## Model theory, VC classes, and Henselian rings

Will Johnson

Fudan University

November 18, 2024

## Section 1

NIP

A Venn diagram with four sets



#### What's wrong with this picture?

A Venn diagram with four sets



A Venn diagram with seven sets



#### Slogan

In a Venn diagram of n sets, the complexity of the sets increases with n

Will Johnson (Fudan University) Model theory, VC classes, and Henselian rings

Slogan

#### Slogan

In a Venn diagram of n sets, the complexity of the sets increases with n

- What is a "Venn diagram"?
- How is "complexity" measured?

## Independent sets

Fix a set U.

#### Definition

Sets  $X_1, \ldots, X_n \subseteq U$  are *independent* if they partition U into  $2^n$  subsets. More precisely, for every  $S \subseteq \{1, \ldots, n\}$ ,





Three independent sets.

5 4 3 2

Three non-independent sets.

Slogan

#### Slogan

In a Venn diagram of n sets, the complexity of the sets increases with n

#### Slogan

If  $X_1, \ldots, X_n \subseteq \mathbb{R}^2$  are independent sets, then the complexity of the sets  $X_1, \ldots, X_n$  increases with n.

• How is "complexity" measured?

## Definable sets

For the structure  $(\mathbb{R}, +, \cdot, \leq)$ ...

#### Definition

 $D \subseteq \mathbb{R}^n$  is a *definable set* if

$$D = \{\vec{x} \in \mathbb{R}^n : \varphi(\vec{x})\}$$

for some first-order formula  $\varphi(\vec{x})$ .

"First-order":

- +,  $\cdot$ ,  $\leq$ , =.
- $\wedge$  (and),  $\vee$  (or),  $\neg$  (not)
- $\forall x \in \mathbb{R}, \ \exists x \in \mathbb{R}$
- $\forall S \subseteq \mathbb{R}, \exists S \subseteq \mathbb{R}$

## Definable sets

The unit disk is definable in  $(\mathbb{R}, +, \cdot, \leq)$ :



$$egin{aligned} &\{(x,y)\in\mathbb{R}^2\mid \exists z:x\cdot x+y\cdot y+z\cdot z=1\}\ &=\{(x,y)\in\mathbb{R}^2\mid x\cdot x+y\cdot y\leq 1\}. \end{aligned}$$

## **Definable families**

#### Definition

 $\mathcal{F} \subseteq \mathsf{Pow}(\mathbb{R}^n)$  is a *definable family* if

$$\mathcal{F} = \{\{\vec{x} \in \mathbb{R}^n : \varphi(\vec{x}, \vec{a})\} : \vec{a} \in \mathbb{R}^n, \ \psi(\vec{a})\}$$

for some first-order formulas  $\varphi, \psi$ .

#### Example

The family of open disks in  $\mathbb{R}^2$  is a definable family:

$$ig\{ \{(x,y) \in \mathbb{R}^2 : (x-a)^2 + (y-b)^2 < r^2 \} : (a,b,r) \in \mathbb{R}^3, \ r > 0 ig\}$$

#### Idea

In a definable family, the sets have bounded complexity.

Will Johnson (Fudan University) Model theory, VC classes, and Henselian rings Nove

## A precise statement

#### Slogan

In a Venn diagram of n sets, the complexity of the sets increases with n

#### Theorem

If  $\mathcal F$  is a definable family in the structure  $(\mathbb R,+,\cdot)$ , then

 $\sup\{n : there are independent X_1, \ldots, X_n \in \mathcal{F}\} < \infty.$ 

#### Example

If  $X_1, \ldots, X_n$  are independent disks, then  $n \leq 3$ .

## IP and NIP

Let M be a structure.

#### Definition

 ${\it M}$  has the independence property (IP) if there is a definable family  ${\cal F}$  such that

 $\sup\{n : \text{there are independent } X_1, \ldots, X_n \in \mathcal{F}\} = \infty.$ 

#### Definition

M is NIP if for every definable family  $\mathcal{F}$ ,

 $\sup\{n : \text{there are independent } X_1, \ldots, X_n \in \mathcal{F}\} < \infty.$ 

## IP and NIP

#### Example

- $(\mathbb{Z},+,\cdot)$  has the IP:
  - 2Z, 3Z, 5Z, 7Z, ... are independent.
  - {nZ : n ∈ Z} is a definable family.

## Theorem (Wilkie)

The real exponential field  $(\mathbb{R}, +, \cdot, \leq, exp)$  is NIP.



Motivating questions

Question

Which fields are NIP?

Question

Which rings are NIP?

From now on, "ring" means "commutative unital ring".

## Section 2

## A detour to statistics

## VC classes

#### Definition

A family of sets  $\mathcal{F}$  is a *VC class* if

 $\sup\{n : \text{there exist independent } X_1, \ldots, X_n \in \mathcal{F}\} < \infty.$ 

A structure is NIP iff every definable family is a VC class.

## VC classes

#### What does "VC" stand for?



Vapnik



Chervonenkis

These are statisticians, not logicians!

## The law of large numbers



## The law of large numbers

Let  $(\Omega, \mu)$  be a probability space. Fix  $\epsilon > 0$ .

#### Theorem

If  $X_1, \ldots, X_n$  are independently distributed according to  $\mu$ , and  $E \subseteq \Omega$ , then

$$\lim_{n \to \infty} \operatorname{Prob}\left( \left| \mu(E) - \frac{\#\{i : X_i \in E\}}{n} \right| < \epsilon \right) = 1$$

#### Idea

If  $X_1, \ldots, X_n$  are random samples from  $(\Omega, \mu)$ , and  $n \gg 0$ , then with high probability,

$$\mu(E)\approx\frac{\#\{i:X_i\in E\}}{n}$$

## Uniform law of large numbers

Let  $(\Omega, \mu)$  be a probability space and  $\mathcal{F}$  be a VC class on  $\Omega$ . Fix  $\epsilon > 0$ .

#### Theorem (Vapnik-Chervonenkis)

If  $X_1, \ldots, X_n$  are independently distributed according to  $\mu$ , then

$$\lim_{n\to\infty} \operatorname{Prob}\left(\sup_{E\in\mathcal{F}}\left|\mu(E)-\frac{\#\{i:X_i\in E\}}{n}\right|<\epsilon\right)=1.$$

#### Idea

If  $X_1, \ldots, X_n$  are random samples from  $(\Omega, \mu)$ , and  $n \gg 0$ , then

$$\mu(E) \approx \frac{\#\{i: X_i \in E\}}{n}$$

for every  $E \in \mathcal{F}$ , with high probability.

## Uniform law of large numbers

#### Idea

If  $X_1,\ldots,X_n$  are random samples from  $(\Omega,\mu)$ , and  $n\gg 0$ , then

$$u(E)\approx\frac{\#\{i:X_i\in E\}}{n}$$

for every  $E \in \mathcal{F}$ , with high probability.

Why is this non-trivial?

• A random set of numbers between 0 and 99:

82, 26, 83, 31, 9, 29, 89, 5, 8, 91

• If  $E = \{82, 26, 83, \dots, 91\}$ , then  $\mu(E) = 0.1$ , but the sample suggests  $\mu(E) \approx 1$ 

## Overfitting



## Overfitting and VC classes

- Suppose we are training a classifier  $f: \Omega \to \{0, 1\}.$
- Let  $\mathcal{F}$  be the set of possibilities for f.
- If  $\mathcal{F}$  is a VC class, then

sample accuracy(f)  $\approx$  population accuracy(f)

for all  $f \in \mathcal{F}$ 

- ... so maximizing sample accuracy nearly maximizes population accuracy.
  - No overfitting!



## Overfitting and NIP

#### Theorem (Wilkie)

The real exponential field  $(\mathbb{R}, +, \cdot, \exp)$  is NIP.

#### Corollary

In a sigmoidal neural network, the set of possible classifiers  $\mathbb{R}^n \to \{0,1\}$  is a VC class.

Karpinski and Macintyre calculate more precise bounds for the VC theorem, in this case.

## Section 3

## Model theory

## Motivating questions

Question

Which fields are NIP?

Question

Which rings are NIP?

These questions belong to model theory.

## Model theory

Model theory is the study of *algebraic structures*...

- groups, rings, fields,...
- ... using tools from mathematical logic:
  - definable sets, elementary equivalence,...



## Structures

#### Definition

A structure is a set with some functions and relations.

Examples:

- ( $\mathbb{C}, +, \cdot$ )
- ( $\mathbb{Z}, +, \leq$ )
- ( $\mathbb{R}, +, \cdot, \exp$ )

## Elementary equivalence

#### Definition

Two structures *M* and *N* are *elementarily equivalent*  $(M \equiv N)$  if *M* and *N* satisfy the same first-order sentences.

$$\mathbb{R} \text{ satisfies } \forall x \ \exists y : y \cdot y \cdot y = x$$
$$\mathbb{Q} \text{ doesn't satisfy } \forall x \ \exists y : y \cdot y \cdot y = x$$

So  $\mathbb{R} \not\equiv \mathbb{Q}$ .

## Elementary equivalence

Any structure M has an elementary equivalence class

 $\{N:N\equiv M\}.$ 

#### Theorem

 $(K, +, \cdot) \equiv (\mathbb{C}, +, \cdot)$  if and only if char(K) = 0 and  $K = K^{alg}$ .

A form of the Lefschetz principle in algebraic geometry(?)

# $\label{eq:alg_alg} \begin{array}{l} \mathsf{Example} \\ \mathbb{Q}^{\mathrm{alg}} \equiv \mathbb{C}. \end{array}$

## Definable sets and functions

Fix a structure M.

Definition

 $D \subseteq M^n$  is definable if

$$D = \{\vec{x} : \varphi(\vec{x})\}$$

for some first-order formula  $\varphi$ .

#### Definition

If X, Y are definable, then  $f : X \to Y$  is a *definable function* if the graph  $\Gamma(f)$  is definable:

$$\Gamma(f) = \{(x, y) \in X \times Y : y = f(x)\}.$$

Definable sets and functions form a category.

Definable sets in 
$$(\mathbb{C},+,\cdot)$$

#### Theorem

 $D \subseteq \mathbb{C}^n$  is definable if and only if D is constructible in the sense of algebraic geometry:

$$D = \bigcup_{i=1}^m C_i \setminus C'_i$$

for Zariski closed sets  $C_i, C'_i$ .

A form of Chevalley's theorem in algebraic geometry(?)

#### Theorem

In  $\mathbb{C}$ , a function  $f : X \to Y$  is definable iff f is piecewise rational.

What can model theory do?

## Categoricity

Let M be an infinite structure and  $\kappa$  be an infinite cardinal.

#### Theorem (Löwenheim-Skolem)

M is elementarily equivalent to a structure of size  $\kappa$ .

#### Definition

*M* is  $\kappa$ -categorical if there's a unique  $N \equiv M$  of size  $\kappa$ , up to isomorphism.

#### Example

 $\mathbb{C}$  is  $\kappa$ -categorical for any  $\kappa > \aleph_1$ .

(There's only one K with  $K = K^{\text{alg}}$ , char(K) = 0, and  $\text{tr.} \text{deg}(K/\mathbb{Q}) = \kappa$ .)

## Uncountable categoricity

Suppose *M* is  $\kappa$ -categorical for some  $\kappa > \aleph_0$ .

- Every definable set  $D \subseteq M^n$  has a "dimension" dim $(D) \in \mathbb{N}$ , satisfying things like dim $(X \times Y) = \dim(X) + \dim(Y)$ .
- If K is a definable field, then K is finite or  $K = K^{alg}$ .
- If G is a definable group...
  - G has a "connected component"  $G^0$ .
  - There is a subnormal series of definable subgroups

$$1 = H_0 \lhd H_1 \lhd H_2 \lhd \cdots \lhd H_n = G$$

such that the quotients  $H_{i+1}/H_i$  are simple or abelian.

► CONJECTURALLY, the simple H<sub>i+1</sub>/H<sub>i</sub> are algebraic groups over algebraically closed fields (Cherlin-Zilber).

## Section 4

## Stability theory and Neostability theory

## NIP and NSOP

Let M be a structure.

#### Definition

*M* has the *IP* (*independence property*) if there's a definable family  $\mathcal{F}$  such that for every  $n < \infty$ , there are independent  $X_1, \ldots, X_n \in \mathcal{F}$ . Otherwise, *M* is *NIP*.



#### Definition

*M* has the *SOP* (*strict order property*) if there's a definable family  $\mathcal{F}$  such that for every  $n < \infty$ , there are  $X_1, \ldots, X_n \in \mathcal{F}$  with

$$X_1 \subsetneq X_2 \subsetneq X_3 \subsetneq \cdots$$

Otherwise, M is NSOP.



## NIP and NSOP

#### Theorem

 $(\mathbb{R},+,\cdot,\leq)$  is NIP.

On the other hand,

#### Remark

 $(\mathbb{R}, +, \cdot, \leq)$  has the SOP:

$$(-\infty,1) \subsetneq (-\infty,2) \subsetneq (-\infty,3) \subsetneq \cdots$$

## Stability

#### Definition

#### A structure M is *stable* if M is NIP and NSOP.



## Stability: what good is it?

These structures are stable:

- Algebraically closed fields.
- Free groups (Sela).
- Abelian groups, modules.
- Differentially closed fields  $(K, +, \cdot, \partial)$ .
- Uncountably categorical structures.

In fact,

## Theorem (Shelah)

Unless M is stable, for every  $\kappa > \aleph_0$ ,

$$\#\{N:N\equiv M,\ \#N=\kappa\}/\cong$$
 is  $2^{\kappa}$ .

## Stability: what good is it?

In a stable structure, we can define...

- The "dimension" dim(D) of a definable set.\*
- "Independence" of elements  $a_1, a_2, a_3, \ldots \in M$ .
- The "connected component"  $G^0$  of a definable group.
- "Prime models"

Applications of stability theory:

- Classification theory (Shelah)
- Differential algebra (Poizat, many others)
- Function-field Mordell-Lang (Hrushovski)
- Approximate subgroups (also Hrushovski)

## The neostability universe



## The neostability universe (simplified)



**Neostability theory:** generalizing stability theory to bigger classes, like NIP.

Why NIP?

These things are NIP but not stable:

- The fields  $\mathbb{R}, \mathbb{Q}_p$ .
- Ordered abelian groups like  $(\mathbb{Z}, +, \leq)$ .
- Algebraic groups like SU(n), SO(n).
- O-minimal structures like  $(\mathbb{R}, +, \cdot, exp)$ .

NSOP is too restrictive.

## Section 5

**NIP** rings

#### Reminder

"Ring" means "commutative unital ring".

## Typical examples

These fields and rings are NIP:

- $\bullet$  The real numbers  $\mathbb R.$
- The *p*-adic integers

$$\mathbb{Z}_p = \varprojlim_{n \to \infty} \mathbb{Z}/p^n.$$

- The *p*-adic numbers  $\mathbb{Q}_p = \operatorname{Frac}(\mathbb{Z}_p)$ .
- The formal power series ring

$$k[[X]] = \{a_0 + a_1X + a_2X^2 + \cdots : a_0, a_1, a_2, \ldots \in k\},\$$

for  $k = \mathbb{C}, \mathbb{Q}_p, \mathbb{R}$ .

The formal Laurent series field k((X)) = Frac k[[X]] for k = C, Q<sub>p</sub>, ℝ.

#### Warning

 $\mathbb{F}_p[[X]]$  and  $\mathbb{F}_p((X))$  are <u>not</u> NIP.

## Local rings and henselianity Let R be a ring.

#### Definition

• R is a *local ring* if there is a unique maximal ideal  $\mathfrak{m}$ .

Suppose R is local.

- The *residue field* is the quotient  $k = R/\mathfrak{m}$ .
- *R* is *Henselian* if: For any monic polynomial  $P(X) \in K[x]$ , if  $\overline{P}(X) \in k[X]$  is the reduction mod  $\mathfrak{m}$ , and  $\alpha \in k$  is a simple root of  $\overline{P}(X)$ , then  $\alpha$  lifts to a root of P(X).

#### Fact

 $\mathbb{Z}_p$  is a henselian local ring with residue field  $\mathbb{F}_p = \mathbb{Z}/p$ . k[[X]] is a henselian local ring with residue field k. The localization  $\mathbb{Z}_{(2)} = \{a/(2b+1) : a, b \in \mathbb{Z}\}$  is a non-henselian local ring.

## Prime ideals in an NIP ring

Let R be an NIP ring.

```
Theorem (Simon)
```

There is some n such that if  $\mathfrak{p}_1, \ldots, \mathfrak{p}_k$  are pairwise incomparable prime ideals, then  $k \leq n$ .

Proof idea:  $\mathfrak{p}_1, \ldots, \mathfrak{p}_k$  are independent sets.

#### Corollary

- R is semilocal: only finitely many maximal ideals.
- If R is Noetherian, then  $\dim(R) \leq 1$ .

49 / 62

## Generalized henselianity conjecture

Conjecture (Generalized henselianity conjecture)

If R is an NIP ring, then  $R = A_1 \times A_2 \times \cdots \times A_n$  for some henselian local rings  $A_1, \ldots, A_n$ .

Equivalent conjectures:

- NIP integral domains are local.
- 2 NIP local rings are Henselian.
- If (K, +, ·, ...) is an NIP field with a definable field topology, then the inverse/implicit function theorem holds for polynomials.

#### Theorem (J)

The generalized henselianity conjecture holds when char(R) > 0 or when R is "finite-dimensional."

## Dimension in NIP structures

- In NIP structures, any definable set D has a "dimension" dim(D) called its "dependence rank".
- dim(*D*) is a cardinal number, possibly infinite.
- $\dim(X \times Y) = \dim(X) + \dim(Y)$ .
- Many NIP structures M satisfy dim(M) ≤ 1.



 $\dim(D) \ge 2$  iff D contains a pattern of definable sets like this, ROUGHLY.

## Positive characteristic: ideas in the proof

Let K be an infinite NIP field of characteristic p > 0.

Theorem (Kaplan-Scanlon-Wagner)

The Artin-Schreier map  $\alpha(x) = x^p - x$  is onto.

Proof idea: the family of subgroups  $\{b \cdot \alpha(K) : b \in K^{\times}\}$  isn't a VC class otherwise.

Corollary

If L/K is a finite separable extension, [L : K] is prime to p.

## Positive characteristic: ideas in the proof

Setting:

- R an NIP integral domain
- char(R) = p > 0.
- R has finitely many maximal ideals  $\mathfrak{m}_1, \ldots, \mathfrak{m}_n$ , and n > 1.

• 
$$J = \bigcap_i \mathfrak{m}_i$$
.

Strategy:

- Show that Artin-Schreier image  $\alpha(J)$  has index  $p^{n-1} > 1$  in J.
- Show that  $\{b \cdot \alpha(J) : b \in K^{\times}\}$  isn't a VC class.

## Section 6

NIP fields

## Overview

For NIP fields...

- We have a conjectural classification.
- The classification is known in the finite-dimensional case.

## Valued fields

#### Definition

A valued field is a pair (K, R) where K is a field and R is a subring such that for every  $x \in K$ , at least one of x or  $x^{-1}$  is in R.

*R* is called the *valuation ring*; it is always local, and has an associated *residue field*  $R/\mathfrak{m}$ .

K	R	$R/\mathfrak{m}$	Henselian?
$\mathbb{Q}_{p}$	$\mathbb{Z}_p$	$\mathbb{Z}/p$	Yes
k((t))	k[[t]]	k	Yes
Q	$\mathbb{Z}_{(p)}$	$\mathbb{Z}/p$	No

#### Theorem (Anscombe-Jahnke)

A henselian valued field (K, R) is NIP iff the residue field  $R/\mathfrak{m}$  is NIP plus a

bunch of other conditions when  $char(R/\mathfrak{m}) > 0$ , henceforth abbreviated as "henselian\*".

#### Conjecture (Shelah)

If K is an NIP field, then one of the following holds:

- K is finite.
- K is separably closed.
- K is real closed ( $K \equiv \mathbb{R}$ ).
- K admits a henselian valuation ring  $R \subsetneq K$ .

#### Theorem (Anscombe-Jahnke)

Assuming the Shelah conjecture, a field K is NIP iff there is a henselian<sup>\*</sup> valuation ring R on K with  $R/\mathfrak{m}$  being finite, real closed, or algebraically closed.

Everything holds in the "finite dimensional" case:

Theorem (J)

If K is a finite-dimensional NIP field, then K is finite, real closed, separably closed, or henselian.

From this, we get a classification of finite-dimensional NIP fields.

#### Theorem (J)

If K is a finite-dimensional NIP field, then K is finite, real closed, separably closed, or henselian.

Proof strategy:

#### Theorem

If K is a finite-dimensional NIP field, then there is usually a unique definable field topology on K of "valuation type".

ROUGHLY,

- Uniqueness implies "any definable valuation ring is henselian."
- Existence implies "some definable valuation ring exists".

#### Theorem

If K is a finite-dimensional NIP field, then there is usually a unique definable field topology on K of "valuation type".

Proof strategy: show that

 $\{D - D : D \subseteq K \text{ is definable and } \dim(D) = \dim(K)\}$ 

is a neighborhood basis of 0 for a suitable field topology on K, where  $D - D = \{x - y : x, y \in D\}.$ 

#### Idea

We expect  $\dim(D) = \dim(K)$  to imply "D has non-empty interior". This forces the topology to be as above.

## Prospects for classifying NIP rings

#### Theorem (d'Elbée, Halevi, Johnson)

 If R is a 1-dimensional NIP valuation ring, and I is an ideal, and A is a finite subring of R/I, then the pullback R×<sub>R/I</sub> A is a 1-dimensional NIP integral domain.

• All 1-dimensional NIP integral domains arise this way.

Summary:

- 1-dimensional NIP integral domains are close to valuation rings.
- This fails for 2-dimensional NIP integral domains, strange new behavior occurs...

To be continued...

... hopefully.

## Questions?