# RECENT ADVANCES IN ROBUST CONTROL DORATO AND YEDAVALLI, EDITORS TEEE PRESS, 1990

#### Paper 2.16

## Numerical Solution of a Two-disk Problem

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### 1 Introduction

A multidisk problem in frequency domain control system synthesis is a problem in which the designer wishes to find a feedback compensator that minimizes the  $H_{\infty}$ -norm of a certain transfer matrix related to the system being designed, subject to constraints on the  $H_{\infty}$ -norms of one or more other transfer matrices related to the system. These problems typically arise when a designer is asked to minimize a performance index such as the gain from a disturbance to a plant output while providing robust stabilization of the plant and/or satisfying constraints on other performance indices.

There are no known analytical solutions to general multidisk problems, although there are partial and approximate solutions [BH79, Kwa85] as well as an explicit solution to a special case [OF86]. In [TP88], Ting and Poolla propose and demonstrate a technique for finding suboptimal solutions to linear two-disk problems.

The purpose of this short paper is to show that while multidisk problems may not have analytical solutions, they can often be posed as infinite-dimensional convex programming problems, and so can be readily solved numerically. In fact, a program called qdes, described in [BBB\*88], can be used to generate and solve finite-dimensional approximations to such infinite-dimensional programming problems. Qdes was used to solve the example two-disk problem considered in [TP88]; the optimal performance index was found to be over four times better than the "approximate solution" found in [TP88]. This short paper outlines how qdes was used to solve this example two-disk problem.

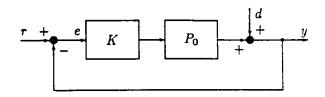


Figure 1: Block diagram for the example problem.

### 2 Example two-disk problem

The problem, as stated in [TP88], is

$$\inf_{K \text{ stabilizing } P_0} \|W_1(I+P_0K)^{-1}\|_{\infty}$$

subject to

$$||W_2 P_0 K (I + P_0 K)^{-1}||_{\infty} \le 1,$$

where

$$P_0(s) = \frac{s-2}{s-12}$$

$$W_1(s) = \frac{1}{30} \left( \frac{s+6}{s+1} \right)$$

$$W_2(s) = \frac{1}{3} \left( \frac{s+1}{s+2} \right) \left( \frac{(s+6)^2}{s^2+2s+37} \right).$$

The objective is to minimize the  $W_1$ -weighted  $H_{\infty}$ -norm of the gain from the disturbance d to the plant output y, as shown in Figure 1, and the constraint is obtained from the specification that K stabilize all plants in the family

$$C = \{P_0(I + \Delta W_2) : ||\Delta||_{\infty} < 1\}.$$

The derivation of the  $H_{\infty}$  constraint from this robustness specification is described in [DS81, Zam81].

It is easy to pose the problem as a convex optimization problem. In the terminology of

<sup>\*</sup>Research supported in part by a NSERC (Canada) 1967 Science and Engineering Scholarship.

<sup>&</sup>lt;sup>†</sup>Research supported in part by NSF under ECS-85-52465, AFOSR under 89-0228, Boeing Electronics Company under LF0937, and Bell Communications Research.

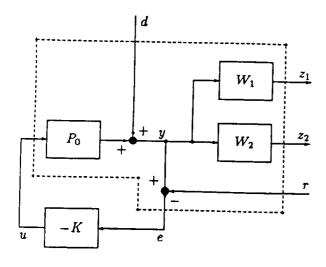


Figure 2: Problem posed in terms of  $H_{\infty}$ -norms of closed-loop transfer functions.

[BBB\*88], u is the single control input and e is the single measured variable. As shown in Figure 2, the problem can be stated as that of finding the compensator K that stabilizes  $P_0$  and minimizes the  $H_{\infty}$ -norm of the closed-loop transfer function from the exogenous input d to the regulated variable  $z_1$ , subject to the constraint that the  $H_{\infty}$ -norm of the closed-loop transfer function from the exogenous input r to the regulated variable  $z_2$  be less than or equal to one. In general any multidisk problem of the form

Minimize the  $H_{\infty}$ -norm of one closed-loop transfer matrix subject to upper bounds on the  $H_{\infty}$ -norms of other closed-loop transfer matrices

is a convex programming problem.

The solution of the problem using qdes proceeds as follows. A stable coprime factorization of  $P_0$  as  $P_0 = ND^{-1}$  with XN + YD = I, taken from [TP88], is

$$N(s) = \left(\frac{s-2}{s+6}\right); \quad D(s) = \left(\frac{s-12}{s+6}\right);$$

$$X(s) = 1.8$$
; and  $Y(s) = -0.8$ .

The set of achievable stable closed-loop transfer matrices from the exogenous input vector  $\begin{bmatrix} d & r \end{bmatrix}^T$  to the regulated variable vector  $\begin{bmatrix} z_1 & z_2 \end{bmatrix}^T$  can be parametrized as

$$\{T_1 + T_2QT_3 : Q \text{ stable}\}$$

where the parameter Q is a SISO transfer function and  $T_1$ ,  $T_2$ , and  $T_3$  are stable transfer matrices of appropriate sizes computed from the coprime factorization as shown in [BBB\*88]. The compensator corresponding to a given parameter Q is

$$K = (X + DQ)(Y - NQ)^{-1}.$$

The version of qdes available to solve this problem is for use with discrete-time systems, so the problem is converted to an equivalent discrete-time problem by mapping the  $j\omega$ -axis in the S-plane on to the unit circle in the z-plane with the substitution (bilinear transformation)  $s=20\left(\frac{z+1}{z-1}\right)$ . The solution space is made finite-dimensional by assuming that the optimal parameter Q(z) is closely approximated by a finite impulse response (FIR) filter with 20 taps.

The fragment of qdes source code found below shows how the problem is specified to qdes.

This fragment specifies the objective and constraint; the dimensions of the problem and the values of  $T_1$ ,  $T_2$ , and  $T_3$  must also be specified. The output of qdes is a list of the FIR filter coefficients corresponding to the optimal Q(z).

For the two-disk problem, qdes finds a 20-tap Q which satisfies the constraint. The objective function value for the approximation to the two-disk problem is 0.1864. Increasing the number of taps in the FIR filter Q(z) to 40 and 80 does not significantly improve the solution; this gives some confidence that the solution based on the 20-tap Q(z) is very nearly optimal. The compensator K(z) obtained from Q(z) is a 23rd-order stable compensator, which has a 20th-order minimal realization. The Hankel singular values of K(z) are

$$1.427, 1.371, 0.821, 0.040, 0.033, \ldots$$

It seems likely that the compensator model can be reduced to third-order, and this turns out to be the case. Using simple balance-and-truncate model reduction a third-order compensator was obtained that performed as well as the original 20th-order design. The application of the substitution (inverse bilinear transformation)  $z = \left(\frac{3+20}{3-20}\right)$  gives the compensator

$$K(s) = -1.5345 \frac{(s-0.084796)(s^2+1.5166s+35.658)}{(s+0.86685)(s^2+1.3714s+24.576)}$$

With this compensator

$$||W_1(I+P_0K)^{-1}||_{\infty}=0.1995$$

and

$$||W_2 P_0 K (I + P_0 K)^{-1}||_{\infty} = 0.9929.$$

For comparison, the "approximate solution" in [TP88] has

$$||W_1(I+P_0K)^{-1}||_{\infty} = 0.7998$$

and

$$\|W_2P_0K(I+P_0K)^{-1}\|_{\infty}=1.$$

#### 3 Conclusion

While there are no known analytical techniques for solving general multidisk problems, many multidisk problems are susceptible to effective numerical solutions.

#### References

[BBB\*88] S. Boyd, V. Balakrishnan, C. Barratt, N. Khraishi, X. Li, D. Meyer, and S. Norman. A new CAD method and associated architectures for linear controllers. *IEEE Trans. Aut. Control*, AC-33(3):268-283, March 1988.

- [BH79] J. Ball and W. Helton. Interpolation with outer functions and gain equalization in amplifiers. In International Symposium on Mathematical Theory of Networks and Systems (Delft University of Technology, The Netherlands), page 41, 1979.
- [DS81] J. C. Doyle and G. Stein. Multivariable feedback design: Concepts for a classical/modern synthesis. *IEEE Trans. Aut. Control*, AC-26(1):4-16, February 1981.
- [Kwa85] H. Kwakernaak. Minimax frequency domain performance and robustness optimization of linear feedback systems. IEEE Trans. Aut. Control, AC-30(10):994-1004, October 1985.
- [OF86] S. D. O'Young and B. A. Francis. Optimal performance and robust stabilization. Automatica, 22(2):171-183, 1986.
- [TP88] T. Ting and K. Poolla. Upper bounds and approximate solutions for multidisk problems. *IEEE Trans. Aut. Control*, AC-33(8):783-786, August 1988.
- [Zam81] G. Zames. Feedback and optimal sensitivity: Model reference transformations, multiplicative seminorms. and approximate inverses. *IEEE Trans. Aut. Control*, AC-26(2):301-320, April 1981.