

Grammars for Free

Toward Grammar Inference for Ad Hoc Parsers

<https://arxiv.org/abs/2202.01021>



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Informatics

```
psf/requests > requests/utils.py 47 matches Python main

693     """
694     if string_network.count('/') == 1:
695         try:
696             mask = int(string_network.split('/')[1])
697         except ValueError:
698             return False
699
```

```
cortinico/react-native > Libraries/Image/RCTImageCache.m 2 matches Objective-C main

118     } else {
119         NSRange range = [component rangeOfString:@"max-age="];
120         if (range.location != NSNotFound) {
121             NSInteger seconds = [[component substringFromIndex:range.location + range.length] integerValue];
122             staleTime = [originalDate dateByAddingTimeInterval:(NSTimeInterval)seconds];
123         }
124     }
```

```
vuejs/vuex > src/plugins/devtool.js 6 matches JavaScript main

169 * @param {string} path
170 */
171 function extractNameFromPath (path) {
172     return path && path !== 'root' ? path.split('/').slice(-2, -1)[0] : 'Root'
173 }
174
175 /**
```

```
x10an14/docs > javascripts/user-agent.ts 6 matches TypeScript main

21
22 export default function parseUserAgent(ua = navigator.userAgent) {
23     ua = ua.toLowerCase()
24     const osRe = OS_REGEXPS.find((re) => re.test(ua))
25     let [, os = 'other', os_version = '0'] = (osRe && ua.match(osRe)) || []
26     if (os === 'iphone os' || os === 'ipad os') os = 'ios'
27     const browserRe = BROWSER_REGEXPS.find((re) => re.test(ua))
```

Parsers are everywhere!

```
coolreader18/libqalculate > src/qalc.cc 86 matches C++ master

480     while(str[i] == '\033') {
481         do {
482             i++;
483         } while(i < str.length() && str[i] != 'm');
484         i++;
485         if(i >= str.length()) break;
486     }
```

```
django/django > django/utils/html.py 1 match Python main

372     if "@" not in value or value.startswith("@") or value.endswith("@"):
373         return False
374     try:
375         p1, p2 = value.split("@")
376     except ValueError:
377         # value contains more than one @.
378         return False
```

```
packages/GitPython/lib/git/actor.py 3 matches Python

35     Actor
36     """
37     if re.search(r'<.+>', string):
38         m = re.search(r'(.*) <(.*?)>', string)
39         name, email = m.groups()
40         return Actor(name, email)
41     else:
```

```
fixtures/dom/src/components/IssueList.js 1 match JavaScript

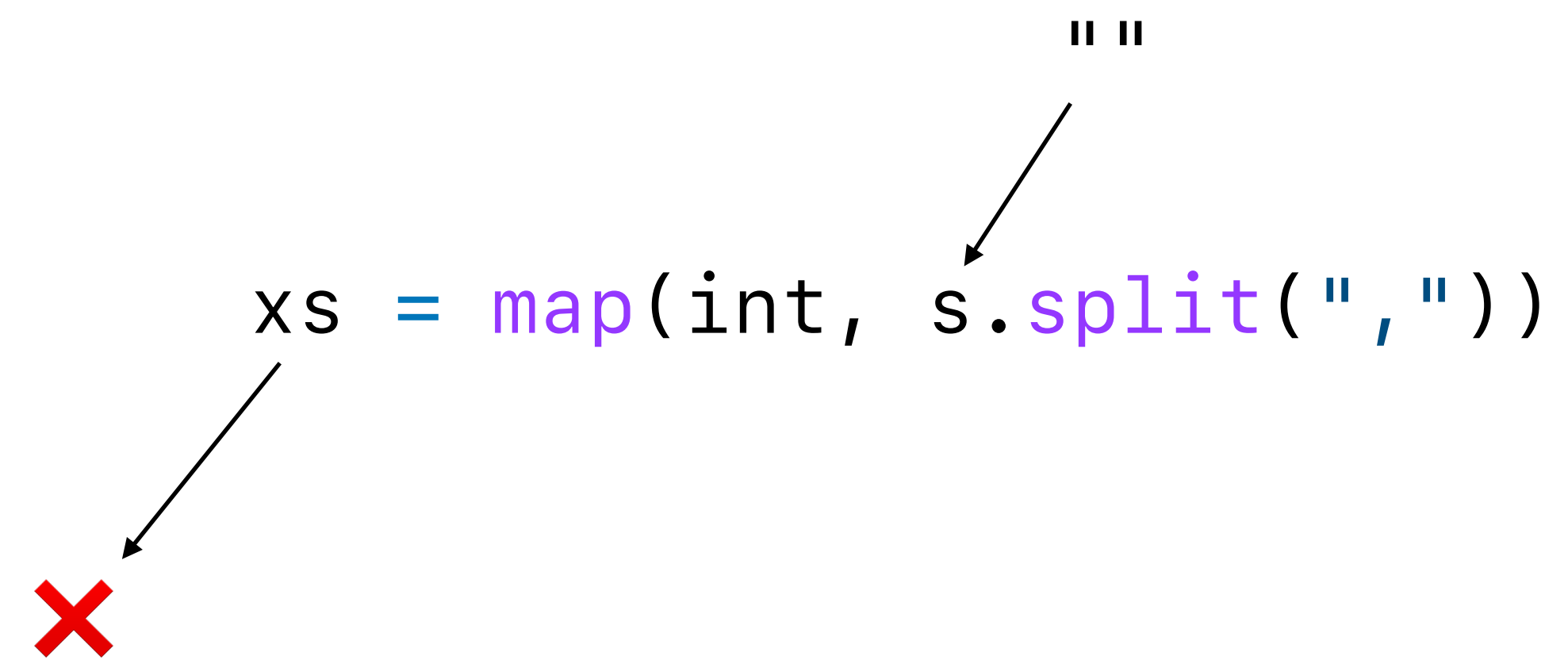
1     const React = window.React;
2
3     function csv(string) {
4         return string.split(/\s*,\s*/);
5     }
6
7     export default function IssueList({issues}) {
```

`xs = map(int, s.split(","))`

`"1,2,3"` →

→ `[1,2,3]`

xs = map(int, s.split(", "))



A diagram illustrating a variable assignment in Python. The code line is `xs = map(int, s.split(", "))`. A red 'X' is positioned to the left of the variable `xs`, with a black arrow pointing from the 'X' to `xs`. Above the comma in the `split` function, there are two double quotes `" "`, with a black arrow pointing from them to the comma.

`" + 01_2, 3_0_4 "`

`xs = map(int, s.split(","))`

`[12, 304]`

```
graph TD; A[" + 01_2, 3_0_4 "] --> B["xs = map(int, s.split(", "))"]; B --> C["[12, 304]"]
```

```
class int([x])
class int(x, base=10)
```

Return an integer object constructed from a number or string `x`, or return `0` if no argument given. If `x` defines `__int__()`, `int(x)` returns `x.__int__()`. If `x` defines `__index__()`, it returns `x.__index__()`. If `x` defines `__trunc__()`, it returns `x.__trunc__()`. For floating point numbers, this truncates towards zero.

If `x` is not a number or if `base` is given, then `x` must be a string, `bytes`, or `bytearray` instance representing an **integer literal** in radix `base`. Optionally, the literal can be preceded by `+` or `-` (space in between) and surrounded by whitespace. A base-`n` literal consists of the digits `0` through `z` (or `A` to `Z`) having values `0` to `35`. The default `base` is `10`. The allowed values are `0` to `36`. Base-`2`, `-8`, and `-16` literals can be optionally prefixed with `0b/0B`, `0o/0O`, or `0x/0X` with integer literals in code. Base `0` means to interpret exactly as a code literal, so that the base is `2`, `8`, `10`, or `16`, and so that `int('010')` is not legal while `int('010')` is as well.

```
map(function, iterable, .
```

Return an iterator that applies `function` to each item in `iterable`. If `function` is `None`, the items are passed directly to `iterable`. If `function` is not `None`, it must take that many arguments and is applied to the items from all iterables in parallel. With multiple iterables, the iterator stops when the shortest iterable is exhausted. For cases where the function inputs are already arranged into argument tuples, see `itertools.starmap()`.

```
str.split(sep=None, maxsplit=- 1)
```

Return a list of the words in the string, using `sep` as the delimiter string. If `maxsplit` is given, at most `maxsplit` splits are done (thus, the list will have at most `maxsplit+1` elements). If `maxsplit` is not specified or `-1`, then there is no limit on the number of splits (all possible splits are made).

If `sep` is given, consecutive delimiters are not grouped together and are deemed to delimit empty strings (for example, `'1,,2'.split(',')` returns `['1', '', '2']`). The `sep` argument may consist of multiple characters (for example, `'1<>2<>3'.split('<>')` returns `['1', '2', '3']`). Splitting an empty string with a specified separator returns `['']`.

For example:

```
>>> '1,2,3'.split(',')
['1', '2', '3']
>>> '1,2,3'.split(',', maxsplit=1)
['1', '2,3']
>>> '1,2,,3,'.split(',')
['1', '2', '', '3', '']
```

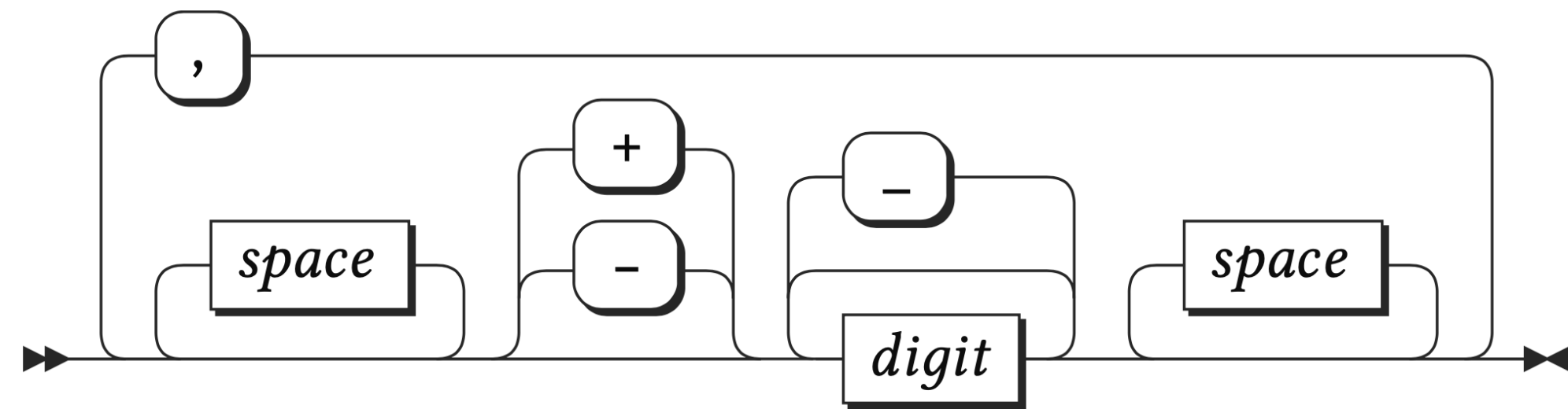
```
xs = map(int, s.split(","))
```

```
"1,2,3" → [1,2,3] ✓
```

```
" +01_2,3_0_4 " → [12,304] ✓
```

```
" " → ✗
```

```
⋮
```



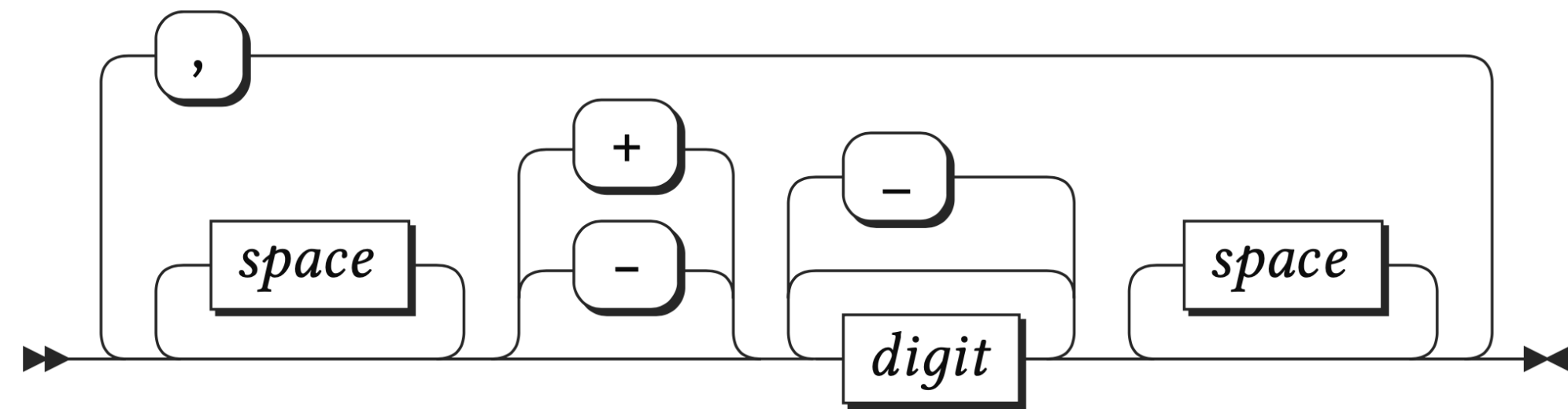
$$\begin{aligned}
 s &\rightarrow int \mid int , s \\
 int &\rightarrow space^* sign^? digit (_? digit)^* space^* \\
 digit &\rightarrow 0 \mid 1 \mid 2 \mid 3 \mid 4 \mid 5 \mid 6 \mid 7 \mid 8 \mid 9 \\
 sign &\rightarrow + \mid - \\
 space &\rightarrow _ \mid \backslash t \mid \backslash n \mid \backslash v \mid \backslash f \mid \backslash r
 \end{aligned}$$

```
xs = map(int, s.split(","))
```

"1,2,3"	→	[1,2,3]	✓
" +01_2,3_0_4 "	→	[12,304]	✓
" "	→	✗	
⋮			

The Need for Grammars

- Program Comprehension & Documentation
 - high-level data-centric perspective
 - diverse notations: regex, ABNF, PEG, state machine, railroad diagram,...
- Fuzzing
 - systematically generate random test inputs
 - grammar-based fuzzers can penetrate into deep program states (past syntactic checks)
- Language-Theoretic Reasoning
 - safety of parsers is connected to theoretic properties (e.g., computability bounds)
 - input languages should be minimally powerful
 - <https://langsec.org> [LANGSEC] regards the Internet insecurity epidemic as a consequence of *ad hoc* programming of input handling [...]



$$\begin{aligned}
 s &\rightarrow int \mid int \ , \ s \\
 int &\rightarrow space^* sign^? digit \ (_? digit)^* space^* \\
 digit &\rightarrow 0 \mid 1 \mid 2 \mid 3 \mid 4 \mid 5 \mid 6 \mid 7 \mid 8 \mid 9 \\
 sign &\rightarrow + \mid - \\
 space &\rightarrow _ \mid \backslash t \mid \backslash n \mid \backslash v \mid \backslash f \mid \backslash r
 \end{aligned}$$

```
xs = map(int, s.split(","))
```

Parser : Grammar $\approx$ Function : Type

Type Inference

```
xs = map(int, s.split(", "))
```

Diagram illustrating the types of variables and functions in the code snippet:

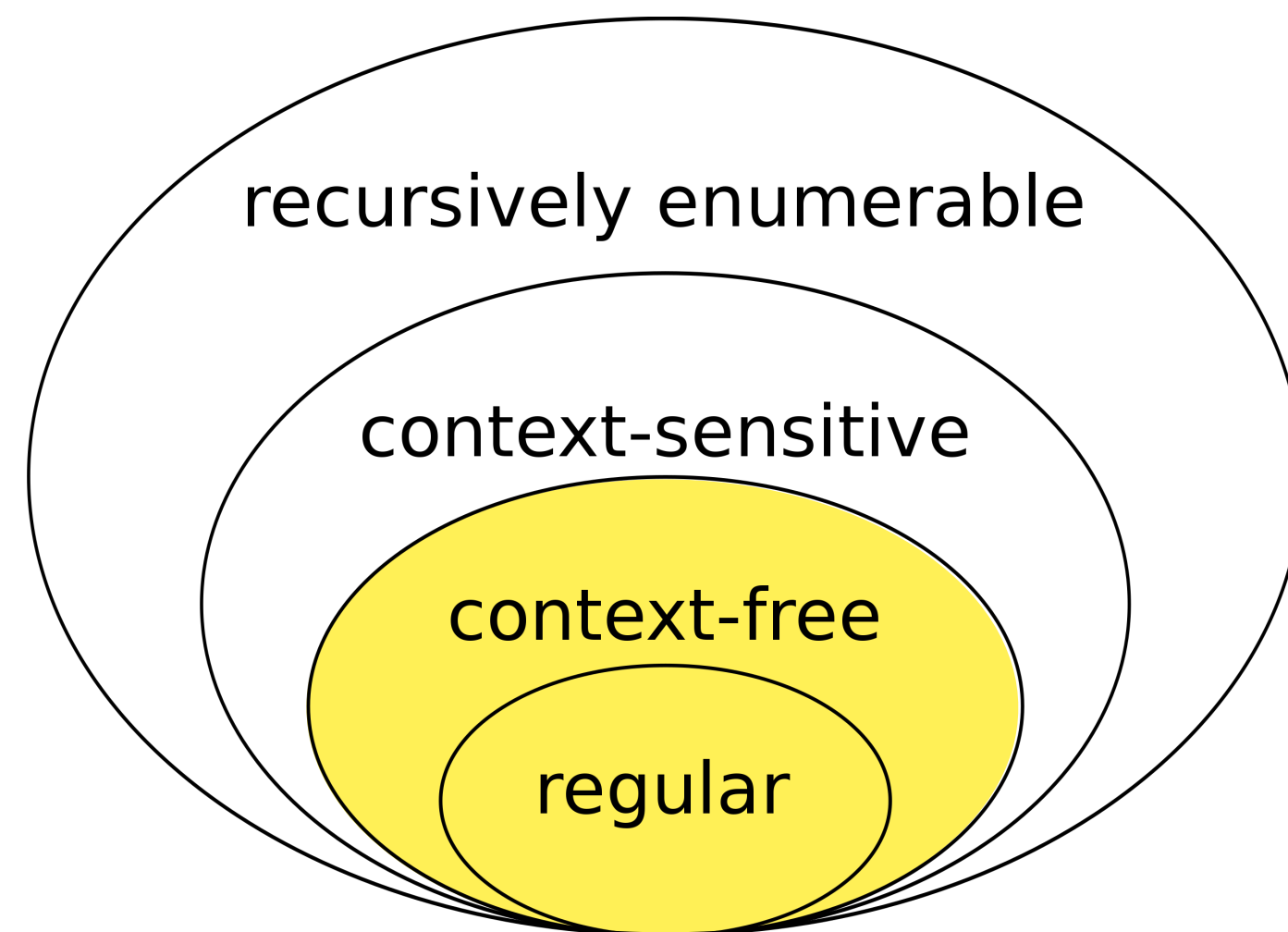
- `xs` is annotated with `[Int]`, indicating it is a list of integers.
- `map` is a function that takes a function (like `int`) and a collection (like `s.split(", ")`) as arguments.
- `int` is a function that takes a string (like `"1"`) and returns an integer (like `1`).
- `s` is annotated with `String`, indicating it is a string.
- `split(", ")` is a method on the `String` object that returns a list of strings (like `["1", "2", "3"]`).

✨ Grammar Inference ✨

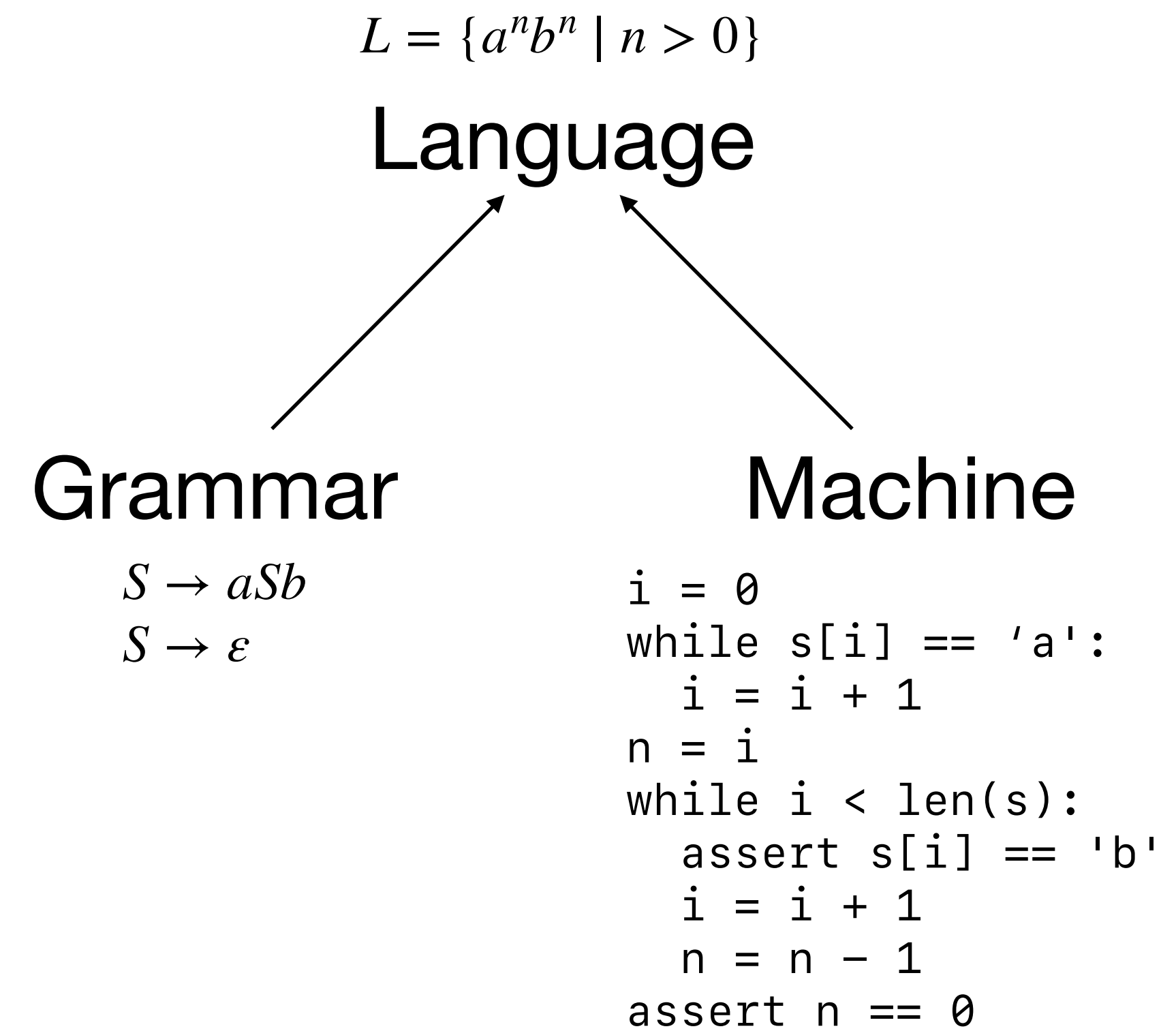
$$s \rightarrow int \mid int , s$$
$$int \rightarrow space^* sign^? digit (_? digit)^* space^*$$
$$digit \rightarrow 0 \mid 1 \mid 2 \mid 3 \mid 4 \mid 5 \mid 6 \mid 7 \mid 8 \mid 9$$
$$sign \rightarrow + \mid -$$
$$space \rightarrow _ \mid \backslash t \mid \backslash n \mid \backslash v \mid \backslash f \mid \backslash r$$

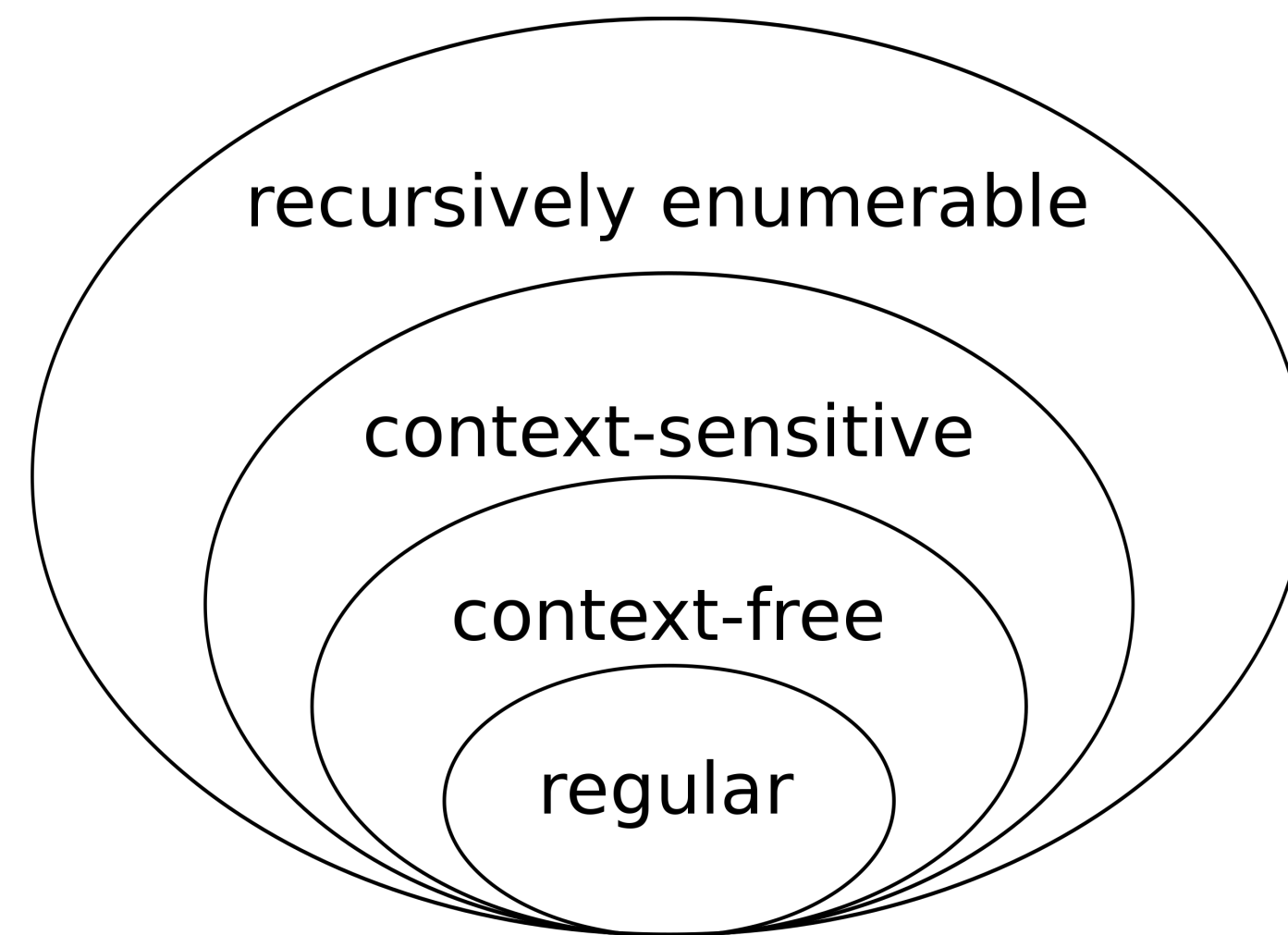
$[Int]$ `xs = map(int, s.split(","))` `String {•}`

Toward Grammar Inference



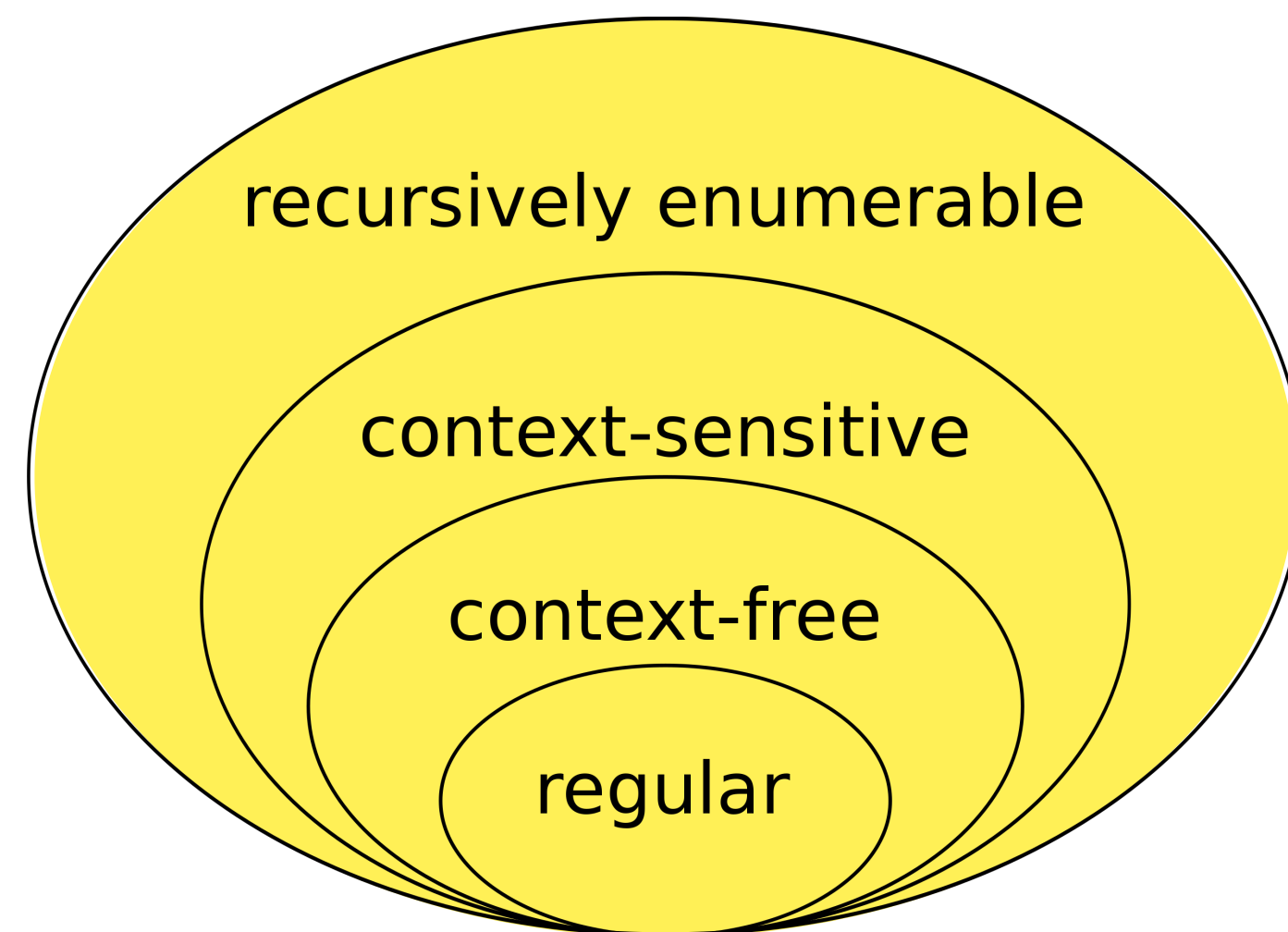
The Chomsky hierarchy





The Chomsky hierarchy

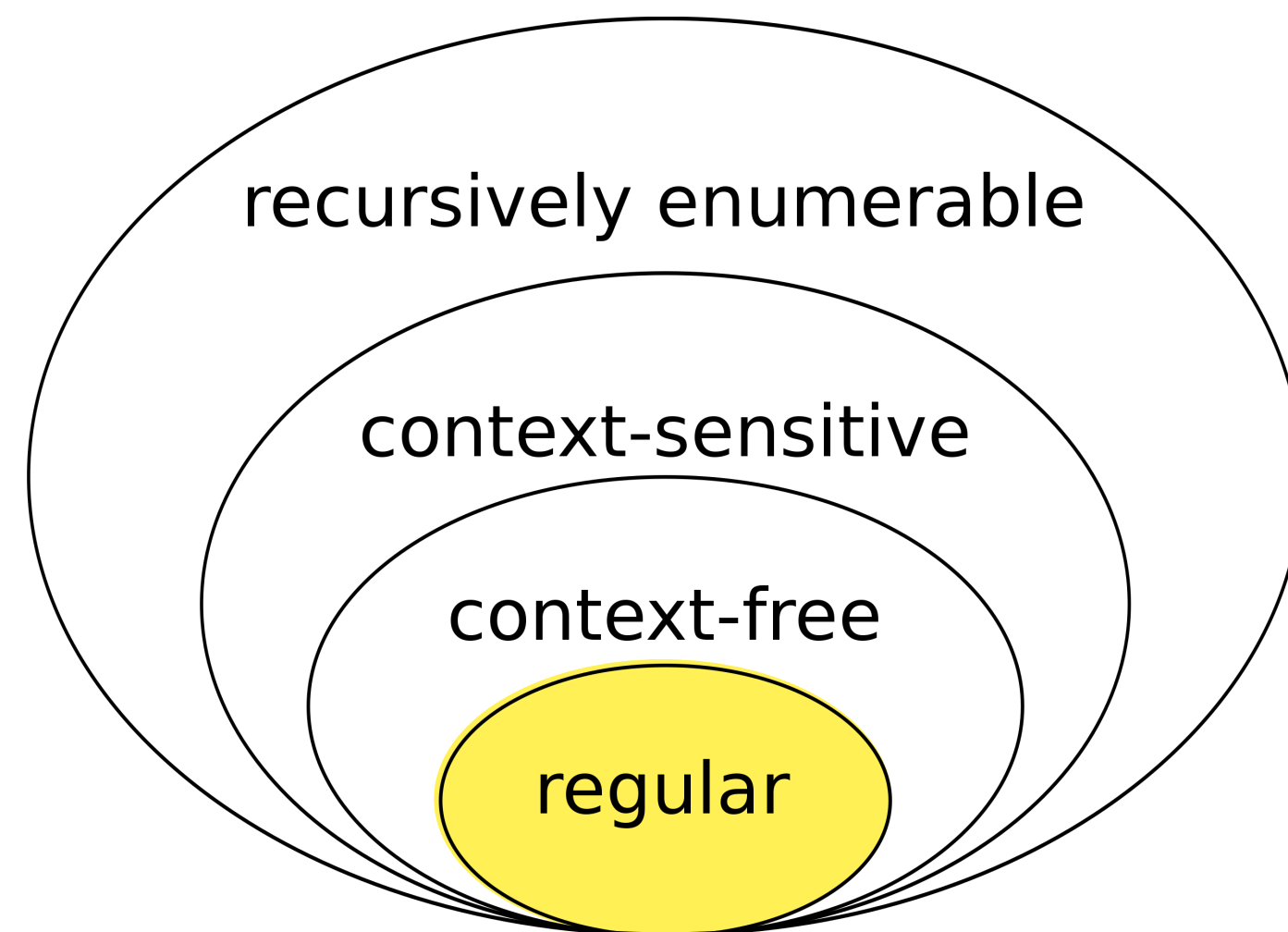
```
01 import math
02
03 while True:
04     line = input("enter 3d vector: ")
05     xs = line.split(",")
06     if len(xs) == 3: break
07     else: print("please try again.")
08
09 [x,y,z] = map(int, xs)
10 n = math.sqrt(x**2 + y**2 + z**2)
11 print(f"vector length: {n}")
```



The Chomsky hierarchy

```
01 import math
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03 while True:
04     line = input("enter 3d vector: ")
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```

Intuition: Parsers are Embedded Machines



The Chomsky hierarchy

```
01 import math
02
03 while True:
04     line = input("enter 3d vector: ")
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06     if len(xs) == 3: break
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08
09     [x,y,z] = map(int, xs)
10     n = math.sqrt(x**2 + y**2 + z**2)
11     print(f"vector length: {n}")
```

Vision: Automatic Grammar Inference

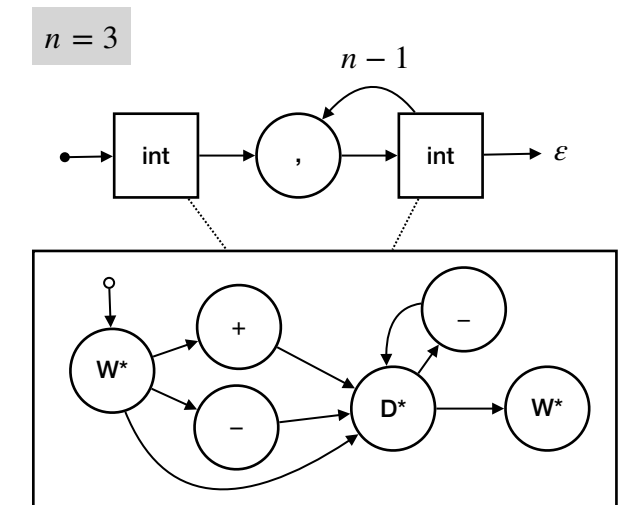
Source Function Specifications

$\text{split}_{\text{py}} : \{d : \mathbb{S} \mid \text{len}(d) \geq 0\} \rightarrow s : \mathbb{S} \rightarrow \{l : [\mathbb{S}] \mid \text{len}(l) \geq 1 \wedge s = l_0 \cdot \prod_{i=1}^{\text{len}(l)-1} (d \cdot l_i)\}$
 $\text{int}_{\text{py}} : \{s : \mathbb{S} \mid s = W^* \cdot (+|-)^? \cdot D \cdot (\cdot? \cdot D)^* \cdot W^* \} \rightarrow \mathbb{Z}$

Refinement Type System

$\frac{}{\{v_1 : b \mid p_1\} <: \{v_2 : b \mid p_2\} \Rightarrow \forall v_1 : b. p_1 \Rightarrow p_2[v_1/v_2]} \text{SUB-BASE}$
 $\frac{s_2 <: s_1 \Rightarrow C_I \quad t_1[x_2/x_1] <: t_2 \Rightarrow C_O}{x_1 : s_1 \rightarrow t_1 <: x_2 : s_2 \rightarrow t_2 \Rightarrow C_I \wedge (x_2 :: s_2 \Rightarrow C_O)} \text{SUB-FUN}$
 $\frac{\Gamma \vdash e \nearrow s \Rightarrow C_1 \quad \Gamma \vdash s <: t \Rightarrow C_2}{\Gamma \vdash e \nearrow t \Rightarrow C_1 \wedge C_2} \text{CHK-SYN} \quad \frac{\Gamma(x) = t}{\Gamma \vdash x \nearrow t \Rightarrow \top} \text{SY}$

Language Model



```

01 import math
02
03 while True:
04     line = input("enter 3d vector: ")
05     xs = line.split(",")
06     if len(xs) == 3: break
07     else: print("please try again.")
08
09 [x,y,z] = map(int, xs)
10 n = math.sqrt(x**2 + y**2 + z**2)
11 print(f"vector length: {n}")
    
```

Ad Hoc Parser Source Code

Simplification

```

λs.
  let v1 = splitpy "," s in
  let xs = map intpy v1 in
  let v2 = length xs in
  let v3 = equals 3 v2 in
  assert v3
    
```

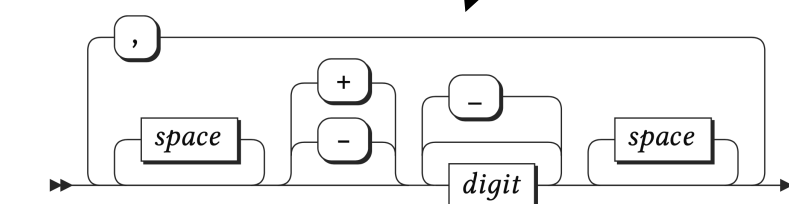
Intermediate Representation

Inference

Synthesis

$s \rightarrow \text{int} \mid \text{int}, s$
 $\text{int} \rightarrow \text{space}^* \text{sign}^? \text{digit} (\cdot? \text{digit})^* \text{space}^*$
 $\text{digit} \rightarrow 0 \mid 1 \mid 2 \mid 3 \mid 4 \mid 5 \mid 6 \mid 7 \mid 8 \mid 9$
 $\text{sign} \rightarrow + \mid -$
 $\text{space} \rightarrow _ \mid \backslash \text{t} \mid \backslash \text{n} \mid \backslash \text{v} \mid \backslash \text{f} \mid \backslash \text{r}$

Grammar



Visualization

work in progress

New Possibilities

Interactive Documentation



- inferred grammar is always up-to-date
- closely linked to underlying source code

Inferred grammar:

$$\begin{aligned}\text{pred} &\rightarrow a = v_1 \mid a \circ v_2 \\ a &\rightarrow (\Sigma \backslash o)^* \\ v_1 &\rightarrow \Sigma^* \\ v_2 &\rightarrow \text{eval} \\ o &\rightarrow < \mid <= \mid > \mid >= \end{aligned}$$

```
01 def pred(s):
02     ops = r"(<|<=|>|>=)"
03     a,o,v = re.split(ops, s)
04     if o[0] == "<" or o[0] == ">":
05         v = eval(v)
06     return p(a,o,v)
```

Inferred grammar:

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Inferred grammar:

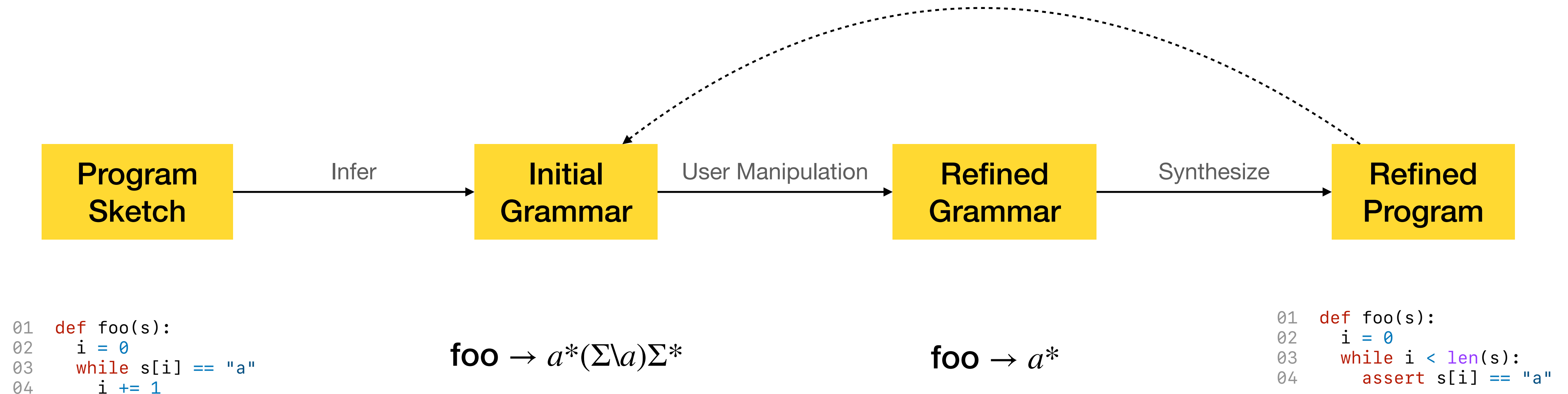
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05         v = eval(v)
06     return p(a,o,v)
```

Bi-Directional Parser Synthesis



- semantic program transformation via inferred grammar
 - program sketching



Mining & Learning



- grammar as *equivalence class* over concrete implementations
 - detecting code clones of ad hoc parsers
 - grammar-enhanced semantic code search



Viewer.py2 matches | Python

```
640     ranges = self.find_ranges()
641     split = str.split
642     point = map(int, split(self.text.index(CURRENT), ','))
643     for start, end in ranges:
644         startv = map(int, split(start, ','))
```

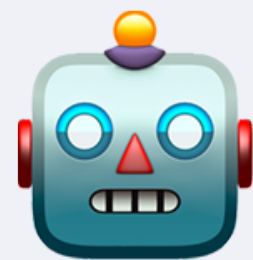
transformScriptTags.ts1 match | TypeScript

```
122         return null;
123     }
124     return rawValue.split(",").map(item => parseInt(item));
125 }
126
```

Mining & Learning



- learn how implicit input specifications evolve over time
 - grammar-aware semantic change tracking



⚠ Merging #420 (6a36b23) into main (224b18b) will change the input grammar of a function.

Before:

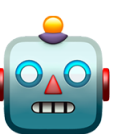
$\text{baz} \rightarrow a^*b$

After:

$\text{baz} \rightarrow \Sigma a^*b$

```
18 18  def baz(s):
19 -   i = 0
19 +   i = 1
20 20   while s[i] == "a"
21 21       i += 1
22 22   assert s[i] == "b"
```

Future Plans

-  mining study of ad hoc parsers in the wild ongoing
-  grammar inference via refinement types of simplified parsing IR ongoing
-  proving soundness of simplification and inference steps tbd
-  evaluation on corpus of curated ad hoc parser samples tbd
-  large-scale mining study of inferred grammars tbd
-  user studies on grammar comprehension tbd

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New Ideas and Emerging Results, ICSE 2022
Pittsburgh, PA, USA



Informatics