

# Topology of Optimal Control Landscapes for Classical Mechanical Systems

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- **Control chemical systems** by passing them through an electric field.
- **Optimize** reaction yield, drive molecule to target energy level, etc.
- Shape the electric field to achieve this goal, assuming system follows **dynamical equations**.
  - Dynamical equations can be classical or quantum.
  - Previous work assumes **quantum mechanics** (Schrödinger's equation).
  - I assume **classical mechanics** (Hamilton's equations).



Image from Professor Herschel Rabitz, Princeton University, CHM 510, Fall 2010.

# Optimal Control Formulation

- Assume some chemical system with **specified goal** at final time  $T$ .
  - Use a **cost functional**  $J$  to specify the goal.
  - Let  $z(t)$  denote the state of the system at time  $t$ , a  $2n \times 1$  vector.
  - Let  $\epsilon(t)$  be the control field at time  $t$ .

$$\min J = F(z(T)) \quad (1)$$

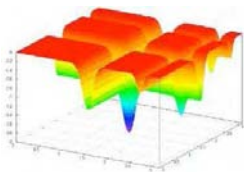
$$\text{s.t. } \dot{z} = f(z(t), \epsilon(t)) \quad (2)$$

$$z(0) = z_0 \quad (3)$$

- For instance,  $F = z(T)^T z(T)$ .
- Dynamic equation  $f$  either Schrödinger's equation or Hamilton's equations.
- An optimal control history  $\epsilon$  produces  $z(T)$  that **globally minimizes**  $J$ .

# Search Algorithms and Quantum Results

- Compute optimal fields using **optimal control theory**.
- Start with an initial field and use **gradient search**.
- Problem with gradient search: gets stuck in local minima.



- Assume **fully controllable systems**: with appropriate control, can get from given initial state to any final state at time  $T$ .
- In controllable **quantum systems**, gradient search never gets stuck.
- **What about controllable classical mechanical systems?**

**Gradient of the cost functional** with respect to the control:

$$\frac{\delta J}{\delta \epsilon(t)} = \frac{\partial J}{\partial z(T)} \frac{\delta z(T)}{\delta \epsilon(t)} \quad (4)$$

- At **critical points**, this equation is 0 for all  $t$ .
- Also assume **regularity**:  $\left\{ \frac{\delta z(T)}{\delta \epsilon(t)} \mid t \in [0, T] \right\}$  is surjective.
- In other words, this infinite set of vectors, indexed by time, contains  $2n$  **linear independent vectors**.
- Then since  $\frac{\partial J}{\partial z(T)}$  is independent of  $t$  in (4), at critical points  $\frac{\delta J}{\delta \epsilon(t)} = 0$ .

# Classical Analysis: Defining the Cost Functional

From the previous slide, we have

$$\frac{\partial J}{\partial z(T)} = 0. \quad (5)$$

- Define an **observable**  $O$ , a function of the state (e.g.  $O = z$ ).
- Let  $O$  be an  $r \times 1$  vector-valued function.
- Suppose we want this observable to reach a **target value**  $O_t$ .

Then define

$$J = [O(z(T)) - O_t]^T [O(z(T)) - O_t]. \quad (6)$$

Taking the derivative, (5) gives

$$2[O(z(T)) - O_t]^T \frac{\partial O}{\partial z} = 0. \quad (7)$$

# Critical Points as Global Minima

From the previous slide,

$$2[O(z(T)) - O_t]^T \frac{\partial O}{\partial z} = 0. \quad (8)$$

Note that  $[O(z(T)) - O_t]^T$  is a  $1 \times r$  vector and  $\frac{\partial O}{\partial z}$  an  $r \times 2n$  matrix.

- Suppose  $M = \frac{\partial O}{\partial z}$  is an  $r$ -rank matrix.
- Then  $MM^T$  is an  $r \times r$  matrix of rank  $r$ , and therefore invertible.

$$2[O(z(T)) - O_t]^T \frac{\partial O}{\partial z} M^T (MM^T)^{-1} = 0 M^T (MM^T)^{-1}, \quad (9)$$

so

$$[O(z(T)) - O_t]^T = 0, \text{ i.e. } O(z(T)) = O_t \quad (10)$$

and  $J$  is **globally minimized**.

- For instance, target states or scalar  $O$ .

# Numerical Example

- State  $z = (q, p)$ : position and momentum.
- Target and final states  $(q, p) = (0,0)$  and  $(1.728e-5, -4.50e-6)$ .

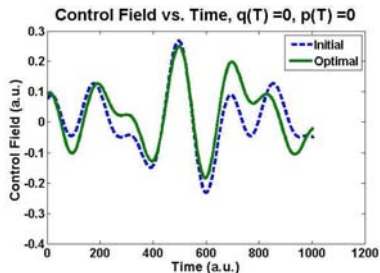


Figure: Control field evolution.

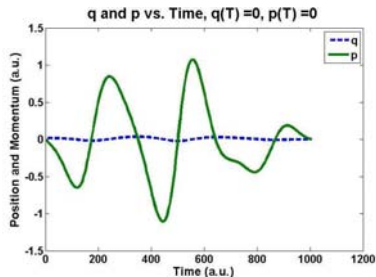


Figure: Final position and momentum trajectories.



- Lots of **other numerical simulations**—none revealed a local trap!
  - Multi-particle systems.
  - Scalar objective.
  - Partial target state (e.g. target  $q$  but no target  $p$ ).
- **Hessian derivation and analysis**: very similar to quantum expressions.
- Preliminary study of **singular (non-regular) controls**.
- Currently studying **non-deterministic systems**: initial state spread over a probability distribution.

## Future research directions:

- Singular controls.
- Infinite-dimensional systems.
- Non-controllable systems: these have traps on the quantum side.



# Questions?

Image from Wikipedia, [http://en.wikipedia.org/wiki/File:Laser\\_play.jpg](http://en.wikipedia.org/wiki/File:Laser_play.jpg). Taken by Jeff Keyzer, San Francisco, CA