175-187, June 1966.
- [65] A.D. Waren, L.S. Lasdon and D.F. Suchman [5].

#### Active Network Design

- [66] J.W. Bandler, "Computer optimization of a stabilizing network for a tunnel-diode amplifier", IEEE Trans. Microwave Theory and Techniques, vol. MTT-16, pp. 326-333, June 1968.
- [67] A.J. Brodersen, S.W. Director and W.A. Bristol, "Simultaneous automated a.c. and d.c. design of linear integrated circuit amplifiers", IEEE Trans. Circuit Theory, vol. CT-18, pp. 50-58, January 1971.
- [68] S.C. Chao, "Computer-aided design of broadband UHF transistor amplifiers", Microwave J., vol. 12, pp. 79-83, July 1969.
- [69] H.F. Cooke and G.J. Policky, "Computer design and optimization of UHF and microwave circuits", 1967 International Solid-State Circuits Conf., Digest of Technical Papers, pp. 106-107, February 1967.
- [70] F.E. Emery and M. O'Hagan, "Optimal design of matching networks for microwave transistor amplifiers", IEEE Trans. Microwave Theory and Techniques, vol. MTT-14, pp. 696-698, December 1966.
- [71] V.G. Gelnovatch and T.F. Burke, "Computer aided design of wide-band integrated microwave transistor amplifiers on high dielectric substrates", IEEE Trans. Microwave Theory and Techniques, vol. MTT-16, pp. 429-439, July 1968.
- [72] V.G. Gelnovatch and I.L. Chase, "DEMON - an optimal seeking computer program for the design of microwave circuits", IEEE J. Solid-State Circuits, vol. SC-5, pp. 303-309, December 1970.
- [73] T.W. Houston and L.W. Read, "Computer-aided design of broad-band and low-noise microwave amplifiers", IEEE Trans. Microwave Theory and Techniques, vol. MTT-17, pp. 612-614, August 1969.
- [74] M.E. Mokari-Bolhassan and T.N. Trick, "Design of microwave integrated amplifiers", Proc. 13th Midwest Symposium on Circuit Theory, Minneapolis, Minn., pp. X.3.1-X.3.10, May 1970.
- [75] M.E. Mokari-Bolhassan, "Optimization of distributed-lumped-active networks", Report R-484, Coordinated Science Laboratory, University of Illinois, Urbana, Ill., August 1970.
- [76] M.E. Mokari-Bolhassan and T.N. Trick, "Computer-aided design of distributed-lumped-active networks", IEEE Trans. Circuit Theory, vol. CT-18, pp. 187-190, January 1971.
- [77] T.N. Trick and J. Vlach, "Computer-aided design of broad-band amplifiers with complex loads", IEEE Trans. Microwave Theory and Techniques, vol. MTT-18, pp. 541-547, September 1970.



- [78] B.A. Wooley, "The computer-aided design optimization of integrated broadband amplifiers", 1970 International Solid-State Circuits Conf., Digest of Technical Papers, pp. 84-85, February 1970.

Antenna Array Design

- [79] L.S. Lasdon, D.F. Suchman and A.D. Waren, "Nonlinear programming applied to linear array design", J. Acoust. Soc. Am., vol. 40, pp. 1197-1200, November 1966.
- [80] W.A. Sandrin, C.R. Glatt and D.S. Hague, "Design of arrays with unequal spacing and partially uniform amplitude taper", IEEE Trans. Antennas and Propagation, vol. AC-17, pp. 642-644, September 1969.
- [81] W.A. Sandrin and C.R. Glatt, "Computer aided design of optimal linear phased arrays", Microwave J., vol. 13, pp. 57-64, September 1970.
- [82] A.D. Waren, L.S. Lasdon and D.F. Suchman [5].