Duality in Logic and Computation

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Panangaden (McGill University)

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Introduction

Examples of duality principles

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- Controllability and observability in control theory, Kalman.
- Many examples from semantics and logic.

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- The two mathematical universes are *mirror images* of each other.
- Two completely different sets of theorems that one can use.

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- Labelled Markov processes and *C**-algebras with operators. [Mislove, Ouaknine, Pavlovic, Worrell]

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- Compositions are preserved or reversed.
- This is functoriality.
- From this one can often conclude *invariance properties*.

The need for Category Theory

Duality categorically



Given

$$A \in \mathcal{C}$$

$$\downarrow_{f}$$

$$B \in \mathcal{C}$$

We get



and

$$A \in \mathcal{C} \qquad F(A) \in \mathcal{D}$$

$$\downarrow^{f} \qquad F(f) \uparrow^{*}$$

$$B \in \mathcal{C} \qquad F(B) \in \mathcal{D}.$$

Similarly, given

 $C \in \mathcal{D}$ \bigvee_{g} $D \in \mathcal{D}$

We get

$$G(C) \in \mathcal{C}$$
 $C \in \mathcal{D}$
 \downarrow^{g}
 $G(D) \in \mathcal{C}$ $D \in \mathcal{D}$

and

$$G(C) \in \mathcal{C}$$
 $C \in \mathcal{D}$
 $\left| \begin{array}{c} G(g) \\ G(D) \in \mathcal{C} \end{array} \right|_{g}$
 $C \in \mathcal{D}.$

Isomorphisms

We have isomorphisms

```
A \simeq G(F(A)) and C \simeq F(G(C)).
```

Stone-type Duality

We have a (contravariant) adjunction between categories C and D, which is an *equivalence* of categories.

Often obtained by looking at maps into an object living in both categories: a schizophrenic object.
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- *V** has the same dimension as *V* and a (basis-dependent) isomorphism between *V* and *V**.
- The double dual V** is also isomorphic to V
- with a "nice" canonical isomorphism: $v \in V \mapsto \lambda \sigma \in V^*.\sigma(v)$.

$$U \xrightarrow{\theta} V$$

$$U^* \prec_{\theta^*} V^*$$

Given a linear maps θ between vector spaces U and V we get a map θ^* in the opposite direction between the dual spaces:

$$\theta^*(\sigma \in V^*)(u \in U) = \sigma(\theta(u)).$$

Boolean algebras

A Boolean algebra is a set *A* equipped with two constants, 0, 1, a unary operation $(\cdot)'$ and two binary operations \vee, \wedge which obey the following axioms, *p*, *q*, *r* are arbitrary members of *A*:

$$0' = 1 \qquad 1' = 0$$

$$p \land 0 = 0 \qquad p \lor 1 = 1$$

$$p \land 1 = p \qquad p \lor 0 = p$$

$$p \land p' = 0 \qquad p \lor p' = 1$$

$$p \land p = p \qquad p \lor p = p$$

Boolean algebras II

$$p'' = p$$

$$(p \land q)' = p' \lor q'$$

$$(p \lor q)' = p' \land q'$$

$$p \land q = q \land p$$

$$p \lor q = q \lor p$$

$$p \land (q \land r) = (p \land q) \land r$$

$$p \lor (q \lor r) = (p \lor q) \lor r$$

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The operation \lor is called *join*, \land is called *meet* and $(\cdot)'$ is called *complement*. Maps are Boolean algebra homomorphisms.

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Duality in Logic and Computation

(Toy) Stone duality



Here \mathcal{P} is power-set and \mathcal{A} takes the *atoms* of a Boolean algebra.

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- Many, but not all, Stone spaces are Polish.

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- Continuous maps $f : S_1 \to S_2$ between Stone spaces give Boolean algebra homomorphisms $f^{-1} : Cl(S_2) \to Cl(S_1)$.

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- Continuous maps *f* : S₁ → S₂ between Stone spaces give Boolean algebra homomorphisms *f*⁻¹ : C*l*(S₂) → C*l*(S₁).
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- Everything that can, and should be, an isomorphism is an isomorphism.

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- Denotational semantics: compositional, equivalent to operational semantics.

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- *D* and *E* domains, viewed as topological spaces, open sets: \mathcal{O}_D and \mathcal{O}_E . A **predicate transformer** is a *strict, continuous and multiplicative* map $p : \mathcal{O}_E \to \mathcal{O}_D$.
- Relate predicate-transformer semantics to state-transformer semantics: Jaco De Bakker (1978).
- Duality: The category of state transformers is equivalent to the (opposite of) the category of predicate transformers: Plotkin (1979).

Duality for probabilistic programs: Kozen

Probabilistic programs and expectation transformers: Kozen (1981)

Logic	Probability
States s	Distributions μ
Formulas P	Random variables f
Satisfaction $s \models P$	Integration $\int f d\mu$

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- Terms are described by axiomatizing satisfaction. A modal logic of programs.
- The two interpretations are Stone duals.
- Ties together semantics, logic and verification.

Chu spaces: Pratt

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- Pratt's observation: many interesting categories embed in Chu categories.
- Stone duality is "transposition" of matrices.

Many other contributors

- Bart Jacobs,
- Achim Jung and Drew Moshier
- Mai Gehrke, Jean-Eric Pin, ...
- Bezhanishvilis

Brzozowski's strange algorithm

Brzozowski's Algorithm 1964

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- This gives the minimal DFA recognizing the same language!
- The intermediate step can blow up the size of the automaton exponentially before minimizing it.
- But experimental results seem to indicate that it often works well in practice.

- *M* = (S, A, O, δ, γ): a deterministic finite (Moore) automaton. S is the set of states, A an input alphabet (actions), O is a set of observations.
- $\delta: S \times A \rightarrow S$ is the state transition function.
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- which means that reachability makes no sense.
- We will worry about that in a minute.

A Simple Modal Logic

View O as propositions, define a simple modal logic. A formula φ is:

$$arphi ::== \omega \in \mathcal{O} \mid (a) arphi$$

where $a \in A$.

- We say $s \models \omega$, if $\omega \in \gamma(s)$ (or $\gamma(s, \omega) = T$). We say $s \models (a)\varphi$ if $\delta(s, a) \models \varphi$.
- Now we define $\llbracket \varphi \rrbracket_{\mathcal{M}} = \{ s \in S | s \models \varphi \}.$

Thinking logically

An Equivalence Relation on Formulas

- We write *sa* as shorthand for $\delta(s, a)$.
- Define $\sim_{\mathcal{M}}$ between *formulas* as $\varphi \sim_{\mathcal{M}} \psi$ if $\llbracket \varphi \rrbracket_{\mathcal{M}} = \llbracket \psi \rrbracket_{\mathcal{M}}$.

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- Equivalence class for φ same as of states $\llbracket \varphi \rrbracket_{\mathcal{M}}$ that satisfy φ .

A Dual Automaton

- Given a finite automaton *M* = (S, A, O, δ, γ).
 Let *T* be the set of ~_M-equivalence classes of formulas on *M*.
- We define $\mathcal{M}' = (S', \mathcal{A}, \mathcal{O}', \delta', \gamma')$ as follows:
- $S' = T = \{\llbracket \varphi \rrbracket_{\mathcal{M}} \}$
- $\mathcal{O}' = S$
- $\delta'(\llbracket \varphi \rrbracket_{\mathcal{M}}, a) = \llbracket (a) \varphi \rrbracket_{\mathcal{M}}$
- $\gamma'(\llbracket \varphi \rrbracket_{\mathcal{M}}) = \llbracket \varphi \rrbracket_{\mathcal{M}}$ or $\gamma'(\llbracket \varphi \rrbracket_{\mathcal{A}}, s) = (s \models \varphi).$

The intuition

Interchange states and observations.

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- For deterministic machines bisimulation is the same as trace equivalence.
- This gives an intuition for why Brzozowski's algorithm works,
- but it does not really address the role of reachability properly.

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- Dual automaton from tests: probabilistic analogues of modal formulas.
- Main point: not minimization, but can learn systems from data even when the state is not directly observable
- because the double-dual serves as a substitute for the original machine.

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- Double dual: state can be regarded as the summary of the outcomes of experiments.
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- We know that machines are co-algebras and logics are algebras but
- why is the dual another automaton?

• Our automata are coalgebras of the following functor:

 $F(S) = S^{\mathcal{A}} \times \mathbf{2}^{\mathcal{O}}, \ F(f: S \to S') = \lambda \langle \alpha : \mathcal{A} \to S, \ O \subseteq \mathcal{O} \rangle. \langle f \circ \alpha, \ \mathcal{O} \rangle.$

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• The category of these coalgebras is called **PODFA**.

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 $F(S) = S^{\mathcal{A}} \times \mathbf{2}^{\mathcal{O}}, \ F(f: S \to S') = \lambda \langle \alpha : \mathcal{A} \to S, \ O \subseteq \mathcal{O} \rangle. \langle f \circ \alpha, \ \mathcal{O} \rangle.$

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- with *S*: states, A: actions, O: observations, δ is a transition function and γ is an observation function.
- They are well known as Moore machines.

Homomorphisms

A homomorphism for these coalgebras is a function $f : S \rightarrow S'$ such that the following diagram commutes:



where $f^{\mathcal{A}}(\alpha) = f \circ \alpha$.

This translates to the following conditions:

$$\forall s \in S, \omega \in \mathcal{O}, \ \omega \in \gamma(s) \iff \omega \in \gamma'(f(s))$$
(1)

and

$$\forall s \in S, a \in \mathcal{A}, f(\delta(s, a)) = \delta'(f(s), a).$$
(2)

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- the usual operations \land , \neg and constants T and \bot and, in addition,
- together with unary operators (a) and constants $\underline{\omega}$.
- We denote an object by $\mathcal{B} = (B, \{(a) | a \in \mathcal{A}\}, \{\underline{\omega} | \omega \in \mathcal{O}\}, \mathsf{T}, \land, \neg).$

Equations

The following three equations hold:

$$(a)(b_1 \wedge b_2) = (a)b_1 \wedge (a)b_2,$$
 (3a)

$$(a)\mathsf{T}=\mathsf{T},$$
 (3b)

$$\neg(a)\neg b = (a)b. \tag{3c}$$

Morphisms

The morphisms are the usual boolean homomorphisms preserving, in addition, the constants and the unary operators.

Duality Theorem

There is a dual equivalence of categories

PODFA^{op} \cong **FBAO**.

One functor \mathcal{P} is just the contravariant power set functor and the other one \mathcal{H} maps a boolean algebra to its set of atoms.

Minimization?

• Obviously, if we have an equivalence of categories we get the same machine back when we go back and forth.

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- Obviously, if we have an equivalence of categories we get the same machine back when we go back and forth.
- So how do we explain the minimization?

Definable Subsets

Define a logic ${\mathcal L}$ by

$$\phi ::== \mathsf{T}|\bot|\phi_1 \wedge \phi_2|\neg \phi|(a)\phi|\underline{\omega}$$

and define the **definable subsets** $\mathcal{D}(S)$ of a machine $\mathcal{M} = (S, \delta, \gamma)$ as sets of the form $\llbracket \phi \rrbracket$.

• $\mathcal{D}(S)$ is a subobject of $\mathcal{P}(\mathcal{M})$

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- in fact it is the *smallest* possible subalgebra and
- any other subalgebra must contain $\mathcal{D}(S)$.

In Pictures

 $\mathcal{M} \longrightarrow \mathcal{P}(\mathcal{M})$









The categorical picture of automata duality

The Secret of Minimization



Why did the minimization work with just the logic

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 $\phi ::== \underline{\omega} | (a) \phi?$

- With this logic the definable subsets *E*(*S*) do not form a boolean algebra,
- it is just a "set with operations"
- in other words, it can be viewed as an automaton!

Why the simpler logic works

For deterministic automata we can flatten formulas like

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- Thus for **deterministic** automata the boolean algebra generated by E(S) is just the same as D(S) so the minimization picture works with boolean algebra generated by E(S).
- For nondeterministic automata the story is different.

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- To really get the system with the fewest states one needs to deal with reachability.
- The following discussion is a rapid version of what Jan Rutten discussed in his beautiful MFPS talk on Monday.

An automaton in diagrams



- Here *S* is the state space, *A* is the set of actions, 1 is the one-element set and 2 is a two-element set.
- The map *i* defines an initial state and *f* defines a set of final states. I will write *i* for the map and for the initial state itself.
- the transition function $\delta : S \times A \to S$ has been written as $\delta : S \to S^A$.
- There is a natural extension $\delta^* : S \to S^{A^*}$.

A very special (infinite) automaton

$$\begin{array}{c}1\\\downarrow\varepsilon\\A^*\\\downarrow\alpha\\A^*)^A\end{array}$$

- This automaton has all words as its state space.
- The initial state is the empty word ε .
- The transition function α acts by $\alpha(w) = \lambda a : A.w \cdot a$.
- We do not bother to define "final" states in this machine.



• Given any function between sets $f : V \to W$, we have a map $f^A : V^A \to W^A$, given by $f^A(\phi) = \lambda a : A \cdot f(\phi(a)) = f \circ \phi$.



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- There is a *unique* map $r : A^* \to S$ such that $r(\varepsilon) = i$ and $\delta(r(w))(a) = r(w \cdot a)$, which can easily be defined inductively.



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- The image of A^{*} under r is exactly the reachable subset of S.
- The entire state space is *reachable* exactly when *r* is a surjection.
- Note, final states play no role.

Panangaden (McGill University)

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- It is the unique map making the upper triangle and the lower square commute.
- Think of *o* as giving the observable behaviour of a state.
- A machine is *observable* exactly when distinct states recognize different languages, i.e. when *o* is an injection.

Panangaden (McGill University)

Duality in Logic and Computation

The butterfly



A deterministic automaton (S, δ, i, f) is minimal if it is both reachable and observable.

The power-set functor

Given sets U, V and a function $f: U \to V$ we define

 $\mathcal{P}(f): \mathcal{P}(V) \to \mathcal{P}(U)$

by

$$\mathcal{P}(f)(P \subseteq V) = f^{-1}(P).$$

Reverse functorially

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Reverse functorially

- The power-set functor produces the reversed determinized automaton.
- Initial becomes final under powerset. The final state S → 2 becomes the new initial state by observing that such a function is the same thing as a subset.
- It makes reachable into observable, but not vice versa.

Why Brzozowski's algorithm works

Theorem

If (S, δ, i, f) is a reachable deterministic automaton accepting *L*, then $(2^S, 2^{\delta}, f, 2^i)$ is an observable deterministic automaton accepting rev(L).

If, we take its reachable part again and reverse it again we again get an observable automaton this time recognizing L. If we take the reachable part we get a minimal automaton recognizing L.

Abstract nonsense?

• Channeling my inner Moshe:

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- "Surely, this is categorical mumbo-jumbo for something that can be explained simply!"

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- Exactly the same construction can be used in other settings by just changing the duality at work.
- Moore automata work by changing the functor slightly.
- Kleene algebra with tests.
- Weighted automata (i.e. automata over vector spaces) can be minimized by using the same idea with the self duality of vector spaces.
- Belief automata can be minimized using Gelfand duality.

Problem in undergrad algebra courses: Given the ring of continuous real-valued functions defined on a compact Hausdorff space *X*, call this *C*(*X*), show that for every maximal ideal *M* there is an *x* ∈ *X* such that

$$M = \{ f \in C(X) \mid f(x) = 0 \}.$$

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What is Gelfand duality?

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- C(X) is more than a ring it is a *commutative, unital* C^* -algebra.
- Incidentally, this works just as well with complex-valued functions.

C*-algebras

- A (complex) C*-algebra is a (complex) vector space with
- an associative multiplication (satisfying obvious laws)
- and a norm ||·|| with respect to which it is complete (hence a Banach space).
- The norm satisfies: $||a \cdot b|| \le ||a|| \cdot ||b||$.
- There is also an involution * satisfying $(ab)^* = b^*a^*$ and $(\alpha a)^* = \overline{\alpha}a^*$.
- The crucial property is:
- $||a^*a|| = ||a||^2$.
- Morphisms are homomorphisms preserving the *.
- We say that *A* is *unital* if there is a unit element for the multiplication.

Gelfand duality

The category of commutative unital C^* -algebras is dually equivalent to the category of compact Hausdorff spaces.

It does not matter if the C^* algebras are complex (Gelfand) or real (Stone); though the proofs are very different.

• A probabilistic automaton with observations is

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- Minimization via Stone duality → minimization via Gelfand duality.

Conclusions

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- Duality tells one how to move between logics and transition systems.
- Completeness theorems, which typically work by constructing transition systems from consistent sets of formulas embody a key aspect of duality results *but*,
- the arrow part of the duality is crucial for proving our minimization results.

Ongoing and Future Work

• Unify the BKP picture with the BBHPRS picture: BBBHKKPRS unified picture in progress.

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- Metric analogue of Stone duality: Mardare and Kozen.
- Pressing research topic of great interest in quantum information theory: what is the duality theory for *non-commutative C**-algebras?: Tobias Fritz.

Thank you!