### Reflections

on

### **Finite Model Theory**

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## What is finite model theory?

It is the study of logics on classes of finite structures.

### Logics:

- □ First-order logic FO and various extensions of FO:
  - Fragments of second-order logic SO.
  - Logics with fixed-point operators.
  - Logics with generalized quantifiers.

#### Classes of finite structures:

- All finite structures  $\mathbf{A} = (A, R_1, ..., R_m)$  over a fixed vocaculary.
- □ All ordered finite structures  $\mathbf{A} = (A_1, <, R_1, ..., R_m)$ .
- Restricted classes of finite structures of combinatorial or of algorithmic interest (trees, planar graphs, partial orders, ...).

## Contrast with traditional focus of logic

Study of logics on the class of all structures

### **Gödel's Completeness Theorem**

Truth in FO on the class of all (finite & infinite) structures

- Study of logics on a fixed infinite structure
  - **Gödel's Incompleteness Theorem**

Truth in FO on the structure  $\mathbf{N} = (N, +, x)$  of the integers

Tarski's Theorem

Truth in FO on the structure  $\mathbf{R} = (R, +, x)$  of the reals.

## **Brief History**

- Late 1940s to 1970:
  - Early scattered results and problems about FO in the finite.
- Early 1970s to present:
  - Steady development of finite model theory in its own right.
  - Extensive interaction with computational complexity, database theory, asymptotic combinatorics, automated verification, constraint satisfaction.
- Finite model theory has had a constant presence in LICS.
  - At least five times the Kleene Award for Best Student Paper has been given for work in finite model theory.

## Aims of this Talk

To reflect on finite model by

- Highlighting some of its successes;
- Examining obstacles that were encountered;
- Discussing some open problems that have resisted solution.
- This talk is

#### neither

- a comprehensive survey of finite model theory nor
- a "personal perspective" on the development of finite model theory.

## Early Beginnings: a theorem and two problems.

Theorem: Trakhtenbrot – 1950

First-order finite validities **cannot** be axiomatized:

The set of finitely valid first-order sentences is **not** recursively enumerable.

- "Anti-completeness" theorem
- Sharp contrast with Gödel's Completeness Theorem: first-order validities can be axiomatized.

## The Spectrum Problem

#### **Definition:**

A set S of positive integers is a spectrum if there is a FO-sentence  $\phi$  such that

 $S = \{m: \phi \text{ has a finite model with } m \text{ elements } \}$ 

**Example:** The set of all powers of primes is a spectrum.

#### **The Spectrum Problem**

- Scholz 1952: Characterize all spectra
- Asser 1955: Are spectra closed under complement? Is the complement of a spectrum a spectrum?

### Preservation under Substructures

#### Theorem: Łoś- Tarski – 1948

If a FO-sentence  $\psi$  is preserved under substructures on all (finite and infinite) structures, then there is a universal FO-sentence  $\psi$ \* that is equivalent to  $\psi$  on all structures.

#### Conjecture: Scott and Suppes – 1958

The Łoś- Tarski Theorem holds in the finite: If a FO-sentence  $\psi$  is preserved under substructures on all finite structures, then there is a universal FO-sentence  $\psi^*$ that is equivalent to  $\psi$  on all finite structures.

## Main Themes in Finite Model Theory

#### Descriptive complexity:

computational complexity vs. uniform definability.

#### • Expressive power of logics in the finite:

What **can** and what **cannot** be expressed in various logics on classes of finite structures.

# Logic and asymptotic probabilities on finite structures 0-1 laws and convergence laws.

#### Classical Model theory in the finite:

Do the classical results of model theory hold in the finite?

## Notation and Terminology

- $\sigma$ : a fixed relational vocabulary {R<sub>1</sub>, ..., R<sub>m</sub>}
- **C**: a class of finite  $\sigma$ -structures closed under isomorphisms.
- A k-ary query on *C* is a mapping Q defined on *C* such that
  - □ If  $\mathbf{A} \in \mathbf{C}$ , then Q( $\mathbf{A}$ ) is a k-ary relation on A;
  - □ Q is invariant under isomorphisms: if f:  $\mathbf{A} \rightarrow \mathbf{B}$  is an isomorphism, then Q(**B**) = f(Q(**A**)).
- **Example:** TRANSITIVE CLOSURE of a graph **G** = (V,E)
- A Boolean query on *C* is a mapping Q: *C* → {0, 1} that is invariant under isomorphisms
- **Example:** CONNECTIVITY, 3-COLORABILITY, ...

## Complexity vs. Definability

- Computational complexity is concerned with the computational resources (model of computation, time, space) needed to compute queries.
- Logical definability is concerned with the logical resources (type of quantification, number of variables, operators extending the syntax of first-order logic, ...) needed to express queries.
- Descriptive complexity studies the connections between computational complexity and logical definability.

## **Descriptive Complexity**

### **Main Finding:**

All major computational complexity classes, including P, NP, and PSPACE, can be characterized in terms of definability in various logics on classes of finite structures.

- Reinforces the unity of computation and logic.
- Yields machine-independent characterizations of computational complexity classes.

## Descriptive Complexity: Characterizing NP

### **Theorem:** Fagin – 1974

Let F be the class of all finite  $\sigma$ -structures and let Q be a query on F. Then the following are equivalent:

- Q is is NP.
- Q is definable by an existential second-order formula  $\exists S_1 \dots \exists S_k \phi(S_1, \dots, S_k).$ In symbols, NP = ESO on **F**.

**Example:** 3-COLORABILITY of a graph (V,E) is definable by  $\exists B \exists R \exists G ((B,R,G) \text{ form a partition of V} \land \forall x \forall y (E(x,y) \rightarrow x, y \text{ are in different parts})).$ 

## Descriptive Complexity: Characterizing NP

**Corollary:** The following are equivalent:

- NP is closed under complement (i.e., NP = coNP).
- ESO is closed under complement on the class G of all finite graphs.
- NON 3-COLORABILITY is ESO-definable on *G*.

#### **Proof:**

Fagin's Theorem and NP-completeness of 3-COLORABILITY.

## **Descriptive Complexity & Spectrum Problem**

**Theorem:** Jones and Selman, Fagin – 1974.

The following are equivalent for a set S of positive integers in binary notation:

- S is a spectrum.
- S is in NEXPTIME.

**Corollary:** The following are equivalent:

- Spectra are closed under complement.
- NEXPTIME is closed under complement.

**Conclusion:** Asser's question is equivalent to a major open problem in computational complexity.

## Descriptive Complexity: Characterizing P

**Theorem:** Immerman – 1982, Vardi – 1982

Let  $\boldsymbol{O}$  be the class of all ordered finite  $\sigma$ -structures  $\mathbf{A} = (A, <, R_1, ..., R_m)$ and let Q be a query on  $\boldsymbol{O}$ . Then the following are equivalent:

- Q is in P.
- Q is definable in least-fixed point logic LFP.

In symbols, P = LFP on O.

**Note:** LFP = (FO + Least fixed-points of positive FO-formulas)

**Example:** The TRANSITIVE CLOSURE query is definable by the least fixed point of the FO-formula  $E(x,y) \lor \exists z(E(x,z) \land T(z,y))$ 

 $\mathsf{T}(\mathsf{x},\mathsf{y}) \ \equiv \ \mathsf{E}(\mathsf{x},\mathsf{y}) \lor \exists \ \mathsf{z}(\mathsf{E}(\mathsf{x},\mathsf{z}) \land \mathsf{T}(\mathsf{z},\mathsf{y}))$ 

## **Descriptive Complexity Results**

Two groups of results:

**Group I:** A complexity class (typically, NP or higher) can be characterized in terms of uniform definability in a logic on the class  $\boldsymbol{F}$  of all finite  $\sigma$ -structures (and, hence, on all subclasses of  $\boldsymbol{F}$ ).

**Group II:** A complexity class (typically, P or lower) can be characterized in terms of definability in a logic on the class  $\boldsymbol{O}$  of all ordered finite  $\sigma$ -structures  $\mathbf{A} = (A, <, R_1, ..., R_m)$ .

**Note:** LFP cannot express counting queries on *F* (eg., EVEN CARDINALITY).

## The Quest for a Logic for P

#### **Problem:** Chandra and Harel – 1982

Is there an effective enumeration of all polynomial-time computable queries on the class F of all finite  $\sigma$ -structures?

#### Conjecture: Gurevich – 1988

There is **no** logic that captures P on the class  $\boldsymbol{F}$  of all finite  $\sigma$ -structures.

#### Note:

If P = NP, then there is logic for P (namely, ESO).

## The Quest for a Logic for P

Has motivated numerous investigations in finite model theory:

- Systematic study of various extensions of first-order logic, including generalized quantifiers and fixed-point operators.
- Systematic development of tools to delineate the expressive power of extensions of first-order logic in the finite, such as Ehrenfeucht – Fraïssé games and their variants: Ehrenfeucht – Fraïssé games for ESO, pebble games, and games for logics with generalized quantifiers.

However,

Chandra and Harel's Problem and Gurevich's Conjecture remain outstanding open problems in finite model theory.

### **Restricted Classes of Finite Structures**

- Progressive shift of emphasis from the class of all finite structures to restricted classes of finite structures.
- Theorem: Let (IFP + C) be the extension of FO with inflationary fixed-points and counting quantifiers.
  - □ Grohe 1998
    - P = (IFP + C) on the class **P** of all planar graphs.
  - Grohe and Mariño 1999

P = (IFP + C) on the class T(k) of graphs of treewidth  $\leq k$ .

 Note: Deeper properties of the restricted classes are used to find an (IFP + C)-definable linear order on structures in the restricted class.

## Reflecting on Descriptive Complexity

#### **Early Optimism:**

- Descriptive complexity results reduce the separation of complexity classes to the separation of logics in the finite.
- Combinatorial games (Ehrenfeucht Fraïssé games and their variants) provide a sound and complete method for delineating the expressive power of logics in the finite.
- Use logic to resolve open problems in computational complexity.

**Example:** Recall that the following are equivalent:

- NP is **not** closed under complement (i.e., NP  $\neq$  coNP).
- NON 3-COLORABILITY is not ESO-definable on G.

## Reflecting on Descriptive Complexity

**Reality:** The implementation of this approach is confronted with seemingly insurmountable combinatorial obstacles.

 Combinatorial games have been successfully used to analyze the expressive power of monadic ESO

 $\exists S_1 \dots \exists S_k \phi(S_1, \dots, S_k)$ , where the  $S_i$ 's are unary symbols.

The expressive power of **binary** ESO is poorly understood.

#### Problem: Fagin – 1990

Prove or disprove that there is a query Q on graphs such that

- Q is ESO-definable.
- Q is **not** definable in binary ESO with a single existentially quantified binary symbol

 $\exists S \phi(S)$ , where S is a binary relation symbol.

## Reflecting on Descriptive Complexity

### **Reality:**

- The expressive power of FO on the class *F* of all finite structures is well understood.
- The expressive power of FO on classes of ordered finite structures  $\mathbf{A} = (A, <, R_1, ..., R_m)$  is **poorly** understood.

**The Ordered Conjecture:** K ... and Vardi – 1992 If C is a class of ordered finite structures of arbitrarily large cardinalities, then FO  $\neq$  LFP on C (i.e., FO  $\neq$  P on C).

**Note:** Either way of resolving the Ordered Conjecture has complexity-theoretic implications.

## Main Themes in Finite Model Theory

#### $\checkmark$ Descriptive complexity:

computational complexity vs. uniform definability.

#### $\checkmark$ Expressive power of logics in the finite:

What **can** and what **cannot** be expressed in various logics on classes of finite structures.

#### Logic and asymptotic probabilities on finite structures

0-1 laws and convergence laws.

#### **Classical Model theory in the finite:**

Do the classical results of model theory hold in the finite?

## Logic and Asymptotic Probabilities

#### Notation:

- Q: Boolean query on the class **F** of all finite structures
- $\Box$  **F**<sub>n</sub>: Class of finite structures of cardinality n
- $\square$   $\mu_n(Q) =$  Probability of Q on  $F_n$  with respect to  $\mu_n$ ,  $n \ge 1$ .
- **Definition:** Asymptotic probability of query Q  $\mu(Q) = \lim \mu_{n \to \infty}(Q)$  (provided the limit exists)
- **Examples:** For the uniform measure μ on finite graphs **G**:
  - $\square \quad \mu(\mathbf{G} \text{ contains a triangle}) = 1.$
  - $\square \quad \mu(\mathbf{G} \text{ is connected}) = 1.$
  - $\square \quad \mu(\mathbf{G} \text{ is 3-colorable}) = \mathbf{0}.$
  - $\square$   $\mu$ (**G** has even cardinality) does not exist.

## 0-1 Laws and Convergence Laws

**Question:** Is there a connection between the definability of a query Q in some logic L and its asymptotic probability?

**Definition:** Let L be a logic

- The 0-1 law holds for L w.r.t. to a measure  $\mu_n$ ,  $n \ge 1$ , if  $\mu(Q) = 0$  or  $\mu(Q) = 1$ , for every L-definable Boolean query Q.
- The convergence law holds for L w.r.t. to a measure μ<sub>n</sub>, n≥ 1, if μ(Q) exists, for every L-definable Boolean query Q.

## 0-1 Law for First-Order Logic

**Theorem:** Glebskii et al. – 1969, Fagin – 1972 The 0-1 law holds for FO w.r.t. to the uniform measure.

#### **Transfer Theorem:** Fagin – 1972

There is a unique countable graph **R** such that for every FO-sentence  $\psi$ , we have that  $\mu(\psi) = 1$  if and only if **R**  $\models \psi$ .

#### Note:

- R is Rado's graph: the unique countable, homogeneous, and universal graph.
- **R** is characterized by a set of first-order extension axioms.

## Decision Problem for 0-1 Law

**Problem:** Given a FO-sentence  $\psi$ , tell whether  $\mu(\psi) = 0$  or  $\mu(\psi) = 1$ .

#### Note:

- By the Transfer Theorem, this is equivalent to deciding first-order truth on **R**.
- Fagin's proof shows it is a decidable problem.

#### Theorem: Grandjean – 1983

The decision problem for the 0-1 law for FO is PSPACE-complete.

## FO Truth vs. FO Almost Sure Truth

Everywhere true (valid)

Somewhere true &

Somewhere false

Everywhere false (contradiction)

Almost surely true

Almost surely false

First-Order Truth Testing if a FO-sentence is true on all finite graphs is an undecidable problem.

#### Almost Sure First-Order Truth

Testing if a FO-sentence is **almost surely true** on all finite graphs is a **decidable** problem; in fact, it is PSPACEcomplete.

## Three Directions of Research on 0-1 Laws

0-1 laws for extensions of FO w.r.t. the uniform measure.

• 0-1 laws for FO on restricted classes of finite structures

• 0-1 laws on graphs under variable probability measures.

#### Fact:

The convergence law fails for ESO

- EVEN CARDINALITY is ESO-definable.
- Many natural NP-complete problems have probability 0 or 1:
  - 3-COLORABILITY
  - HAMILTONIAN PATH
  - SATISFIABILITY
  - KERNEL
  - **.**...

**Question:** Do 0-1 laws hold for fragments of ESO?

#### Idea:

Pursue 0-1 laws for fragments of ESO obtained by restricting the quantifier pattern in the FO-part  $\phi(S)$  of ESO-sentences  $\exists S \phi(S)$ .

### **Guiding Principle:** Skolem Normal Form for ESO: $\exists S \exists x \forall y \exists z \theta(S, x, y, z),$

where **S** is a tuple of SO-variables, **x**, **y**, and **z** are tuples of FO-variables, and  $\theta(S, x, y, z)$  is a quantifier-free formula.

Thus, it suffices to consider first-order prefix classes that are subclasses of  $\exists^* \forall^* \exists^*$ .

#### Theorem: K ... and Vardi – 1987

For every ESO( $\exists^* \forall^*$ )-sentence  $\psi$ , we have that  $\mu(\psi) = 1$  if and only if  $\mathbf{R} \models \psi$ .

• The 0-1 law holds for ESO( $\exists^* \forall^*$ ).

#### Theorem: K ... and Vardi – 1988

- For every ESO( $\exists^* \forall \exists^*$ )-sentence  $\psi$ , we have that  $\mu(\psi) = 1$  if and only if **R**  $\models \psi$ .
- The 0-1 law holds for ESO( $\exists^* \forall \exists^*$ ).

#### **Theorem:** Pacholski and Szwast – 1991 The convergence law fails for ESO( $\forall\forall\exists$ ).

ESO Fragment	0-1 Law	<b>Decision Problem</b>
ESO(∃*∀*)	Yes	NEXPTIME-complete
<b>ESO(</b> ∃*∀∃*)	Yes	NEXPTIME-complete
<b>ESO(</b> ∀∀∃)	Νο	Undecidable

#### **Classification Theorem:**

The Bernays-Schönfinkel Class  $\exists^* \forall^* \exists^*$  and the Ackermann Class  $\exists^* \forall \exists^*$  are the **only** prefix classes  $\Psi$  of FO such that the 0-1 law holds for the corresponding fragment ESO( $\Psi$ ) of ESO.

#### Note:

The Bernays-Schönfinkel Class  $\exists^* \forall^* \exists^*$  and the Ackermann Class  $\exists^* \forall \exists^*$  are the **only** prefix classes of FO (with equality) for which the satisfiability problem is decidable.

#### Theorem: Gödel – 1932

The satisfiability problem for the prefix class  $\forall \forall \exists$  without equality is decidable.

#### Theorem: Le Bars – 1998

The convergence law fails for ESO( $\forall\forall\exists$ ) without equality.

## Reflecting on 0-1 Laws

#### **On the positive side:**

- 0-1 laws are new phenomena that are meaningful only in the context of finite structures.
- Finiteness is a feature, not a limitation.
- The study of 0-1 laws gave rise to an extensive interaction between finite model theory and asymptotic combinatorics (genuine two-way interaction; e.g., 0-1 laws for restricted classes of finite structures: partial orders, clique-free graphs).

## Reflecting on 0-1 Laws

#### **On the negative side:**

The study of 0-1 laws had less interaction with and impact on computer science than other areas of FMT.

N. Immerman – 1999: 0-1 laws are "inimical to computation".

There was early speculation that the analysis of the asymptotic properties of logically definable queries may be useful in the average-case analysis of algorithms.

This early optimism and expectation remains largely unrealized.

## Main Themes in Finite Model Theory

#### ✓ Descriptive complexity:

computational complexity vs. uniform definability.

#### ✓ Expressive power of logics in the finite:

What **can** and what **cannot** be expressed in various logics on classes of finite structures.

## ✓ Logic and asymptotic probabilities on finite structures

0-1 laws and convergence laws.

#### Classical Model theory in the finite:

Do the classical results of model theory hold in the finite?

- The Skolem-Löwenheim Theorem is meaningless in the finite.
- The Compactness Theorem fails in the finite.
- The Craig Interpolation Theorem fails in the finite: the EVEN CARDINALITY query is not FO-definable.
- Conjecture: Scott and Suppes 1958
  The Łoś- Tarski Theorem holds in the finite:
  If a FO-sentence ψ is preserved under substructures on all finite structures, then there is a universal FO-sentence ψ\* that is equivalent to ψ on all finite structures

#### Theorem: Tait – 1959

The Łoś- Tarski Theorem fails in the finite. (rediscovered by Gurevich and Shelah in the 1980s)

#### **Theorem:** Ajtai and Gurevich – 1987

Lyndon's Positivity Theorem fails in the finite: There is a FO-sentence  $\psi(S)$  that is monotone in S on all finite structures, but is not equivalent to any positive-in-S FO-sentence on all finite structures.

**Question:** Do any of the classical results of model theory survive the passage to the finite?

#### **Preservation-under-Homomorphisms Theorem:**

If a FO-sentence  $\psi$  is preserved under homomorphisms on all structures, then there is an existential positive FO-sentence  $\psi^*$  that is equivalent to  $\psi$  on all structures.

**Problem:** Does the preservation-under-homomorphisms theorem hold in the finite? Suppose that a FO-sentence  $\psi$  is preserved under homomorphisms on all finite structures. Is there a FO-sentence  $\psi^*$  that is equivalent to  $\psi$  on all finite structures?

This problem had remained open for a long time ...

#### Theorem: Rossman – 2005

If a FO-sentence  $\psi$  is preserved under homomorphisms on all finite structures, then there is an existential positive FO-sentence  $\psi^*$  that is equivalent to  $\psi$  on all finite structures.

- So, finally, we have a positive result about classical model theory in the finite.
- And there is more ...

## Model Theory of Restricted Classes

#### **Theorem:** Atserias, Dawar, K ... – 2004

- Let *T*(k) be the class of graphs of treewidth at most k.
  If a FO-sentence is preserved under homomorphisms on *T*(k), then it is equivalent to some existential-positive FO-sentence on *T*(k).
- If a FO-sentence is preserved under homomorphims on all planar graphs, then it is equivalent to some existentialpositive FO-sentence on all planar graphs.

**Note:** Preservation theorems do **not** relativize to subclasses.

## Model Theory of Restricted Classes

#### **Theorem:** Atserias, Dawar, Grohe – 2005

- Let *T*(k) be the class of graphs of treewidth at most k.
  If a FO-sentence is preserved under substructures on
  *T*(k), then it is equivalent to some universal FO-sentence on *T*(k).
- There is a FO-sentence that is preserved under substructures on all planar graphs, but it is **not** equivalent to any universal FO-sentence on all planar graphs.

## Abstract Model Theory in the Finite

#### Theorem: Lindström – 1969

First-order logic is a maximal logic possessing both the Compactness Theorem and the Skolem-Löwenheim Theorem.

#### Problem: K ... and Väänänen - 1992

- Is there a Lindström-type characterization of first-order logic on finite structures?
- Is there a Lindström-type characterization of least fixed-point logic on finite structures?

## **Concluding Remarks**

Many topics were not covered in this talk:

- Finite-variable logics and analysis of k-types.
- Logics with generalized quantifiers.
- Interaction with modal logics, connections with the μ-calculus and automated verication.
- Applications to database theory and to constraint databases.
- Interaction with constraint satisfaction.

## **Concluding Remarks**

- Finite model theory has come a long way from a collection of early sporadic results to a mature research area.
- There have been numerous successes, but also frustrations:
  Lack of progress on resolving open problems in complexity.
  - Limited impact of 0-1 laws on other areas of CS.
- On the positive side,
  - Shift of focus on restricted classes of structures is bearing fruit.
  - Growing connections with constraint satisfaction.
- One can only hope that the next 30 years of finite model theory will be at least as fruitful as the past 30.