

Duality of Markov processes with respect to a function

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Background

Duality is a useful tool in a variety of areas – e.g., [random walks with absorbing / reflecting barriers](#), [queuing theory](#) FELLER, ASMUSSEN, [diffusions](#), [interacting particle systems](#) LIGGETT, [hydrodynamic limits](#), [population genetics](#)...

Basic idea: in order to understand the long-time behavior of some complicated process, follow a simpler, *dual* process backwards in time.

Related: [duality wrt a measure](#) (potential theory HUNT '57-58).
General theory available.

Question: general theory for duality wrt a function?

Outline

1. Duality with respect to a measure
2. Duality of linear operators. Existence and uniqueness
3. Spectrum
4. Convex geometry: cone duality.
5. Quantum mechanics

Definition

- ▶ E and F Polish spaces (Borel σ -algebra).
- ▶ (X_t) and (Y_t) Markov processes with state spaces E and F
- ▶ $H : E \times F \rightarrow \mathbb{R}$ bounded, measurable (**duality function**).

(X_t) and (Y_t) are **dual with respect to the function H** if for all $t > 0$, $x \in E$ and $y \in F$,

$$\mathbb{E}_x H(X_t, y) = \mathbb{E}^y H(x, Y_t)$$

\mathbb{E}_x : (X_t) started in x , \mathbb{E}^y : (Y_t) started in y .

In terms of the semi-groups (P_t) and (Q_t) :

$$\int_E P_t(x, dx') H(x', y) = \int_F Q_t(y, dy') H(x, y')$$

Finite state spaces: matrix equation (A^T : transposed)

$$P_t H = H Q_t^T.$$

Special case: $H = \text{diag}(1/\mu(x))$:

$$\mu(x) P_t(x, y) = \mu(y) Q_t(y, x).$$

Duality wrt measure \approx duality wrt diagonal function.

Pathwise duality

Fix a time horizon $T > 0$, starting points $x \in E$, $y \in F$. Dual processes can be defined on common probability space so that $X_0 = x$, $Y_0 = y$ \mathbb{P} -a.s. and

$$\forall t \in [0, T]: \quad \mathbb{E}H(x, Y_T) = \mathbb{E}H(X_t, Y_{T-t}) = \mathbb{E}H(X_T, y).$$

= **weak pathwise duality**. Often, processes can be coupled in such a way that

$$\forall t \in [0, T]: \quad H(x, Y_T) = H(X_t, Y_{T-t}) = H(X_T, y) \quad \mathbb{P}\text{-a.s.}$$

= **strong pathwise duality**. Examples:

- ▶ $H(x, y) = \mathbf{1}(x \leq y)$ on **totally ordered spaces** CLIFFORD, SUDBURY '85:

$$\forall t \in [0, T]: \quad x \leq Y_T \Leftrightarrow X_t \leq Y_{T-t} \Leftrightarrow X_T \leq y. \quad \mathbb{P}\text{-a.s.}$$

- ▶ **Interacting particle systems with “graphical representations”**.
- ▶ **Stochastic recursions**: common “driving sequence” (W_n), recurrence relations

$$X_{n+1} = f(X_n, W_n), \quad Y_{n+1} = g(Y_n, W_{T-n}).$$

Ex. random walks, $W_n = \text{“up” or “down”}$ LINDLEY '52, books by FELLER, ASMUSSEN.

Duality with respect to a measure

Discrete state spaces: if $\mu(x) > 0$ for all x and (P_t) and (Q_t) are time reversals of each other wrt μ , then $H(x, y) = \frac{1}{\mu(x)}\delta_{x,y}$ is a duality function. What about continuous state spaces?

Definition: μ σ -finite measure on $E = F$. Processes $(X_t), (Y_t)$ with semi-groups $(P_t), (Q_t)$ and resolvents $(R_\lambda), (\hat{R}_\lambda)$ are in duality wrt μ if

- ▶ For all $\lambda, x, y, R_\lambda(x, \cdot)$ and $\hat{R}_\lambda(x, \cdot)$ are abs. cont. wrt. μ .
- ▶ For all λ and $f, g \geq 0, \int_E (P_t f) g d\mu = \int_E f (Q_t g) d\mu$.

Theorem Let $(P_t), (Q_t)$ be in duality wrt μ . Write

$$R_\lambda(x, dy) = r_\lambda(x, y)\mu(dy), \quad \hat{R}_\lambda(x, dy) = r_\lambda(y, x)\mu(dy)$$

Functions $y \mapsto r_\lambda(x, y)$ and $x \mapsto r_\lambda(x, y)$ λ -excessive wrt (R_λ) resp. (\hat{R}_λ) . Then for all $\lambda > 0, r_\lambda(x, y)$ is a duality function for $(X_t), (Y_t)$.

BLUMENTHAL, GETTOOR: *Markov processes and potential theory*.

Duality of linear operators

Question: Relation with notions of duality in functional analysis?

Natural framework: dual pairs / duality wrt bilinear form.

Def.: V, W vector spaces. Bilinear form $\langle \cdot, \cdot \rangle : V \times W \rightarrow \mathbb{R}$ called non-degenerate if right null space is trivial

$$\mathcal{N}_R = \{w \in W \mid \forall v \in V : \langle v, w \rangle = 0\} = \{0\}$$

and left null space is trivial. $(V, W, \langle \cdot, \cdot \rangle)$ is a *dual pair*.

Linear operators $S : V \rightarrow V, T : W \rightarrow W$ are dual wrt $\langle \cdot, \cdot \rangle$ if

$$\forall v \in V \forall w \in W : \langle Sv, w \rangle = \langle v, Tw \rangle.$$

Notion useful in study of weak topologies, locally convex vector spaces. s

Application to duality of Markov processes

- ▶ $\mathcal{M}(E)$ = finite signed Borel measures on E .
- ▶ Bilinear form associated with H :

$$B_H : \mathcal{M}(E) \times \mathcal{M}(F) \rightarrow \mathbb{R}, \quad B_H(\mu, \nu) := \int_{E \times F} H(x, y) \mu(dx) \nu(dy).$$

- ▶ $(P_t^* \mu)(A) = (\mu P_t)(A) = \int_E \mu(dx) P_t(x, A)$.

Observation: Markov semi-groups (P_t) and (Q_t) dual wrt H iff

$$\forall t > 0 \quad \forall \mu \in \mathcal{M}(E) \quad \forall \nu \in \mathcal{M}(F) : \quad B_H(P_t^* \mu, \nu) = B_H(\mu, Q_t^* \nu).$$

H duality function for $(P_t), (Q_t) \Leftrightarrow (P_t^*), (Q_t^*)$ dual wrt bilinear form B_H .

Question: Given: (P_t) and H , existence of a dual Markov semi-group (Q_t) ?
Uniqueness?

Uniqueness

Functional analysis fact: The dual of a given operator with respect to a non-degenerate bilinear form is unique.

Consequence: if B_H is **non-degenerate** then the **dual**, if it exists, **is unique**.

Applies to a lot of common duality functions:

- ▶ Siegmund dual: $H(x, y) = \mathbf{1}(x \leq y)$, $x, y \in \mathbb{R}$.
- ▶ Moment dual: $H(x, n) = x^n$, $x \in [0, 1]$, $n \in \mathbb{N}_0$.
- ▶ Laplace dual: $H(x, \lambda) = \exp(-\lambda x)$, $\lambda, x \in [0, \infty)$.

Uniqueness in moment problems, injectivity of the Laplace transform.

Remark: Connection with **kernel identities** used in **integrable quantum systems** (Toda, Calogero-Moser systems) related to Doob h -transforms / **non-colliding processes**. Non-degeneracy does not come for free.

RUIJSENAARS '13 *On positive Hilbert-Schmidt operators*

Functional analysis fact: Every bounded operator in a Hilbert space has a unique adjoint. Every bounded operator in a Banach space has a unique dual operator. But: for general dual pairs, a given operator need not have a dual (need continuity in suitable weak topology...)

Consequence: semi-group (P_t^*) need not have a dual semi-group of operators $T_t : \mathcal{M}(F) \rightarrow \mathcal{M}(F)$.

Additional problem: dual operator semi-group need not come from a Markov semi-group – need to know whether $(T_t\nu)(A) = \int_F \nu(dy)Q_t(y, B)$ for Markov semi-group (Q_t) .

Existence and uniqueness criteria available for Siegmund duality in totally ordered state spaces (stochastic monotonicity). Generalization?

Key: invariance of convex sets MÖHLE.

Existence, continued

$\mathcal{M}(F)$ = signed Borel measures, $\mathcal{M}_{1,+}(F)$ = probability measures. Images

$$\mathcal{V} = \left\{ \int_F H(\cdot, y) \nu(dy) \mid \nu \in \mathcal{M}(F) \right\} \subset L^\infty(E)$$

$$\mathcal{V}_{1,+} = \left\{ \int_F H(\cdot, y) \nu(dy) \mid \nu \in \mathcal{M}_{1,+}(F) \right\} \subset \mathcal{V}.$$

Analogous subsets $\mathcal{W}_{1,+} \subset \mathcal{W} \subset L^\infty(F)$.

Finite state spaces: linear / convex combinations of rows / columns of H .

Proposition Let E and F be countable, discrete state spaces and P a $E \times E$ stochastic matrix. Then

1. $PH = HQ^T$ has a solution $Q = (Q(x, y))_{x, y \in F}$ with $\sum_z |Q(y, z)| < \infty$ for all y iff \mathcal{V} is invariant.
2. Q can be chosen as a stochastic matrix iff $\mathcal{V}_{1,+}$ is invariant.

Siegmund duality $H(x, y) = \mathbf{1}(x \leq y)$ in totally ordered state spaces: $\mathcal{V}_{1,+}$ = monotone increasing functions. Recover known relationship Siegmund duality / stochastic monotonicity.

Existence, continued

In continuous time and space, more delicate – Chapman-Kolmogorov and measurability issues, theorems for non-degenerate H given by MÖHLE.

Convex combination of the columns of H :

$$\mathcal{V}_{1,+} = \left\{ \int_F H(\cdot, y) \nu(dy) \mid \nu \in \mathcal{M}_{1,+}(F) \right\} \subset L^\infty(E).$$

Theorem E, F locally compact, $H : E \times F \rightarrow \mathbb{R}$ continuous, non-degenerate. Then

- ▶ (P_t) has a H -dual Markov semi-group if and only if $\mathcal{V}_{1,+}$ is invariant.
- ▶ The dual (Q_t) is unique.
- ▶ The dual is a Feller semi-group if and only if (P_t) is.

Example: moment duality.

Spectrum

Finite state spaces: if $P_t H = H Q_t^T$ and H is invertible, then P_t and Q_t have the same eigenvalues.

In infinite state spaces, **non-degenerate duals need not have the same spectrum.**

Unless processes are reversible!

Theorem: (P_t) , (Q_t) dual with non-degenerate duality function H . Assume that (X_t) and (Y_t) have symmetrizing measures μ and ν . Then (P_t) and (Q_t) , as operators in $L^2(E, \mu)$ and $L^2(F, \nu)$, are unitarily equivalent. In particular, same spectrum.

Convex geometry & cone dual: definitions

KLEBANER, RÖSLER, SAGITOV '07, MÖHLE '11:
duality wrt a *convex set* rather than a function.

Simplex in \mathbb{R}^n : non-empty convex, compact set such that every point in C is a **unique convex combination** of its extremal points $\text{ex}C$.

Choquet simplex: generalization to locally convex vector spaces; bijection simplex \leftrightarrow probability measures on $\text{ex}C$, **unique integral representation**.
Characterization via partial order defined by cone $\{\lambda f \mid f \in C, \lambda \geq 0\}$.

Proposition B_H non-degenerate, $H \in C_0(E \times F)$, F compact $\Rightarrow \mathcal{V}_{1,+} \subset C_0(E)$
compact (topology of uniform convergence), Choquet simplex.

Def. $C \subset L^\infty(E)$ simplex, invariant under (P_t) . **Cone dual** is process (R_t) with **state space $\text{ex}C$** , duality fct

$$E \times \text{ex}C \rightarrow \mathbb{R}, \quad (x, e) \mapsto e(x).$$

Observation: for **non-degenerate B_H** , bijection $F \rightarrow \text{ex}C$, $y \mapsto H(\cdot, y)$, **cone dual and usual dual can be identified**.

Cone dual vs. usual dual. Lifts and intertwining

More interesting: B_H degenerate but $\mathcal{V}_{1,+}$ simplex. For $y \in F$, let $\Pi(y, \cdot)$ be the unique probability measure on $\text{ex}\mathcal{V}_{1,+}$ such that

$$H(\cdot, y) = \int_{\text{ex}\mathcal{V}_{1,+}} \Pi(y, de)e(\cdot).$$

Transition kernel from F to “smaller” space $\text{ex}\mathcal{V}_{1,+}$.

Theorem $H \in C_0(E \times F)$, F compact, $\mathcal{V}_{1,+}$ simplex, invariant under (P_t) .

1. The cone dual (R_t) exists and is unique. It is defined on $\text{ex}\mathcal{V}_{1,+}$ (Borel σ -algebra, uniform topology); $\text{ex}\mathcal{V}_{1,+}$ is Polish.
2. (P_t) has at least one dual Markov semi-group (Q_t) .
3. (Q_t) is dual to (P_t) iff for all t, y, B

$$\int_F Q_t(y, dy') \Pi(y', B) = \int_{\text{ex}\mathcal{V}_{1,+}} \Pi(y, de) R_t(e, B).$$

Intertwining relation. Usual duals are lifts of the cone dual.

In terms of processes: cone dual (Z_t) , usual dual (Y_t) satisfy

$$\mathbb{P}(Z_t \in B \mid Y_t = y) = \Pi(y, B).$$

Quantum mechanics

Definition: H self-adjoint operator (**Hamiltonian**) in Hilbert space \mathcal{H} . (P_t) Markov semi-group in Polish state space E , symmetrizing σ -finite measure μ , $U : \mathcal{H} \rightarrow L^2(E, \mu)$ unitary. Call $((P_t), E, \mu, U)$ a **stochastic representation** of H if

$$\forall t > 0 : \exp(-tH) = U^* P_t U.$$

Examples: **Ornstein-Uhlenbeck process** vs. **harmonic oscillator**, **simple symmetric exclusion process** vs. **Heisenberg spin chain**.

Earlier theorem, rephrased If two reversible processes with non-degenerate duality function are associated with Hamiltonians H_1 and H_2 , then H_1 and H_2 are unitarily equivalent.

Strategy:

- ▶ interpret **infinitesimal generator** L as **quantum Hamiltonian** H .
- ▶ **Interacting particle systems** / **quantum many-body systems**:
Break down transitions into **birth** and **death** of particles / **creation** and **annihilation operators**.
- ▶ Look for different representations of the relevant operator algebra.
- ▶ Often, this yields unitary equivalences and interesting dualities.

More flexible application: relax requirement of self-adjointness, reversibility.

GIARDINA's talk!

Further aspects & conclusion

- ▶ Generalized definition allowing for **Feynman-Kac corrections**.
- ▶ Solutions of martingale problems.
- ▶ Dualities and **scaling limits**.
SWART '06, ALKEMPER, HUTZENTHALER '07,
J., KURT '12
- ▶ **Intertwining** of Markov processes
DIACONIS, FILL '90, CARMONA, PETIT, YOR '98; HUILLET, MARTINEZ '11.
- ▶ Duality for interacting particle systems as **Fourier transforms** on groups
HOLLEY, STROOCK '79.

Conclusion: A lot of structure to explore.

Invariant subsets for Siegmund and moment duality

Convex subset $\mathcal{V}_{1,+} \subset L^\infty(E)$:

$H(x, y)$	$x \in E$	$y \in F$	$\mathcal{V}_{1,+} = \{\int_F H(\cdot, y)\nu(dy) \mid \nu \in \mathcal{M}_{1,+}(F)\}$
$\mathbf{1}(x \leq y)$	$x \in \mathbb{R}$	$y \in \mathbb{R}$	monotone increasing, right-continuous functions f , $\lim_{-\infty} f = 0$, $\lim_{+\infty} f = 1$
x^n	$x \in [0, 1]$	$n \in \mathbb{N}_0$	absolutely monotone functions f w. $f(1) = 1$

Linear subspace $\mathcal{V} \subset L^\infty(E)$:

$H(x, y)$	$x \in E$	$y \in F$	$\mathcal{V} = \{\int_F H(\cdot, y)\nu(dy) \mid \nu \in \mathcal{M}(F)\}$
$\chi(x \leq y)$	$x \in \mathbb{R}$	$y \in \mathbb{R}$	bounded, right-continuous functions f with bounded variation , $\lim_{-\infty} f = 0$, $\lim_{+\infty} f \in \mathbb{R}$
x^n	$x \in [0, 1]$	$n \in \mathbb{N}_0$	functions $f \in C([0, 1])$ with analytic extension F to the complex open unit disk, F in positive Wiener algebra ($\subset H^\infty$ Hardy space).