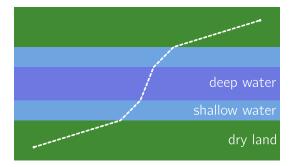
Symmetry in Optimal Control

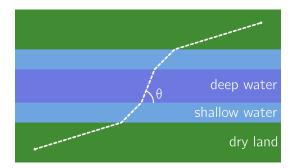
Christopher Gadzinski University of Coimbra

August 26, 2022

▲□▶ ▲□▶ ▲ 三▶ ▲ 三▶ 三三 - のへぐ

• Optimization problem: crossing a river.





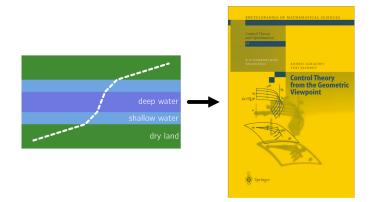
Solution (Snell's law): over an optimal path,

$$\frac{\cos(heta)}{V} = ext{constant}.$$

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ □臣 ○のへ⊙

Claim: this is implied by the problem's horizontal symmetry.

Let's consider the perspective of optimal control...



Optimal Control

- A control system on M is a family $(X_u)_{u \in U}$ of vector fields.
- We want a control function $u: [0, T] \rightarrow U$ solving

maximize
$$F(q(T))$$

subject to
$$\begin{cases} q(0) = q_0 \\ \dot{q}(t) = X_{u(t)}(q). \end{cases}$$

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

This is the Mayer problem of optimal control.

• Given a self-diffeomorphism $Q: M \to M$, define the pullback

$$Q^*\colon T^*M o T^*M$$

 $Q^*(p)=(dQ(\pi(p))^*)^{-1}(p)$

The Hamiltonian lift is the derivative of the pullback operation:

$$\begin{array}{c} \operatorname{Aut}(M) & \xrightarrow{} \operatorname{pullback} & \operatorname{Aut}(T^*M) \\ \stackrel{\operatorname{exp}}{ } & \stackrel{\uparrow}{ } \stackrel{\operatorname{exp}}{ } \\ D(M) & \xrightarrow{} \operatorname{Hamiltonian lift} & D(T^*M) \end{array}$$

• If ϕ^t is the flow of X, then $(\phi^t)^*$ is the flow of \overline{X} . In coordinates.

$$\overline{X} = X_i \frac{\partial}{\partial q_i} - p_j \frac{\partial X_j}{\partial q_i} \frac{\partial}{\partial p_i}.$$

.

Theorem (PMP) Suppose $q: [0, T] \rightarrow M$ is a solution to the Mayer problem

maximize
$$F(q(T))$$

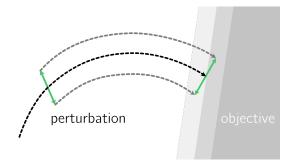
subject to
$$\begin{cases} q(0) = q_0 \\ \dot{q} = X_u(q). \end{cases}$$

Then there exists a path λ : $[0, T] \rightarrow T^*M$ so that $\pi \circ \lambda = q$ and the following conditions hold:

▲□▶ ▲□▶ ▲□▶ ▲□▶ ■ ● ●

- 1. The adjoint system: $\dot{\lambda} = \overline{X_u}(\lambda)$.
- 2. Maximality: $\dot{q} = X_u(q)$ maximizes $\langle p, \dot{q} \rangle$.
- 3. Transversality: $\lambda(T) = dF(q(T))$.

Suppose the control u is modified at a particular moment t. Then the trajectory is perturbed, affecting F(q(T)).



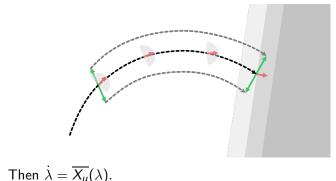
First-order optimality condition: u is chosen so that $\langle dF(q(T)), d\phi_t^T(\dot{q}) \rangle$ is maximized.

Rewrite in terms of pullback of dF(q(T)):

 $\langle dF(q(T)), d\phi_t^T(\dot{q}) \rangle = \langle (\phi_T^t)_*(dF(q(T))), \dot{q} \rangle$

▲□▶ ▲□▶ ▲ 三▶ ▲ 三▶ 三 のへぐ

• Let $\lambda(t) = (\phi_T^t)_*(dF(q(T))).$



Definition A curve $(p, q) = \lambda \in T^*M$ is **extremal** when $\dot{\lambda} = \overline{X_u}(\lambda), \quad \langle p, \dot{q} \rangle = \max_{u \in U} \langle p, X_u(\lambda) \rangle$

at (almost) all instants.

 Slogan: solutions to optimal control problems are projections of extremal curves.

・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・

- The Pontryagin maximum principle seems to involve the vector fields $\overline{X_u}$...
- ... but our control problem only depends on the sets

$$V(q) = \{X_u(q) : u \in U\}.$$

・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・
 ・

- Two families X_u and Y_u giving the same sets V(q) are called feedback- or gauge-equivalent.
- Can we describe extremal curves in terms of the sets V(q)?

The Maximized Hamiltonian

Definition The maximized Hamiltonian $H: T^*M \to \mathbb{R}$ is defined by

$$H(q,p) = \sup_{v \in V(q)} \langle p, v \rangle.$$

Theorem (Well-known)

If H is everywhere differentiable and λ is extremal, then

$$\dot{\lambda} = (dH(\lambda))^{\#}$$

almost everywhere.

The Maximized Hamiltonian

Theorem (Generalization)

If λ is extremal, then

$$\dot{\lambda} \in \partial_{C} H(\lambda)^{\#}$$

almost everywhere.

Proof.

Consider an instant t at which

$$\begin{cases} \dot{\lambda} = \overline{X_u}(\lambda) \\ \langle p, X_u(q) \rangle = \sup_{u^* \in U} \langle p, X_{u^*}(q) \rangle = H(\lambda). \end{cases}$$

Define $H_u = \langle -, X_u \rangle$. Then $H_u(\lambda) = H(\lambda)$ and $H_u \leq H$ everywhere. So $dH_u(\lambda) \in \partial_C H(\lambda)$, and

$$\dot{\lambda} = \overline{X_u}(\lambda) = dH_u(\lambda)^\# \in \partial_C H(\lambda)^\#.$$

- ロ ト - 4 目 ト - 4 目 ト - 1 - 9 へ ()

The Maximized Hamiltonian

Corollary

The maximized Hamiltonian H is conserved over extremal curves.

Corollary

If Y is a vector field that respects velocity sets, meaning

$$\forall t, de^{tY}(V(p)) = V(e^{tY}(p)),$$

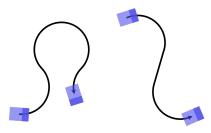
then $H_Y = \langle Y, - \rangle$ is conserved over extremal curves.

 Similar to Conservation Laws in Optimal Control, Delfim Torres, 2002.

▲□▶ ▲□▶ ▲□▶ ▲□▶ ▲□ ● ● ●

Example: Curves of Bounded Curvature

- What are the shortest curves of **bounded curvature** with prescribed initial and final directions?
- In two dimensions: optimal control of a car.



▲□▶ ▲□▶ ▲□▶ ▲□▶ □ のQで

Example: Curves of Bounded Curvature

• Let
$$M = \mathbb{R}^n \times \mathbb{R}^n$$
 and

$$V(x,\theta) = \{(\theta, v) : \langle v, \theta \rangle = 0, \|v\| = 1\}.$$

• Let (p_x, p_θ) be the costate variables. For an extremal curve,

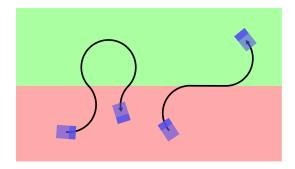
$$\begin{cases} \dot{x} = \theta \\ \dot{\theta} = \operatorname*{argmax}_{\{\boldsymbol{v}: \langle \boldsymbol{v}, \theta \rangle = 0\}} \langle \boldsymbol{p}_{\theta}, \boldsymbol{v} \rangle & \begin{cases} \dot{\boldsymbol{p}}_{x} = 0 \\ \dot{\boldsymbol{p}}_{\theta} = \dots \end{cases} \end{cases}$$

• By translational symmetry, p_x is constant.

b By **rotational symmetry**, $p_x \wedge x + p_{\theta} \wedge \theta$ is constant.

Curves of Bounded Curvature

▶ In two dimensions, $p_{\theta} \land \theta = -p_x \land x + C$ has a simple interpretation.



Further Generalizations

What about the Mayers problem

maximize
$$F(q(T))$$

subject to
$$\begin{cases} q(0) = q_0 \\ \dot{q}(t) \in V(q(t))? \end{cases}$$

▲□▶ ▲□▶ ▲目▶ ▲目▶ 目 のへで

- ► The maximized Hamiltonian may be *discontinuous*...
- Is there still a first-order optimality theory?

Further Generalizations

The PMP can be derived from a Lagrange multipliers approach, using the Lagrangian function

$$\mathcal{L}(q,p) = F(q(T)) + \int_0^T \langle p, \dot{q} - X_u \rangle dt.$$

It is natural to pass to the Hamiltonian action

$$\mathcal{L}(q,p) = F(q(T)) + \int_0^T \langle p, \dot{q}
angle - H(q,p) \, dt.$$

- Generalized Hamiltonian Mechamics, J. E. Marsden, 1968
- The dynamical laws governing extremal trajectories are more complicated, but Noether's theorem is preserved.

Example: Crossing a River

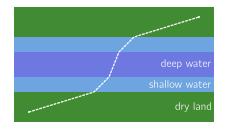
• Let
$$V(x, y) = \{ \dot{q} : ||\dot{q}|| \le v(y) \}.$$

• Then
$$H(x, y, p_x, p_y) = v(y) ||(p_x, p_y)||$$
.

▶ Since *H* and *p*_× are conserved quantities,

$$\frac{p_x}{H} = \frac{p_x}{v(y) \| (p_x, p_y) \|} = \frac{\cos(\theta)}{v(y)}$$

is conserved along an extremal curve and hence along an optimal trajectory.



▲□▶ ▲□▶ ▲ 三▶ ▲ 三▶ 三 のへぐ