

91.304 Foundations of (Theoretical) Computer Science

Chapter 4 Lecture Notes (Section 4.2: The “Halting” Problem)

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With modifications by Prof. Karen Daniels, Fall 2014



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Back to Σ_1

- So the fact that Σ_1 is not closed under complement means that there exists some language L that is not recognizable by any TM
- By Church-Turing thesis this means that *no imaginable finite computer*, even with infinite memory, could recognize this language L !

Non-recognizable languages

- We proceed to prove that non-Turing recognizable languages exist, in two ways:
 - A **nonconstructive** proof using Georg Cantor's famous 1873 diagonalization technique, and then
 - An **explicit construction** of such a language.

Learning how to count

- **Definition** Let A and B be sets. Then we write $A \approx B$ and say that A is **equinumerous** to B if there exists a one-to-one, onto function (a “correspondence”, i.e. a pairing)

$$f: A \rightarrow B$$

- Note that this is a purely mathematical definition: the function f does not have to be expressible by a Turing machine or anything like that.
- **Example:** $\{ 1, 3, 2 \} \approx \{ \text{six, seven, BBCCD} \}$
- **Example:** $\mathbf{N} \approx \mathbf{Q}$ (textbook example 4.15)

■ See next slide...

Countability

- **Definition** A set S is **countable** if S is finite **or** $S \approx \mathbf{N}$.
 - Saying that S is countable means that you can line up all of its elements, one after another, and cover them all
 - Note that \mathbf{R} is *not* countable (Theorem 4.17), basically because choosing a single real number requires making infinitely many choices of what each digit in it is (see next slide).

Countability (continued)

- Theorem 4.17: \mathbf{R} is *not* countable.
- Proof Sketch: By way of contradiction, suppose $\mathbf{R} \approx \mathbf{N}$ using correspondence f .

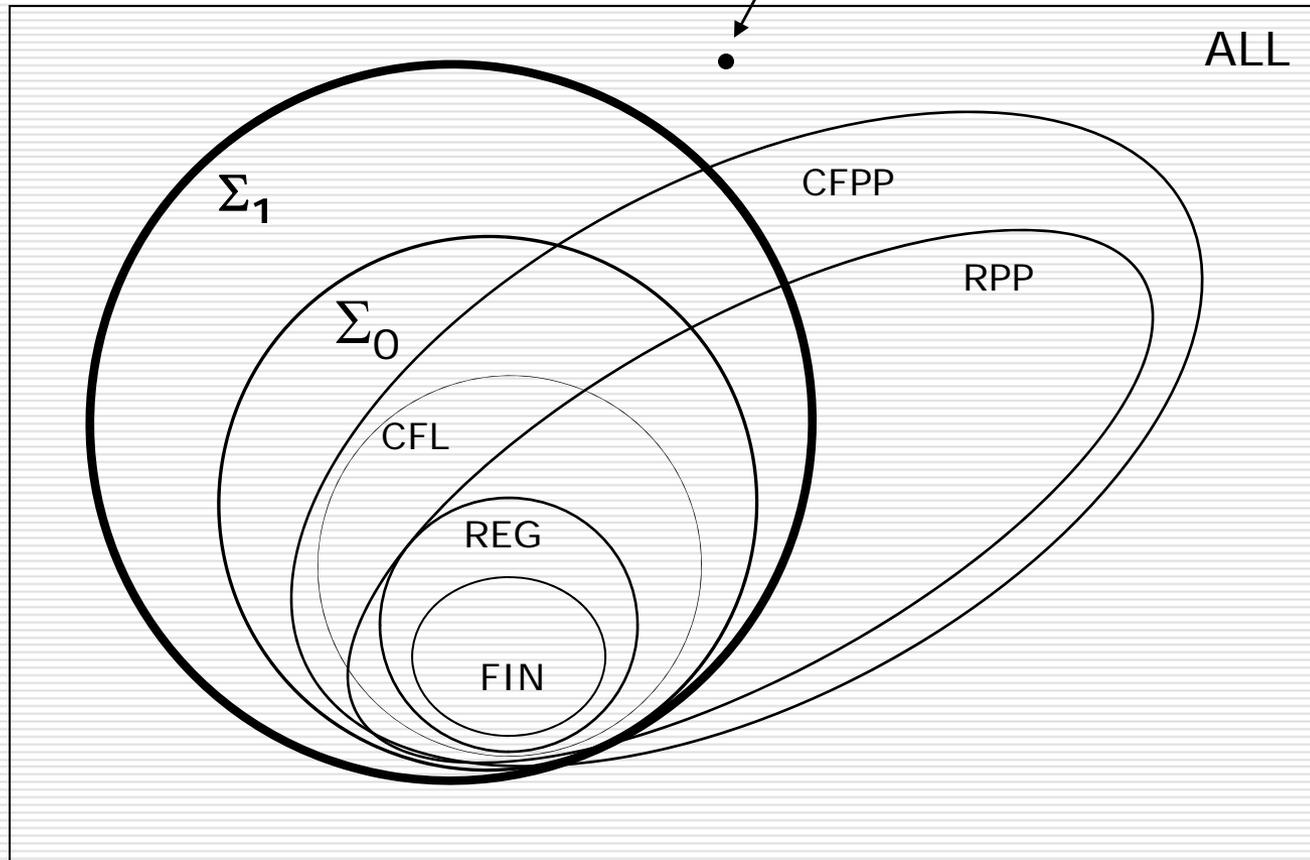
Construct $x \in \mathbf{R}$ such that x is not paired with anything in \mathbf{N} , providing a contradiction.

| n | $f(n)$ | $x \in (0,1)$ |
|----------|----------------------|--------------------|
| 1 | 3. <u>1</u> 4159... | |
| 2 | 55.5 <u>5</u> 555... | |
| 3 | 0.123 <u>4</u> 5... | $x = 0.4641 \dots$ |
| 4 | 0.500 <u>0</u> 0... | |
| \vdots | \vdots | |

x is not $f(n)$ for any n because it differs from $f(n)$ in n th fractional digit.

Caveat: How to circumvent $0.1999\dots = 0.2000\dots$ problem?

A non- Σ_1 language



Each point is a language in this Venn diagram

Strategy

- We'll show that there are more (a *lot* more) languages in ALL than there are in Σ_1
 - Namely, that Σ_1 is countable but ALL isn't countable
 - Which implies that $\Sigma_1 \neq \text{ALL}$
 - Which implies that there exists some L that is not in Σ_1

- For simplicity and concreteness, we'll work in the universe of strings over the alphabet $\{0,1\}$.

Countability of Σ_1

- **Theorem** Σ_1 is countable
- **Proof** The strategy is simple. Σ_1 is the class of all languages that are Turing-recognizable. So each one has (at least) one TM that recognizes it. We'll concentrate on listing those TMs.

Countability of TM

- Let $\mathbf{TM} = \{ \langle M \rangle \mid M \text{ is a Turing Machine with } \Sigma = \{0,1\} \}$
 - Notation: $\langle M \rangle$ means the **string encoding** of the object M
 - Previously, we thought of our TMs as abstract mathematical things: drawings on the board, or 7-tuples: $(Q, \Sigma, \Gamma, \delta, q_0, q_a, q_r)$
 - But just as we can encode every C++ program as an ASCII string, surely we can also encode every TM as a string
 - It's not hard to specify precisely how to do it—but it doesn't help us much either, so we won't bother
 - Just note that in our full specification of a TM $(Q, \Sigma, \Gamma, \delta, q_0, q_a, q_r)$, each element in the list is finite by definition
 - So writing down the sequence of 7 things can be done in a finite amount of text
 - In other words, each $\langle M \rangle$ is a string

Countability of TM

- Now we make a list of all possible strings in lexicographical (string) order,
- Cross out the ones that are not valid encodings of Turing Machines,
- And we have a mapping $f: \mathbf{N} \rightarrow \mathbf{TM}$
 - $f(1)$ = first (smallest) TM encoding on list
 - $f(2)$ = second TM encoding on list
 - ...
- This is part of textbook's proof of Corollary 4.18 (*Some languages are not Turing-recognizable*).

Back to countability of Σ_1

- Now consider the list $L(f(1)), L(f(2)), \dots$
 - Turns each TM enumerated by f into a language
 - So we can define a function $g : \mathbf{N} \rightarrow \Sigma_1$ by $g(i) = L(f(i))$, where $f(i)$ returns the i^{th} Turing machine
 - Now: is this a correspondence? Namely,
 - Is it onto?
 - Is it one-to-one?

Fixing $g : \mathbf{N} \rightarrow \Sigma_1$

- Go ahead and make the list $g(1), g(2), \dots$
- But **cross out each element that is a repeat**, removing it from the list
 - **Subtlety regarding EQ_{TM} undecidability (Ch 5)**
- Then let $h : \mathbf{N} \rightarrow \Sigma_1$ be defined by
$$h(i) = \text{the } i^{\text{th}} \text{ element on the reduced list}$$
- Then h is both one-to-one and onto
- **Thus Σ_1 is countable**

What about ALL?

- **Theorem** (Cantor, 1873) For every set A , $A \not\approx \mathcal{P}(A)$
 - See next several slides for proof.
 - See textbook for a different way to show ALL is uncountable using *characteristic sequence* associated with (uncountable) set of all infinite binary sequences.
- Remember $\text{ALL} = \mathcal{P}(\{0,1\}^*)$ if alphabet $\Sigma = \{0,1\}$
 - set of all (languages)
= set of all (subsets of $\{0,1\}^*$)
- Note that $\{0,1\}^*$ *is* countable
 - Just list all of the strings in lexicographical order
- **Corollary to Theorem** $\text{ALL} = \mathcal{P}(\{0,1\}^*)$ is uncountable
 - So Σ_1 is countable but ALL isn't
 - So they're not equal

Cantor's Theorem

Theorem For every set A , $A \not\cong \mathcal{P}(A)$

Proof We'll show by contradiction that no function $f: A \rightarrow \mathcal{P}(A)$ is onto. So suppose $f: A \rightarrow \mathcal{P}(A)$ is onto. We define a set $K \subseteq A$ in terms of it:

$$K = \{ x \in A \mid x \notin f(x) \}$$

Since $K \subseteq A$, $K \in \mathcal{P}(A)$ as well (by definition of \mathcal{P}). Since f is onto, there exists some $z \in A$ such that $f(z) = K$. Looking closer,

Case 1: If $z \in K \Rightarrow z \notin f(z) \Rightarrow z \notin K$

↑
by definition of K

↑
by definition of z

so $z \in K$ certainly can't be true...

Cantor's Theorem

unchanged

$$\left\{ \begin{array}{l} K = \{ x \in A \mid x \notin f(x) \} \\ K \in \mathcal{P}(A) \\ z \in A \text{ and } f(z) = K \end{array} \right.$$

On the other hand,

Case 2: If $z \notin K \Rightarrow z \in f(z) \Rightarrow z \in K$

↑
by definition of K

↑
by definition of z

so $z \notin K$ can't be true either!

QED

Cantor's Theorem: Example

- For every *proposed* $f : A \rightarrow \mathcal{P}(A)$, the theorem constructs a set $K \in \mathcal{P}(A)$ that is not $f(x)$ for any x
- Let $A = \{ 1, 2, 3 \}$
 $\mathcal{P}(A) = \{ \emptyset, \{1\}, \{2\}, \{3\}, \{1,2\}, \{2,3\}, \{1,3\}, \{1,2,3\} \}$
- Propose $f : A \rightarrow \mathcal{P}(A)$, show K

Diagonalization

- All we're really doing is identifying the squares on the diagonal and making them different than what's in our set K
- So that we're guaranteed $K \neq f(1)$, $K \neq f(2)$, ...
- The construction works for infinite sets too

| x | $f(x)$ |
|-----|---|
| 1 | {  , _ , _ } |
| 2 | { _ ,  , _ } |
| 3 | { _ , _ ,  } |

Non-recognizable languages

- So we conclude that there exists some $L \in ALL - \Sigma_1$ (**many** such languages)
- But we don't know what any L looks like exactly
- Turing constructed such an L also using diagonalization (but not the ~~relation~~)
- We now turn our attention to it

Programs that process programs

- In §4.1, we considered languages such as $A_{\text{CFG}} = \{ \langle G, w \rangle \mid G \text{ is a CFG and } w \in L(G) \}$
- Each element of A_{CFG} is a *coded pair*
 - Meaning that the grammar G is encoded as a string **and**
 - w is an arbitrary string **and**
 - $\langle G, w \rangle$ contains both pieces, in order, in such a way that the two pieces can be easily extracted
- The question “does grammar G_1 generate the string 00010?” can then be phrased equivalently as:
 - Is $\langle G_1, 00010 \rangle \in A_{\text{CFG}}$?

Programs that process programs

- Prelude to introducing Universal TM that can “process” programs.
- $A_{\text{CFG}} = \{ \langle G, w \rangle \mid G \text{ is a CFG and } w \in L(G) \}$
- The *language* A_{CFG} somehow represents the question “does *this* grammar accept *that* string?”
- **Additionally** we can ask: is A_{CFG} itself a regular language? context free? decidable? recognizable?
 - We showed previously that A_{CFG} is decidable (as is almost everything similar in §4.1)

A_{TM} and the Universal TM

- $A_{TM} = \{ \langle M, w \rangle \mid M \text{ is a TM and } w \in L(M) \}$
- We will show that $A_{TM} \in \Sigma_1 - \Sigma_0$
 - (It's recognizable but not decidable)
- **Theorem** A_{TM} is Turing-recognized by a fixed TM called U (the **Universal TM**)
 - This is not stated as a theorem in the textbook (it does appear as part of proof of Theorem 4.11: A_{TM} is undecidable), but should be: it's really important

$$A_{\text{TM}} = L(U)$$

$$A_{\text{TM}} = \{ \langle M, w \rangle \mid M \text{ is a TM and } w \in L(M) \}$$

U is a 3-tape TM that keeps data like this:

| | | |
|---|---------------------|-------------------------------------|
| 1 | $\langle M \rangle$ | <i>never changes</i> |
| 2 | q | <i>a state name</i> |
| 3 | $c_1 c_2 c_3 \dots$ | <i>tape contents & head pos</i> |

On startup, U receives input $\langle M, w \rangle$ and writes $\langle M \rangle$ onto tape 1 and w onto tape 3. (If the input is not of the form $\langle M, w \rangle$, then U rejects it.) From $\langle M \rangle$, U can extract the encoded pieces $(Q, \Sigma, \Gamma, \delta, q_0, q_{\text{acc}}, q_{\text{rej}})$ at will. It continues by extracting and writing q_0 onto tape 2.

$$A_{\text{TM}} = L(U)$$

$$A_{\text{TM}} = \{ \langle M, w \rangle \mid M \text{ is a TM and } w \in L(M) \}$$

| | | |
|---|---------------------|-------------------------------------|
| 1 | $\langle M \rangle$ | <i>never changes</i> |
| 2 | q | <i>a state name</i> |
| 3 | $c_1 c_2 c_3 \dots$ | <i>tape contents & head pos</i> |

To simulate a single computation step, U fetches the current character c from tape 3, the current state q on tape 2, and looks up the value of $\delta(q, c)$ on tape 1, obtaining a new state name, a new character to write, and a direction to move. U writes these on tapes 2 and 3 respectively.

If the new state is q_{acc} or q_{rej} then U accepts or rejects, respectively. Otherwise it continues with the next computation step.

The Universal TM U

- This U is **hugely important**: it's the theoretical basis for *programmable* computers.
- It says that there is a *fixed* machine U that can take computer programs as *input* and behave just like each of those programs
 - Note that U is **not** a decider
 - See VMware
- Since $A_{\text{TM}} = L(U)$, we have shown that A_{TM} is Turing-recognizable (Σ_1)

The “Halting” Problem

- $A_{TM} = \{ \langle M, w \rangle \mid M \text{ is a TM and } w \in L(M) \}$
- This appears in our textbook as:
 - $A_{TM} = \{ \langle M, w \rangle \mid M \text{ is a TM and } M \text{ accepts } w \}$
 - This emphasizes the fact that U might loop (i.e. might not **halt**) on input $\langle M, w \rangle$.
 - A_{TM} is therefore sometimes called the **halting problem**.
 - We use “” here due to Chapter 5’s discussion...
 - A_{TM} is called the **acceptance problem** in Chapter 5
 - The “real” **halting problem** is defined there as:
 - $HALT_{TM} = \{ \langle M, w \rangle \mid M \text{ is a TM and } M \text{ halts on input } w \}$

A_{TM} is undecidable

Theorem 4.11 (Turing) $A_{TM} \notin \Sigma_0$

Proof Suppose that $A_{TM} = L(H)$ where H is a decider. We'll show that this leads to a contradiction.

$$H(\langle M, w \rangle) = \begin{cases} \text{accept} & \text{if } M \text{ accepts } w \\ \text{reject} & \text{if } M \text{ does not accept } w \end{cases}$$

Let D be a TM that behaves as follows:

1. Input x
2. If x is not of the form $\langle M \rangle$ for some TM M , then D rejects
3. Simulate H on input $\langle M, \langle M \rangle \rangle$ 
 - If H **accepts** $\langle M, \langle M \rangle \rangle$, then D **rejects**
 - If H **rejects** $\langle M, \langle M \rangle \rangle$, then D **accepts** 

“Simulate H”

- Steps 1 and 2 are not so hard to imagine
- How does D “simulate H on (some other input)”?
 - If someone creates an H, we follow this outline to build D — which has the entire H program built in as a subroutine
 - Note we run H on a *different* input than the one that D is given
- Also, we didn’t say what D does if H goes into an infinite loop
 - It’s OK because H does *not* do that, by the assumption that **H is a decider**

Language accepted by D

(Repeat) **D** behaves as follows:

1. D: input x
2. if x is not of the form $\langle M \rangle$ for some TM M , then D rejects
3. simulate H on input $\langle M, \langle M \rangle \rangle$
 - If H accepts $\langle M, \langle M \rangle \rangle$, then D rejects
 - If H rejects $\langle M, \langle M \rangle \rangle$, then D accepts

So $L(D) = \{ \langle M \rangle \mid \text{H rejects } \langle M, \langle M \rangle \rangle \}$

Now H is a recognizer (even a decider) for A_{TM} , so if H rejects $\langle M, \langle M \rangle \rangle$ then it means that the machine M **does not accept** $\langle M \rangle$.

So $L(D) = \{ \langle M \rangle \mid \langle M \rangle \notin L(M) \}$

Impossible machine

- So $L(D) = \{ \langle M \rangle \mid \langle M \rangle \notin L(M) \}$
- What if we give a copy of D 's own description $\langle D \rangle$ to itself as input? As in Cantor's theorem, we have trouble:
 - $\langle D \rangle \in L(D) \Rightarrow \langle D \rangle \notin L(D) \quad !!$
 - $\langle D \rangle \notin L(D) \Rightarrow \langle D \rangle \in L(D) \quad !!$
- So this D can't exist. But it was defined as a fairly straightforward wrapper around H : so H must not exist either. That is, there is no decider for A_{TM} . **QED**

To summarize...

H **accepts** $\langle M, w \rangle$ exactly when M **accepts** w.



D **rejects** $\langle M \rangle$ exactly when M **accepts** $\langle M \rangle$.



D **rejects** $\langle D \rangle$ exactly when D **accepts** $\langle D \rangle$.

contradiction!

Diagonalization in this proof?

M_i is a TM.

Blank entry implies
either loop or reject.

Now consider
 H , which is a
decider.

| | $\langle M_1 \rangle$ | $\langle M_2 \rangle$ | $\langle M_3 \rangle$ | $\langle M_4 \rangle$ | ... |
|----------|-----------------------|-----------------------|-----------------------|-----------------------|-----|
| M_1 | accept | | accept | | |
| M_2 | accept | accept | accept | accept | |
| M_3 | | | | | ... |
| M_4 | accept | accept | | | |
| \vdots | | | \vdots | | |

FIGURE 4.19
Entry i, j is *accept* if M_i accepts $\langle M_j \rangle$

| | $\langle M_1 \rangle$ | $\langle M_2 \rangle$ | $\langle M_3 \rangle$ | $\langle M_4 \rangle$ | ... |
|----------|-----------------------|-----------------------|-----------------------|-----------------------|-----|
| M_1 | accept | reject | accept | reject | |
| M_2 | accept | accept | accept | accept | |
| M_3 | reject | reject | reject | reject | ... |
| M_4 | accept | accept | reject | reject | |
| \vdots | | | \vdots | | |

FIGURE 4.20
Entry i, j is the value of H on input $\langle M_i, \langle M_j \rangle \rangle$

Diagonalization in this proof? (cont.)

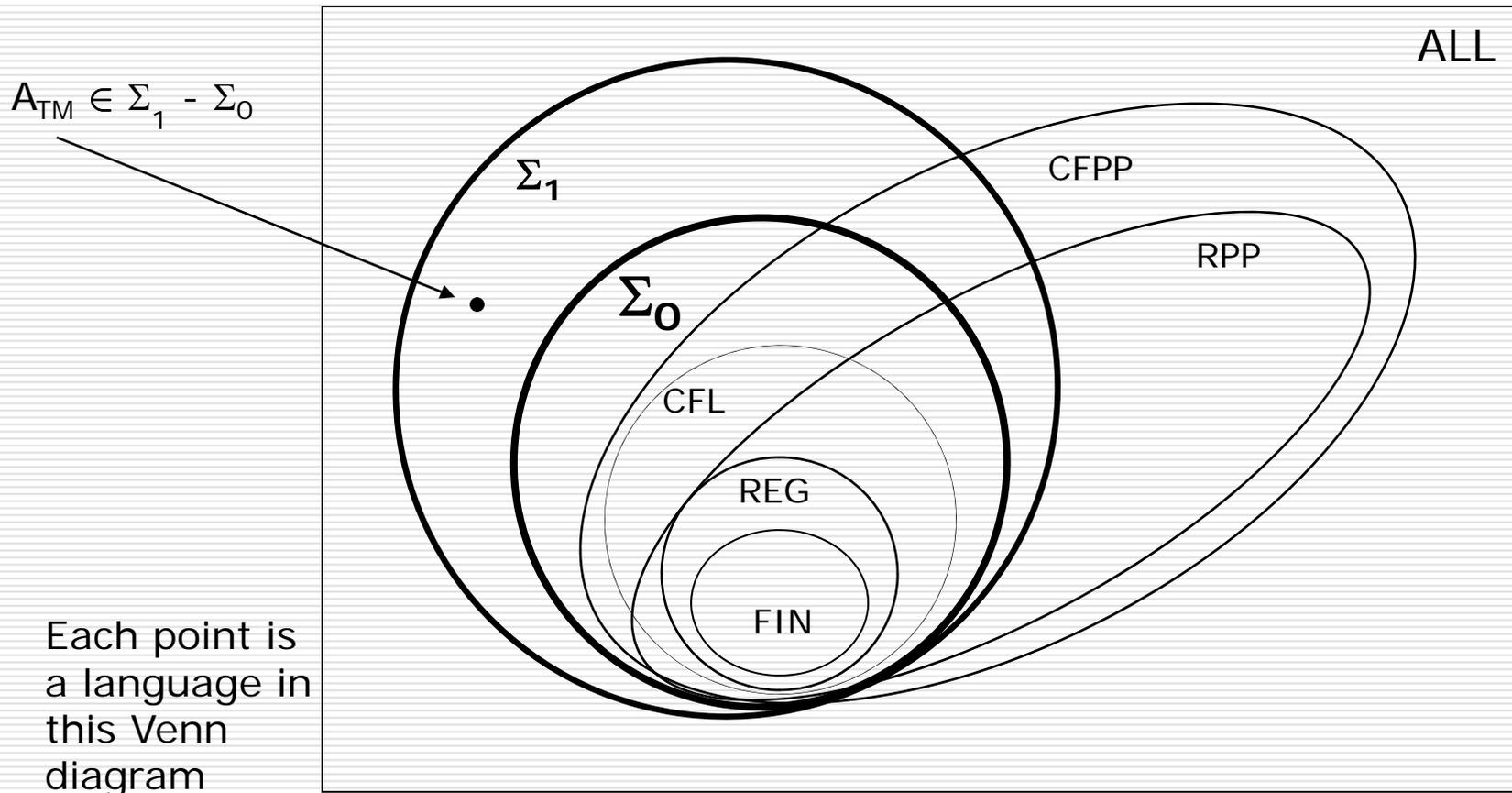
D computes the **opposite** of each diagonal entry because its behavior is opposite H's behavior on input $\langle M_i, \langle M_i \rangle \rangle$.

| | $\langle M_1 \rangle$ | $\langle M_2 \rangle$ | $\langle M_3 \rangle$ | $\langle M_4 \rangle$ | ... | $\langle D \rangle$ | ... |
|-------|-----------------------|-----------------------|-----------------------|-----------------------|-----|---------------------|-----|
| M_1 | <u>accept</u> | reject | accept | reject | | accept | |
| M_2 | accept | <u>accept</u> | accept | accept | | accept | |
| M_3 | reject | reject | <u>reject</u> | reject | ... | reject | ... |
| M_4 | accept | accept | reject | <u>reject</u> | | accept | |
| ... | | | | | | | |
| D | reject | reject | accept | accept | | ? | |
| ... | | | | | | | |

FIGURE 4.21
If D is in the figure, a contradiction occurs at “?”

Cannot compute opposite of this entry itself!

Current landscape



Decidability versus recognizability

Theorem 4.22 For every language L , $L \in \Sigma_0 \Leftrightarrow (L \in \Sigma_1 \text{ and } L^c \in \Sigma_1)$

Recall that complement of a language is the language consisting of all strings that are not in that language.

Proof The \Rightarrow direction is easy, because $\Sigma_0 \subseteq \Sigma_1$ and Σ_0 is closed under complement.

For the \Leftarrow direction, suppose that $L \in \Sigma_1$ and $L^c \in \Sigma_1$. Then there exist TMs so that $L(M_1) = L$ and $L(M_2) = L^c$. To show that $L \in \Sigma_0$, we need to produce a *decider* M_3 such that $L = L(M_3)$.

Theorem 4.22 continued

$L(M_1) = L$, $L(M_2) = L^c$, and we want a *decider* M_3 such that $L = L(M_3)$

Strategy: given an input x , we know that either $x \in L$ or $x \in L^c$. So M_3 does this:

1. M_3 : input x
2. set up tape #1 to simulate M_1 on input x and tape #2 to simulate M_2 on input x
3. compute one transition step of M_1 on tape 1 and one transition step of M_2 on tape 2
 - if M_1 **accepts**, then M_3 **accepts**
 - if M_2 **accepts**, then M_3 **rejects**
 - else goto 3

This is like running both M_1 and M_2 in parallel.

Theorem 4.22 conclusion

- For each string x , either M_1 accepts x or M_2 accepts x , but never both
 - So the machine M_3 will always halt eventually in step 3
 - Therefore, M_3 is a decider
- M_3 accepts those strings in L and rejects those strings in L^c
 - So $L(M_3) = L$

QED

Getting a non-recognizable language from A_{TM}

- $L \in \Sigma_0 \Leftrightarrow (L \in \Sigma_1 \text{ and } L^c \in \Sigma_1)$
- $L \notin \Sigma_0 \Leftrightarrow (L \notin \Sigma_1 \text{ or } L^c \notin \Sigma_1)$
- Now since we know that $A_{TM} \notin \Sigma_0$, and we know that $A_{TM} \in \Sigma_1$, it must be true that $A_{TM}^c \notin \Sigma_1$.
 - $A_{TM} = \{ \langle M, w \rangle \mid M \text{ is a TM and } w \in L(M) \}$
 - $A_{TM}^c = \{ x \mid x \text{ is not of the form } \langle M, w \rangle \text{ or } (x = \langle M, w \rangle \text{ and } w \notin L(M)) \}$
- If we narrow this down to strings of the form $\langle M, w \rangle$, then the language is still unrecognizable:
 - $NA_{TM} = \{ \langle M, w \rangle \mid M \text{ is a TM and } w \notin L(M) \}$

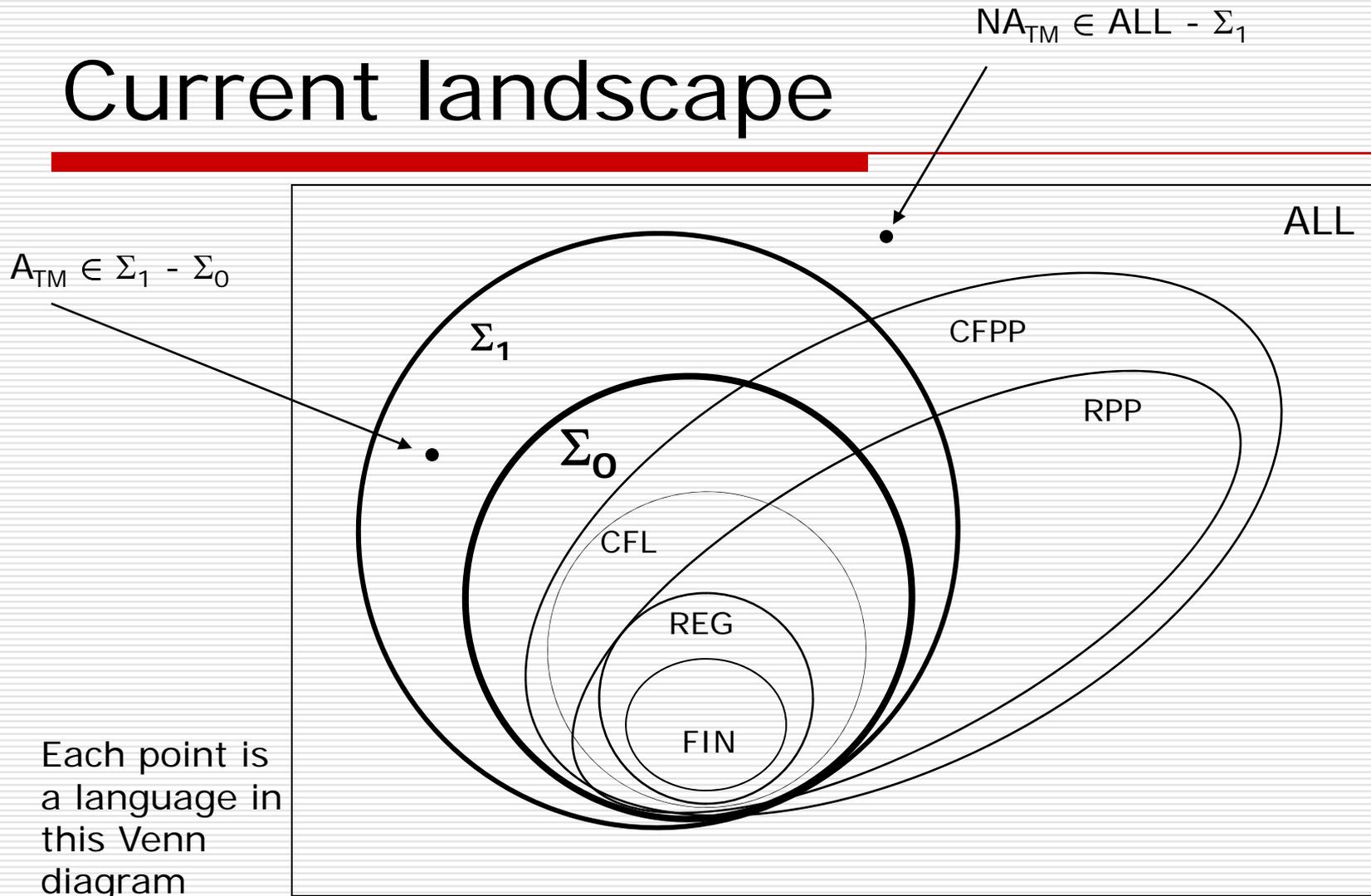
Unrecognizability

- $NA_{TM} = \{ \langle M, w \rangle \mid M \text{ is a TM and } w \notin L(M) \}$

- What does it mean that NA_{TM} is unrecognizable?
 - Every TM recognizes a language that's different than NA_{TM}
 - Either it accepts strings that are not in NA_{TM} , or it fails to accept some strings that actually are in NA_{TM}

- Analogy to C programs:
 - Write a C program that takes another C program as input and prints out "loop" if the other C program goes into an infinite loop.

Current landscape



Each point is a language in this Venn diagram