# Origami: (un)folding the abstraction of recursion schemes for program synthesis

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# **Origami: Program Synthesis by (un)Folding**





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- Common patterns observed in different programs: make it generic and reusable!
- Focus on the specificities instead of the repetitive part



## A very general (and unknown) programming paradigm called **Origami Programming** exploits the combination of the recursion schemes of **consuming** (fold) and **producing** (unfold) values to implement algorithms.



- The recursion (of the consumer) will always terminate!
- Focus on the important part of the program
- Can be automatically optimized
- Easier to visualize and describe the program flow



Simplify the program synthesis problem to exploit these abstractions and simplifying the search through two steps:

- 1. Pick a pattern
- 2. Evolve specific parts of this pattern



# data List b a = Nil | Cons b a 1 2 3

- 1. Null list
- 2. Current element of the list
- 3. Current accumulated value of the folding process



This is the fold-right function: the right associative folding.

#### Sub-patterns of catamorphism

Considering algorithms involving lists:

- **Reducing:** Type signature [a] -> b, consumes all of the elements until only a single value remains.
- **Mapping:** Type signature [a] -> [b], applies a function to every element of our container.
- Function: Type signature [a] -> [a] -> b, it takes two containers and returns a value of type b.
- Composition: Composition of any of the previous patterns, e.g., [a]
   -> (b, [c]).



*Syllables (A 1)* Given a string containing symbols, spaces, digits, and lowercase letters, count the number of occurrences of vowels (a, e, i, o, u, y) in the string and print that number as X in The number of syllables is X.



syllables :: String -> Int
syllables xs = cata alg xs

alg Nil =  $\underline{e1}$  -- this can only be a constant alg (Cons x xs) =  $\underline{e2}$ 



syllables :: String -> Int
syllables xs = cata alg xs



syllables :: String -> Int
syllables xs = cata alg xs

alg Nil =  $\underline{0}$ alg (Cons x xs) = <u>if isVowel x then xs + 1 else xs</u>



#### In python:

```
def syllables(my_string):
    count = 0
    for c in my_string:
        if isVowel(c):
            count = count + 1
    return count
```

**GPSB** 





Figura 1: Distribution of recursion schemes used to solve the GPSB problems.



We adapted HOTGP to evolve just the main function of **reducing**, **mapping**, **composition** patterns in catamorphism. For this experiment we provided the choice of pattern and initial values.

	Origami	HOTGP	DSLS	PushGP	G3P	CBGP	G3P+
count-odds	95	50	11	8	12	4	0
double-letters	91	0	50	6	0	0	_
negative-to-zero	100	100	82	45	63	24	99
replace-space-with-newline	63	38	100	51	0	29	0
scrabble-score	100	_	31	2	2	1	_
string-lengths-backwards	94	89	95	66	68	20	_
syllables	66	0	64	18	0	53	-



#### • Catamorphism:

- Reducing
- Mapping
- Function
- Composition
- Anamorphism
- Hylomorphism (cata followed by ana)
- Accumorphism (fold-left):
  - Indexed traversal
  - Catamorphisms with post-processing



- **Para** / **Apo:** folding and unfolding with access to downward elements of the structure.
- **Mutu** / **Comutu:** fold with mutual recursion (even/odd) or unfolding a seed into two or more structures.
- **Histo** / **Dyna** / **Futu:** folding with access to sub-results, dynamic programming, and generating multiple layers.
- **Indexed catamorphism:** support to nested data structures and type-safe structures
- **Monadic morphisms:** same morphisms with support to monads (e.g., state handling, IO, etc.)



- Keep solving benchmark problems using recursion schemes
- Implement a simple breadth-search that searches all patterns in parallel
- Add support to different recursion schemes and base structure



### Questions





# **Spare slides**





**Super Anagrams (P 7.3)** Given strings x and y of lowercase letters, return true if y is a super anagram of x, which is the case if every character in x is in y. To be true, y may contain extra characters, but must have at least as many copies of each character as x does. \end{displayquote}

#### **Generating a Function**



```
superAnagram :: String -> String -> Bool
superAnagram = cata alg . fromList
where
alg NilF ys = True
alg (ConsF x xs) ys = (not.null) ys && elem x ys && xs (dele
In Python:
```

```
def superAnagram(xs, ys):
    for x in xs:
        if not null(ys) and x in ys:
            ys.delete(x)
        else:
            return False
    return True
```



This pattern represents the unfolding:



**Digits (A 6)** Given an integer, print that integer's digits each on their own line starting with the least significant digit. A negative integer should have the negative sign printed before the most significant digit.



```
digits :: Int -> [Int]
digits x = toList $ ana coalg x
  where
    coalg x =
       case x == 0 of
         True -> NilF
         False -> ConsF (if abs x < 10
                                then (x \text{ 'rem' } 10)
                                else abs (x 'rem' 10))
                             (x 'quot' 10)
```