Time inconsistent stochastic control

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9th colloquium on Backward Stochastic Differential Equations and Mean-Field Systems, Annecy, June 27, 2022.

Motivating example Time-inconsistency Three approaches

Outline

1 The big picture

- Motivating example
- Time-inconsistency
- Three approaches

2 What is an equilibrium?

- In discrete-time, (almost) all is well
- Not so much in continuous-time...

3 Main results

- An extended DPP
- The characterising BSDE system
- Verification theorem
- Extensions

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Motivating example

• You receive an invitation to your first talk on a new subject a month from now.

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What we should take home from this: human beings have time-depending and slightly inconsistent preferences.

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The basic problem

• On space (Ω, \mathcal{F}) , let \mathbb{P}^{ν} be a weak solution to the controlled SDE

$$X_t = x + \int_0^t b_r(X_{r\wedge \cdot}, \nu_r) \mathrm{d}r + \int_0^t \sigma_r(X_{r\wedge \cdot}) \mathrm{d}W_r, \ t \in [0, T].$$

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• The reward functional

$$\mathbf{v}(t,\nu) := J(t,t,\nu) = \mathbb{E}^{\mathbb{P}^{\nu}} \left[\int_{t}^{T} f_{r}(t,X_{r\wedge\cdot},\nu_{r}) \mathrm{d}r + F(t,X_{T\wedge\cdot}) \middle| \mathcal{F}_{t} \right].$$

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• Control problem: because of the dependence in *t*, classical dynamic programming arguments fail (unless for exponential discounting of course). What to do?

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The three approaches

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- Assume precomittment: solve the maximisation problem

 $\sup_{\nu} J(0,0,\nu),$

and obtain an "optimal" action ν^* . However, in general ν^* will fail to be optimal if one maximises $J(t, t, \nu)$ for t > 0 (Karnam, Ma, Zhang, Zhou,...)

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• Take time-inconsistency seriously: consider a non-cooperative game, where the agent plays against future versions of himself, and look for sub-game perfect Nash equilibria (Barro, Czichowsky, Ekeland, Laibson, Lazrak, Pollak, Privu, Strotz, Zhou,...)

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Equilibria in discrete-time

Perfectly understandable situation. If $(t_i)_{0 \le i \le n}$ is a partition of [0, T]

• Given actions played by Player 0,..., and Player t_{n-2} , Player t_{n-1} faces a standard optimisation problem.

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- Player t_{n-2} can solve the problem faced by Player t_{n-1} and obtains a Stackelberg equilibrium, using the optimal response of Player t_{n-1} in his own optimisation.

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Equilibria in continuous-time

Definition [Ekeland, Lazrak (2008)]

 u^{\star} is an equilibrium if for any $(t, \nu) \in [0, T) imes \mathcal{V}$

$$\liminf_{\ell \to 0} \frac{J(t,t,\nu^{\star}) - J(t,t,\nu^{\ell})}{\ell} \geq 0,$$

where for $\ell \in [0, T - t]$, ν^{ℓ} is given by

 $\nu_r^{\ell} := \mathbf{1}_{\{t \le r < t+\ell\}} \nu_r + \mathbf{1}_{\{t+\ell \le r \le T\}} \nu_r^{\star}.$

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- Not completely satisfying, when liminf is 0.
- Not a 'local' property.

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Equilibria in continuous-time (2)

Definition [Hernández, P. (2019)]

 ν^* is an equilibrium if for any $\varepsilon > 0$ there exists $\ell_{\varepsilon} > 0$ such that for any $(t, \nu, \tau) \in [0, T) \times \mathcal{V} \times \mathcal{T}_{t, t+\ell_{\varepsilon}}$

 $J(t, t, \nu^{\star}) \geq J(t, t, \nu^{\tau}) - \varepsilon \tau.$

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• Definition is roughly speaking the same as before: ε -equilibrium. .

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Literature review

• Large literature in discrete-time. In continuous-time, mostly specific models, solved on a case-by-case basis.

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- Ekeland, Lazrak and Pirvu introduced an extended HJB equation allowing for verification-type results: any smooth solution to the equation allows to construct an equilibrium.
- Extended by Björk, Khapko, and Murgoci to general Markovian diffusion models.
- However, extended HJB equation only justified formally by passing to the limit in discrete-time models.
- Different from classical control problems, where HJB equation and optimal controls are intimately linked.

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An extended DPP The characterising BSDE system Verification theorem Extensions

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An extended DPP

Theorem [Hernández, P. (2019)]

If ν^* is an equilibrium then

$$\mathbf{v}(\mathbf{0},\nu^{\star}) = \sup_{\nu \in \mathcal{V}} \mathbb{E}^{\mathbb{P}^{\mathcal{V}}} \left[\mathbf{v}(\tau,\nu^{\tau}) + \int_{\mathbf{0}}^{\tau} \left(f(r,r,\mathsf{X}_{r\wedge\cdot},\nu_{r}) - \frac{\partial F}{\partial s}(r) - \int_{r}^{T} \frac{\partial f}{\partial s}(r,u,\mathsf{X}_{r\wedge\cdot},\nu_{u}^{\star}) \mathrm{d}u \right) \mathrm{d}r \right].$$

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HJB BSDE system

Define the Hamiltonian

 $\begin{aligned} H_t(x,z) &:= \sup_{a \in A} h_t(t,x,z), \ h_t(s,x,z,a) := f_t(s,x,a) + b_t(x,a) \cdot z, \\ \nu_t^*(x,z) &:= \operatorname{argmax}_{a \in A} h_t(t,x,z,a). \end{aligned}$

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$$\nu_t^*(x, z) := \operatorname{argmax}_{a \in A} h_t(t, x, z, a).$$

Extended DPP relates value of the agent at equilibrium to

$$\begin{cases} Y_t = F(T, X_{\cdot \wedge T}) + \int_t^T (H_r(X, Z_r) - \partial Y_r^r) \mathrm{d}r - \int_t^T Z_r \cdot \mathrm{d}X_r, \\ Y_t^s = F(s, X_{\cdot \wedge T}) + \int_t^T h_r(s, X, \nu_r^*(X_{r \wedge \cdot}, Z_r), Z_r^s) \mathrm{d}r - \int_t^T Z_r^s \cdot \mathrm{d}X_r, \end{cases}$$

where

$$\partial Y_t^s := \frac{\partial}{\partial_s} Y_t^s$$

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HJB BSDE system (2)

• For exponential discounting $f_s(t, x, a) = e^{-\delta(s-t)}\tilde{f}(s, x, a)$, we have $\partial Y_t^s = -\delta Y_s \implies$ no coupling and classical HJB BSDE.

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- This is the non-Markovian version of the non-local PDE system derived first by Ekeland and Lazrak (2008).

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- This is the non-Markovian version of the non-local PDE system derived first by Ekeland and Lazrak (2008).
- Earlier contributions argued by passing informally to the limit from discretetime. Thanks to our extended DPP

Theorem [Hernández, P. (2019)]

If ν^* is an equilibrium, then there exists a solution to the BSDE system, and necessarily $\nu^* = \nu^*(X, Z)$.

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Verification theorem

Theorem [Hernández, P. (2019)]

If there exists a sufficiently integrable solution to the BSDE system, then $\nu^*(X, Z)$ is an equilibrium,

$$Y_t^s = J(s, t, \nu^*), \text{ and } Y_t = v(t, \nu^*).$$

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- Non-Markovian extension of earlier results (Ekeland and Lazrak, Björk et al., Wei et al.).
- Under mild conditions (Lipschitz + integrability) can prove wellposedness of the BSDE system

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Extensions

• Extension to controlled volatility: 2BSDE system instead of BSDE system. Verification, and DPP still hold. But need more regularity to produce equilibria.

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Extensions

- Extension to controlled volatility: 2BSDE system instead of BSDE system. Verification, and DPP still hold. But need more regularity to produce equilibria.
- More general time-inconsistency

$$J(t, t, \mathbb{M}) := \mathbb{E}^{\mathbb{P}^{\nu}} \left[\left| \int_{t}^{T} f(t, r, X_{r \wedge \cdot}, \nu_{r}) \mathrm{d}r + G(t, X_{T \wedge \cdot}) \right| \mathcal{F}_{t} \right] + F\left(t, \mathbb{E}^{\mathbb{P}^{\nu}} \left[h(X_{T \wedge \cdot}) | \mathcal{F}_{t} \right] \right),$$

including mean-variance: system of 3 coupled (2)BSDEs (need to add $\mathbb{E}^{\mathbb{P}^{\nu}}[h(X_{T\wedge \cdot})|\mathcal{F}_t]$ as a state).

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• Link between the BSDE system and BSVIEs: family $(Y^s, Z^s)_{s \in [0, T]}$ solves a type-I extended BSVIE.

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- Link between the BSDE system and BSVIEs: family $(Y^s, Z^s)_{s \in [0, T]}$ solves a type-I extended BSVIE.
- using standard arguments to prove existence to the system leads to new wellposedness results for BSVIEs themselves.

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The big picture An extended DPP The characterising BSDE syste What is an equilibrium? Verification theorem Extensions

Thank you for your attention!

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