**ENEE 664: Optimal Control (3 credits)** Spring 2012 Tu Th 12:30pm -1:45pm CSI 2118 Instructor: **P. S. Krishnaprasad**, Dept. of Electrical & Computer Engineering & Institute for Systems Research, UNIVERSITY OF MARYLAND, College Park, MD 20742, USA. Tel: (301)405-6843; email: krishna@umd.edu. **Office Hours:** M 4:00 – 6:00; Tu 5:10 – 7:00 (AVW 2233).

In this course, we cover the basics of the theory of optimization of continuous time, finite dimensional control systems. We begin with the problem of linear systems with quadratic cost functionals, solving it by use of the matrix Riccati system. We then sketch the elements of calculus in Banach spaces to state and prove the basic theorems of equality-constrained optimization. We follow this with a discussion of optimization in the presence of inequality constraints. This is followed by an introduction to the calculus of variations and its relation to problems of optimal control. This leads to questions of numerical computation of optimal solutions, and we develop the basic algorithms of the subject – gradient and Newton methods. We then derive the second order necessary conditions of the calculus of variations as a point of departure for the intuitive development of Pontryagin's maximum principle (PMP) that governs the necessary conditions for an optimal control. Finally we give an outline of the theory of sufficient conditions and the Hamilton-Jacobi-Bellman equations. Through various stages in the course optimal controls will be discussed in open loop and feedback forms, and the relationships between these forms will be highlighted. Connections to Lagrangian and Hamiltonian mechanics will be brought out. (See detailed breakdown of the material on a roughly weekly basis given in the next page.)

**Optional Topics:** Numerical methods (unconstrained; constrained; linear programming; interior point methods, MATLAB tools; calculus of variations and integrable problems of optimal control; dynamic programming; solution to certain combinatorial optimization problems by differential equations of gradient type, singular optimal control and higher order necessary conditions.

**Course Prerequisite:** Math 410 and ENEE 660 (can be waived by instructor consent). **Topic Prerequisite:** Advanced calculus (at least Math 410 or equivalent; Math 411 preferred); linear system theory or linear forced ordinary differential equations (mostly time-domain aspects).

**References**: Course Notes posted at <a href="http://www.ece.umd.edu/class/enee664.S2012/">http://www.ece.umd.edu/class/enee664.S2012/</a> and additional references indicated there.

**Grading:** Weekly homework sets will be collected and graded. Submit individual work but discussions of homework problems are encouraged. There will be two mid-term examinations and a final examination: (i) first mid-term on **Tuesday, March 6** (in class, closed book); (ii) second mid-term on **Thursday, April 12** (in class, closed book) moved to **TUESDAY, MAY 1**; (iii) final examination during **Thursday May 17** – **Sunday May 20** (take home, open book, no discussion).

The breakdown in weighting towards the final grade will be: homework 10%, mid-terms 25% each, and finals 40%.

## **Statement about Honor Code**

The University of Maryland, College Park has a nationally recognized Code of Academic Integrity, administered by the Student Honor Council. This Code sets standards for academic integrity at Maryland for all undergraduate and graduate students. As a student you are responsible for upholding these standards for this course. It is very important for you to be aware of the consequences of cheating, fabrication, facilitation, and plagiarism. For more information on the Code of Academic Integrity or the Student Honor Council, please visit <a href="http://www.shc.umd.edu/">http://www.shc.umd.edu/</a>

## **Policy on Classroom Environment**

It is of utmost importance to maintain a classroom environment conducive to focus on and attention to instruction. Hence usage of electronic devices (music equipment, cell phones, text messaging devices and computers) is disallowed during regular class hours.

**ENEE 664 Optimal Control (Spring 2012)** – Detailed course outline (by P. S. Krishnaprasad). See current version of lecture notes available at website for the course. The breakdown given below encapsulates the notes.

- 1. Linear systems and quadratic optimal control basics of linear systems, controllability, gramians, **optimal transfer of state**; the problem of time-optimal control and the bangbang principle.
- 2. Fixed end-point and free end-point problems of linear-quadratic optimal control; path independence lemma and Riccati differential equations; dynamic programming and principle of optimality.
- 3. Adjoint equations; linear Hamiltonian systems and Riccati equations; **application** to free boundary linear-quadratic optimal control problems and **data fitting**.
- 4. **Application**: Derivation of the Kalman-Bucy filter as the solution to a dual optimal control problem.
- 5. Calculus on linear spaces not necessarily finite dimensional; norms, induced norms, convergence, completeness; Gateaux and Fre'chet derivatives; constrained extrema of a functional on linear space the case of **equality constraints**; Lagrange multiplier theorem.
- 6. Curves in finite dimensional linear spaces, path functionals, and the **calculus of variations**; necessary conditions for fixed end-point problems and the Euler-Lagrange equations; Legendre transform and Hamilton's equations; conservation laws; Noether's theorem.
- 7. Free end-points and transversality; use of the Lagrange multiplier theorem in the calculus of variations; **applications -** Wirtinger type inequalities; isoperimetric inequality; **Dido's problem**; image analysis.
- 8. Iterative algorithms and contraction mapping fixed point theorem; **optimization problems with inequality constraints.**
- 9. Newton's method for solving nonlinear equations; main convergence theorem; applications to solving optimization problems.
- 10. Newton's method, convergence rate and comparison with gradient descent method; stopping rules for gradient methods; conjugate gradient method.
- 11. Second order necessary conditions for minimization; Taylor's formula with remainder; second order sufficient conditions; second order necessary conditions in the calculus of variations; **strengthened Legendre condition**; **conjugate points and sufficiency**; another route to Riccati equations.
- 12. **Pontryagin's** maximum principle, an introduction; Hamilton's equations; **applications** to time-optimal control, brachistochrone problem; extensions to game theory and equation of **Isaacs**.
- 13. Sufficiency in optimal control and the Hamilton-Jacobi-Bellman equation; verification theorem; specialization to the linear-quadratic setting.
- 14. A brief discussion of vistas ahead.