

From structured theories to efficient code in 6 *easy* steps

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contains work (past and present) done with William M. Farmer, Russell O'Connor, Spencer Smith, Mustafa Elsheik, Oleg Kiselyov, Ken Shan and Tom Andersen.

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Context and goals

MathScheme: a **Mechanized Mathematics System**

- Join **Symbolic Computation**, **Computer Algebra** and **Theorem Proving**

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- Generative

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Method:

- Generative
- **Leverage known information**

The 6 steps

Colimit of diagrams, fibered functors



Concepts and theory combinators



Algebraic theories



Biform theories



Generic algorithm



Library



Efficient Program

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Efficient Program

Generic efficiency

Generic algorithms $\xRightarrow{\text{instantiate}}$ Library $\xRightarrow{\text{use}}$ Efficient Program

ex: LAPACK, NAG. SPIRAL.

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ex: C++ Templates. BOOST++, Linbox.

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Library of generic algorithm interfaces $\xRightarrow{\text{dispatch by use}}$ Efficient? Program

ex: Maple's Linear Algebra.

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ex: Maple's Linear Algebra.

Library of generic algorithm $\xRightarrow{\text{dynamic dispatch}}$ Slow Program

ex: Maple's Domains, most OO languages.

Generating extensions

Library of generic algorithms $\xRightarrow{\text{resolve}}$ Program

Resolve at compile time: instantiate. Resolve at run time: dispatch.

Build a **typed generating extension**:

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Theory for 2–3:

J. Carette, O. Kiselyov, C.-c. Shan, *Finally tagless, partially evaluated: tagless staged interpreters for simpler typed languages*, Journal of Functional Programming, 19 (5):509–543, 2009.

Examples:

J. Carette, M. Elsheik, S. Smith. *Generative Geometric Kernel*, PEPM 2011.

J. Carette, O. Kiselyov, *Multi-stage programming with functors and monads: eliminating abstraction overhead from generic code*, Science of Computer Programming, 76(5):53–62, 2011.

Values, code and syntax

Domain	3	is really	write as
value	3	{{}, {{}}, {}, {{{}}}	
code	3	00000011	
syntax	3	trois	

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Furthermore: code is **opaque**, syntax is **not**.

A Maple analogy: $2 * 3$ vs $() \rightarrow 2 * 3$ vs $2 \&* 3$

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Code generation: **syntax** \Rightarrow **code**.

Staged program: manipulates both **values** and **code**.

type ('a,'b) staged = Now of 'b | Later of ('a,'b) **code**

Going generic, then generative

```
let rec norm = function
  | [] -> 0.
  | x::xs -> abs_float x +. norm xs
> val norm : float list -> float = <fun>
```

Going generic, then generative

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let rec norm = function
  | [] -> 0.
  | x::xs -> abs_float x +. norm xs
```

Generalize the type of “numbers” to a “normed set” NS over an arbitrary commutative monoid CM.

```
let rec norm = function
  | [] -> NS.CM.zero
  | x::xs -> NS.CM.plus (NS.norm x) (norm xs)
> val norm : NS.n list -> NS.CM.n = <fun>
```


Going generic, then generative

```
let rec norm = function
  | [] -> 0.
  | x::xs -> abs_float x +. norm xs
```

Lift from the normed set type to a staged version

```
let rec norm = function
  | [] -> Staged.of_immediate NS.CM.zero
  | x::xs -> NS.CM.plus_s (NS.norm_s x) (norm xs)
> val norm : ('a,NS.n) staged list -> ('a,NS.CM.n) staged
```

Going generic, then generative

```
let rec norm = function  
  | [] -> 0.  
  | x::xs -> abs_float x +. norm xs
```

norm is parametric in NS:

```
module GenericNorm (NS : NORMED_SET) = struct  
  let rec norm = function  
    | [] -> Staged.of_immediate NS.CM.zero  
    | x::xs -> NS.CM.plus_s (NS.norm_s x) (norm xs)  
end
```

Going generic, then generative

```
let rec norm = function
  | [] -> 0.
  | x::xs -> abs_float x +. norm xs
```

Abstracting the container (recursion pattern is a mapfold, also known as MapReduce; repeat previous 3 steps):

```
module GenericNorm(NS : NORMED_SET)
  (C: FOLDABLE with t = CM.n) = struct
  let norm = C.mapfold(NS.norm_s)(NS.CM.plus_s)
    (Staged.of_immediate NS.CM.zero)
end
```

Now generic over: container, normed set and stage.

Going generic, then generative

```
let rec norm = function
  | [] -> 0.
  | x::xs -> abs_float x +. norm xs
```

Collecting variabilities:

```
module type NORM_VAR = sig
  module NS : NORMED_SET
  module C : FOLDABLE with t = NS.n
end
```

and build a generator:

```
module GenNorm (NV : NORM_VAR) = struct
  let gen_norm () =
    let module GP = GenericNorm(NV.NS)(NV.C) in
    .< fun x -> .~(Staged.to_code
      (GP.norm (Staged.of_atom .<x>.))) >.
end
```

Going generic, then generative

```
let rec norm = function
  | [] -> 0.
  | x::xs -> abs_float x +. norm xs
```

or run it now:

```
module Norm (NV : NORM_VAR) = struct
  let norm x =
    let module GP = GenericNorm(NV.NS)(NV.C) in
    GP.norm (Staged.of_immediate x)
end
```

Going generic, then generative

```
let rec norm = function  
  | [] -> 0.  
  | x::xs -> abs_float x +. norm xs
```

Generated code example with a generic 3-tuple container:

```
.< fun x -> let (a,b,c) = x in abs a + abs b + abs c >.
```

Going generic, then generative

```
let rec norm = function
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```

Generated code example with a generic 3-tuple container:

```
.< fun x -> let (a,b,c) = x in abs a + abs b + abs c >.
```

Or on the explicit list [1.; 0.; 3.; .<y>. ; .<z>.]

```
.<4. + abs_float y + abs_float z>.
```

(which is “just” symbolic computation!)

Example: Generative Geometric Kernel (GGK)

High-level picture:

Geometric Objects
Affine Space
Linear Algebra
Number Types / Abstract Algebra
Code

Example: Generative Geometric Kernel (GGK)

Drill-down:

	Orientation	Inside	Simplex
Geometric	Vertex	Sidedness	Hypersphere
Objects	Insphere	Hyperplane Operations	Hyperplane

Affine Space	Vector	Affine Transforms	Point
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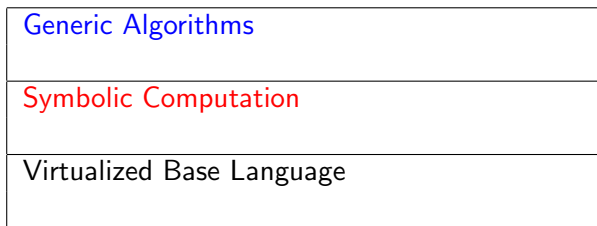
Linear Algebra	Tuple	Matrix	Determinant
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Algebra	RealField	Order	Field
	Set	Ring	Monoid

Code	Staged Types
	Base Types

Example: Generative Geometric Kernel (GGK)

Architecture:



Example: Generative Geometric Kernel (GGK)

Architecture:

Generic Algorithms

Polymorphic over data rep., domain, stage, ...

Symbolic Computation

Symbol shuffling with a purpose

Virtualized Base Language

staged, overloaded language w/ simplification

Colimit of diagrams, fibered functors



Concepts and theory combinators



Algebraic theories



Biform theories



Generic algorithm



Library



Efficient Program

Algebraic Theories

```
Monoid := Theory {  
  U : type;  
  * : (U, U) → U;  
  e : U;  
  axiom rightIdentity_*_e : forall x:U. x*e = x;  
  axiom leftIdentity_*_e : forall x:U. e*x = x;  
  axiom associative_* : forall x,y,z:U. (x*y)*z=x*(y*z)}
```

Algebraic Theories

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```

```
CommutativeMonoid := Theory {  
  U : type;  
  * : (U, U) → U;  
  e : U;  
  axiom rightIdentity_*_e : forall x:U. x*e = x;  
  axiom leftIdentity_*_e : forall x:U. e*x = x;  
  axiom associative_* : forall x,y,z:U. (x*y)*z=x*(y*z)  
  axiom commutative_* : forall x,y,z:U. x*y=y*x}
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Algebraic Theories

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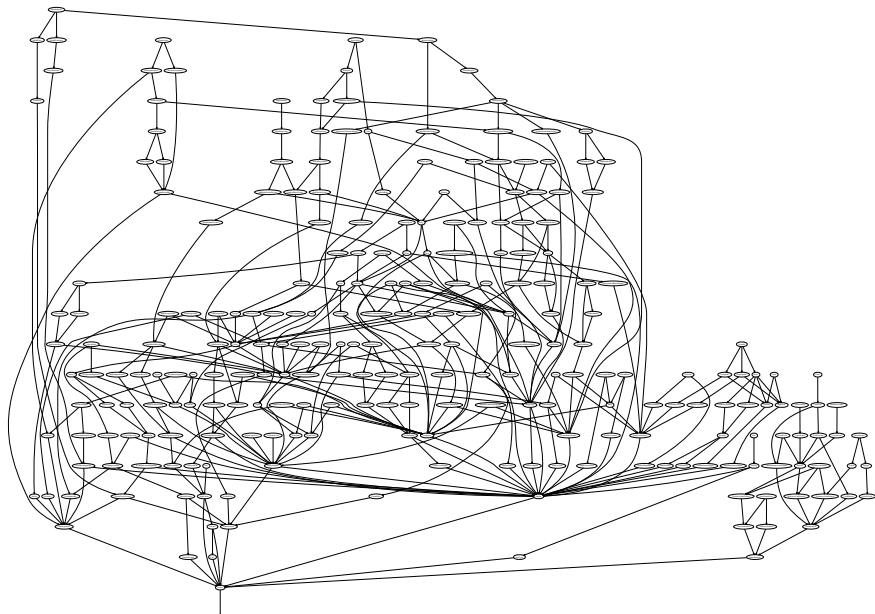
```
AdditiveMonoid := Theory {  
  U : type;  
  + : (U, U) → U;  
  0 : U;  
  axiom rightIdentity_+_0 : forall x:U. x+0 = x;  
  axiom leftIdentity_+_0 : forall x:U. 0+x = x;  
  axiom associative_+ : forall x,y,z:U. (x+y)+z=x+(y+z) }
```


Algebraic Theories

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Monoid := Theory {  
  U : type;  
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```

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AdditiveCommutativeMonoid := Theory {  
  U : type;  
  + : (U, U) → U;  
  0 : U;  
  axiom rightIdentity_+_0 : forall x:U. x+0 = x;  
  axiom leftIdentity_+_0 : forall x:U. 0+x = x;  
  axiom associative_+ : forall x,y,z:U. (x+y)+z=x+(y+z)  
  axiom commutative_+ : forall x,y,z:U. x+y=y+x}
```

A fraction of the Algebraic Zoo



Combinators for theories

Extension:

`CommutativeMonoid := Monoid extended by {
 axiom commutative_* : forall x,y,z:U. x*y=y*x}`

Combinators for theories

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Renaming:

AdditiveMonoid := Monoid[* |-> +, e |-> 0]

Combinators for theories

Extension:

CommutativeMonoid := Monoid extended by {
 axiom commutative_* : forall x,y,z:U. x*y=y*x}

Renaming:

AdditiveMonoid := Monoid[* |-> +, e |-> 0]

Combination:

AdditiveCommutativeMonoid :=
 combine AdditiveMonoid, CommutativeMonoid over Monoid

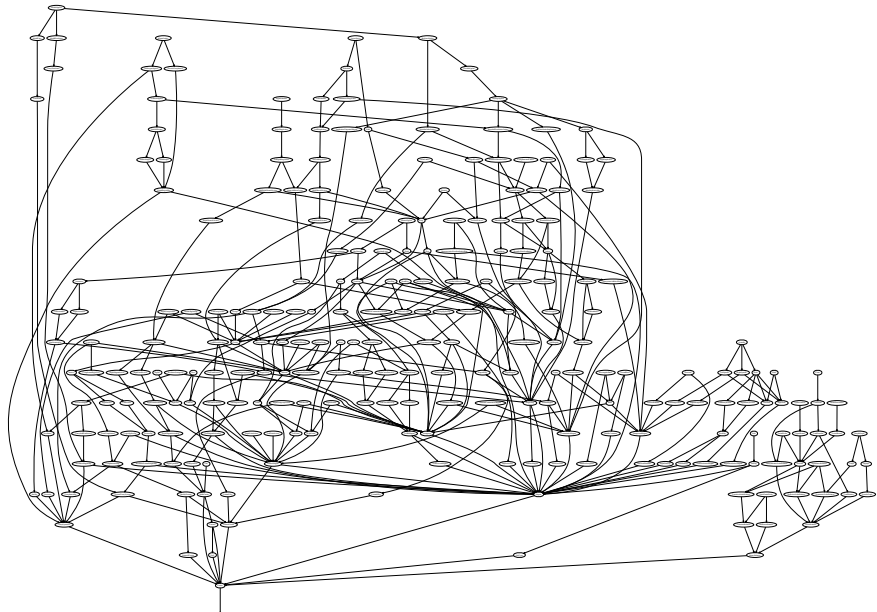
Library fragment 1

```
MoufangLoop := combine Loop, MoufangIdentity over Magma
LeftShelfSig := Magma[ * |-> |> ]
LeftShelf := LeftDistributiveMagma [ * |-> |> ]
RightShelfSig := Magma[ * |-> <| ]
RightShelf := RightDistributiveMagma[ * |-> <| ]
RackSig := combine LeftShelfSig, RightShelfSig over Carrier
Shelf := combine LeftShelf, RightShelf over RackSig
LeftBinaryInverse := RackSig extended by {
  axiom leftInverse_|>_|<| : forall x,y:U. (x |> y) <| x = y }
RightBinaryInverse := RackSig extended by {
  axiom rightInverse_|>_|<| : forall x,y:U. x |> (y <| x) = y }
Rack := combine RightShelf, LeftShelf, LeftBinaryInverse,
  RightBinaryInverse over RackSig
LeftIdempotence := IdempotentMagma[ * |-> |> ]
RightIdempotence := IdempotentMagma[ * |-> <| ]
LeftSpindle := combine LeftShelf, LeftIdempotence over LeftShelfSig
RightSpindle := combine RightShelf, RightIdempotence over RightShelfSig
Quandle := combine Rack, LeftSpindle, RightSpindle over Shelf
```

Library fragment 2

```
NearSemiring := combine AdditiveSemigroup, Semigroup, RightRingoid over
NearSemifield := combine NearSemiring, Group over Semigroup
Semifield := combine NearSemifield, LeftRingoid over RingoidSig
NearRing := combine AdditiveGroup, Semigroup, RightRingoid over Ringoid
Rng := combine AbelianAdditiveGroup, Semigroup, Ringoid over RingoidSig
Semiring := combine AdditiveCommutativeMonoid, Monoid1, Ringoid, Left0
SemiRng := combine AdditiveCommutativeMonoid, Semigroup, Ringoid over
Dioid := combine Semiring, IdempotentAdditiveMagma over AdditiveMagma
Ring := combine Rng, Semiring over SemiRng
CommutativeRing := combine Ring, CommutativeMagma over Magma
BooleanRing := combine CommutativeRing, IdempotentMagma over Magma
NoZeroDivisors := Ringoid0Sig extended by {
  axiom onlyZeroDivisor_*_0: forall x:U.
    ((exists b:U. x*b = 0) and (exists b:U. b*x = 0)) implies (x = 0)
}
Domain := combine Ring, NoZeroDivisors over Ringoid0Sig
IntegralDomain := combine CommutativeRing, NoZeroDivisors over Ringoid
DivisionRing := Ring extended by {
  axiom divisible : forall x:U. not (x=0) implies
    ((exists! y:U. y*x = 1) and (exists! y:U. x*y = 1)) }
Field := combine DivisionRing, IntegralDomain over Ring
```

The Algebraic Zoo again



Colimit of diagrams, fibered functors



Concepts and theory combinators



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Generic algorithm



Library



Efficient Program

A little theory

Given some dependent type theory, its category of contexts \mathbb{C} has objects

$$\Gamma := \langle x_0 : \sigma_0; \dots; x_{n-1} : \sigma_{n-1} \rangle,$$

such that for each $i < n$ the judgement

$$\langle x_0 : \sigma_0; \dots; x_{i-1} : \sigma_{i-1} \rangle \vdash \sigma_i : \text{Type (or : Prop)}$$

holds. A morphism $\Gamma \rightarrow \Delta (= \langle y : \sigma \rangle_0^{m-1})$ is an assignment (substitution) $[y_0 \mapsto t_0, \dots, y_m \mapsto t_{m-1}]$ such that

$$\Gamma \vdash t_0 : \tau_0 \quad \dots \quad \Gamma \vdash t_{m-1} : \tau_{m-1} [y \mapsto t]_0^{m-2}$$

$$\begin{array}{ccc} \Gamma^+ & \xrightarrow{f^+} & \Delta^+ \\ \downarrow A & & \downarrow B \\ \Gamma & \xrightarrow{f^-} & \Delta \end{array}$$

Definition

The category of general extensions \mathbb{E} has all general extensions from \mathbb{B} as objects, and given two general extensions $A : \Gamma^+ \rightarrow \Gamma$ and $B : \Delta^+ \rightarrow \Delta$, an arrow $f : A \rightarrow B$ is a commutative square from \mathbb{B} .

and just a bit more theory

Theorem

The functor $\text{cod} : \mathbb{E} \rightarrow \mathbb{B}$ is a fibration.

and just a bit more theory

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The functor $\text{cod} : \mathbb{E} \rightarrow \mathbb{B}$ is a fibration.

$a, b, c \in \text{labels}$	$\tau \in \text{Type}$	$\text{tpc} ::= \text{extend } A \text{ by } \{I\}$
$A, B, C \in \text{names}$	$k \in \text{Kind}$	$\text{combine } A \ r_1, \ B \ r_2$
$l \in \text{judgments}^*$	$t \in \text{Term}$	$A ; B$
$r \in (a_i \mapsto b_i)^*$	$\theta \in \text{Prop}$	$A \ r$
		Empty
		$\text{Theory } \{I\}$

and just a bit more theory

Theorem

The functor $\text{cod} : \mathbb{E} \rightarrow \mathbb{B}$ is a fibration.

$$\llbracket - \rrbracket_{\mathbb{B}} : \text{tpc} \rightarrow |\mathbb{B}|$$

$$\llbracket \text{Empty} \rrbracket_{\mathbb{B}} = \langle \rangle$$

$$\llbracket \text{Theory } \{I\} \rrbracket_{\mathbb{B}} \cong \langle I \rangle$$

$$\llbracket A \ r \rrbracket_{\mathbb{B}} = \llbracket r \rrbracket_{\pi} \cdot \llbracket A \rrbracket_{\mathbb{B}}$$

$$\llbracket A; B \rrbracket_{\mathbb{B}} = \llbracket B \rrbracket_{\mathbb{B}}$$

$$\llbracket \text{extend } A \text{ by } \{I\} \rrbracket_{\mathbb{B}} \cong \llbracket A \rrbracket_{\mathbb{B}} \circ \langle I \rangle$$

$$\llbracket \text{combine } A_1 r_1, A_2 r_2 \rrbracket_{\mathbb{B}} \cong D$$

$$\begin{array}{ccc} D & \xrightarrow{\llbracket r_1 \rrbracket_{\pi} \circ \delta_{A_1}} & A_1 \\ \downarrow & & \downarrow \delta_A \\ & \llbracket r_2 \rrbracket_{\pi} \circ \delta_{A_2} & \\ A_2 & \xrightarrow{\delta_A} & A \end{array}$$

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$$\cong \llbracket r_2 \rrbracket_{\pi} \circ \delta_{T_2} \circ \llbracket A_2 \rrbracket_{\mathbb{E}}$$

$$\begin{array}{ccc} D & \xrightarrow{\llbracket r_1 \rrbracket_{\pi} \circ \delta_{T_1}} & T_1 \\ \downarrow \llbracket r_2 \rrbracket_{\pi} \circ \delta_{T_2} & & \downarrow A_1 \\ T_2 & \xrightarrow{A_2} & T \end{array}$$

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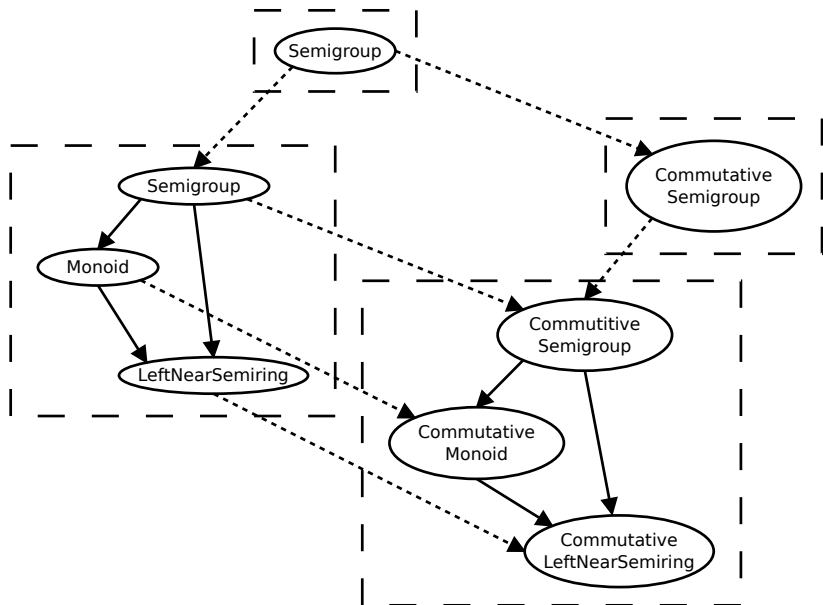
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$$\llbracket \text{combine } A_1 r_1, A_2 r_2 \rrbracket_{\mathbb{E}} \cong \llbracket r_1 \rrbracket_{\pi} \circ \delta_{T_1} \circ \llbracket A_1 \rrbracket_{\mathbb{E}}$$

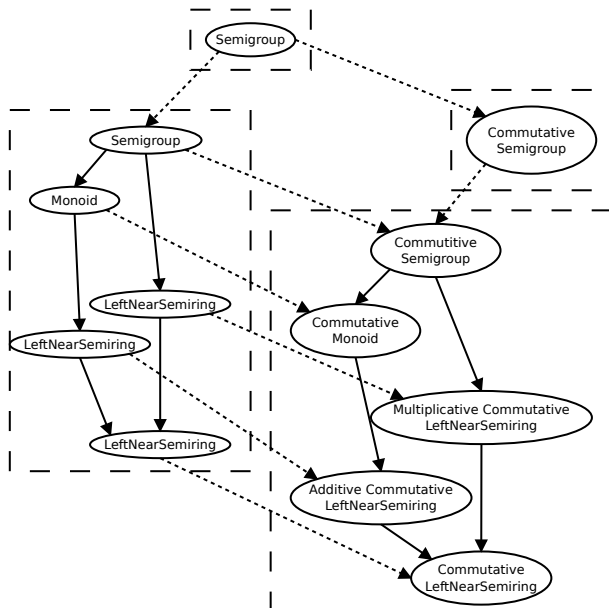
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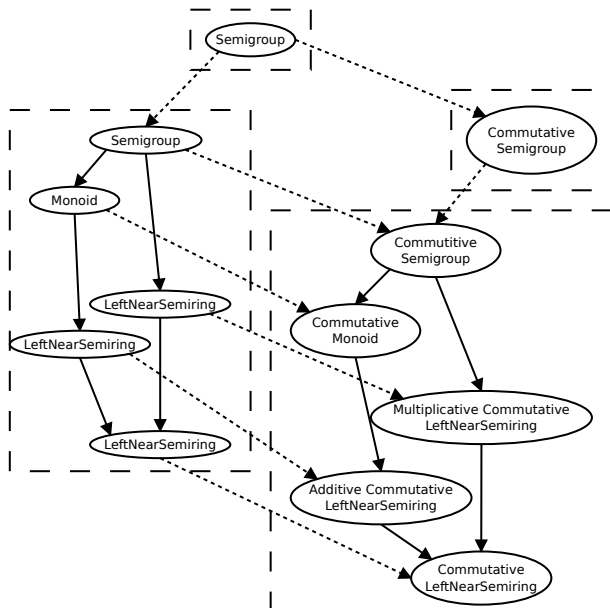
More structure



More structure

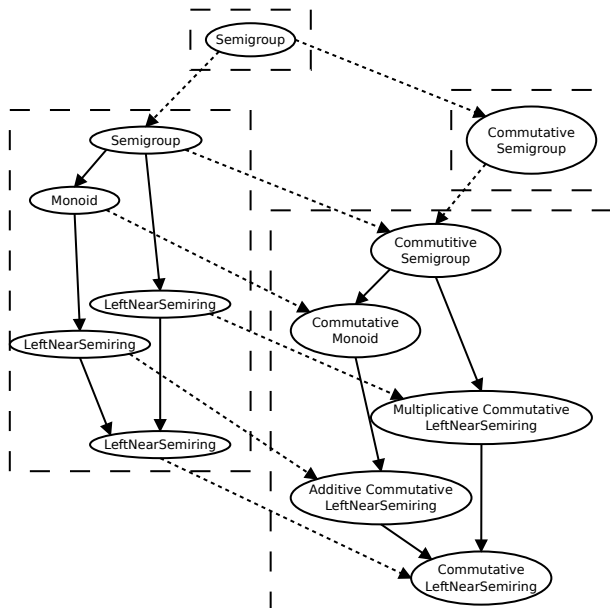


More structure



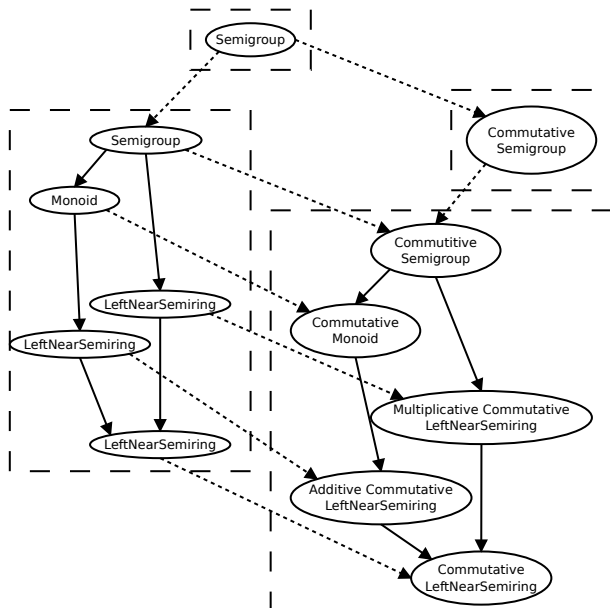
• Order

More structure



- Order
- Partial operations

More structure



- Order
- Partial operations
- Constructive equality

Colimit of diagrams, fibered functors



Concepts and theory combinators



Algebraic theories



Biform theories



Generic algorithm



Library



Efficient Program

Biform monoids

```
Monoid := Theory {  
  U : type;  
  e : U;  
  * : (U, U) -> U;  
  ax: forall x:U. e*x = x;  
  ax: forall x:U. x*e = x;  
  ax: forall x,y,z:U. (x*y)*z=x*(y*z)} }
```

Syntax (remember $\lceil 3 \rceil$?)

```
MonoidTerm := Theory {  
  type MTerm = (data X .  
    #e : X |  
    #* : (X, X) -> X)
```

Biform monoids

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Biform Theory: axiomatic + syntax + transformers.

```
length :: MonoidTerm → Nat  
length trm = gfold (+) 1 trm
```

Biform monoids

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```
length :: MonoidTerm → Nat  
length trm = gfold (+) 1 trm
```

```
leftSimp  :: MonoidTerm → MonoidTerm  
leftSimp = fun (#*(a,b)) when a = #e → b  
rightSimp :: MonoidTerm → MonoidTerm  
rightSimp = fun (#*(a,b)) when b = #e → b
```


Biform monoids

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  * : (U, U) → U;  
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```
simp :: MonoidTerm → MonoidTerm  
simp t = match t with  
| (#* (a,b)) when a = #e → b  
| (#* (a,b)) when b = #e → b  
| - → t
```

Biform monoids

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Monoid := Theory {  
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  e : U;  
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| - → t
```

Generic

Derived from length
reducing axioms

Colimit of diagrams, fibered functors



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Monoids generate types ¹

```
Monoid := Theory {  
  U : type;  
  e : U;  
  * : (U, U) -> U;  
  ax: forall x:U. e*x = x;  
  ax: forall x:U. x*e = x;  
  ax: forall x,y,z:U. (x*y)*z=x*(y*z)}
```

Monoid type, as values

```
module type MONOID = sig  
  type n  
  val plus : n -> n -> n  
  val zero : n  
end
```

¹*simplified metaocaml for clarity*

Monoids generate types ¹

```
Monoid := Theory {  
  U : type;  
  e : U;  
  * : (U, U) -> U;  
  ax: forall x:U. e*x = x;  
  ax: forall x:U. x*e = x;  
  ax: forall x,y,z:U. (x*y)*z=x*(y*z)}
```

Monoid type, as code

```
module type MONOIDCODE = sig  
  type n  
  type nc = n code  
  val plus : nc -> nc -> nc  
  val zero : nc  
end
```

Monoid type, as values

```
module type MONOID = sig  
  type n  
  val plus : n -> n -> n  
  val zero : n  
end
```

¹simplified metaocaml for clarity

Monoids generate types ¹

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Monoid := Theory {  
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  ax: forall x,y,z:U. (x*y)*z=x*(y*z)}
```

Monoid type, as code

```
module type MONOIDCODE = sig  
  type n  
  type nc = n code  
  val plus : nc -> nc -> nc  
  val zero : nc  
end
```

Monoid type, as values

```
module type MONOID = sig  
  type n  
  val plus : n -> n -> n  
  val zero : n  
end
```

Monoid type, staged

```
type x staged = Now of x  
               | Later of x code  
module type MONOIDSTAGED = sig  
  type n  
  type ns = n staged  
  val plus : ns -> ns -> ns  
  val zero : ns  
end
```

if you see a pushout, you're right!

¹simplified metaocaml for clarity

Monoids: from syntax to code

```
MonoidTerm := Theory {  
  type MTerm = (data X .  
    #e : X |  
    #* : (X, X) -> X)  
}
```

```
module type MONOIDSTAGED = sig  
  type n  
  type ns = n staged  
  val plus : ns -> ns -> ns  
  val zero : ns  
end
```

Monoids: from syntax to code

```
MonoidTerm := Theory {  
  type MTerm = (data X .  
    #e : X |  
    #* : (X, X) -> X)  
}
```

```
module type MONOIDSTAGED = sig  
  type n  
  type ns = n staged  
  val plus : ns -> ns -> ns  
  val zero : ns  
end
```

Equality is “free”

```
simp :: MonoidTerm -> MonoidTerm  
simp t = match t with  
  | (#* (a, b)) when a = #e -> b  
  | (#* (a, b)) when b = #e -> b  
  | - -> t
```

Equality is “now”

```
let monoid one know blater x y =  
  match x, y with  
  | (Now a), b when a = one -> b  
  | a, (Now b) when b = one -> a  
  | - -> binary know blater x y
```


Concrete Monoids²

```
module IntM = struct
  type n = Int
  let plus = (+)
  let zero = 0
end
```

```
module IntMS = struct
  type n = Int
  type 'a ns = ('a, n) staged
  let plus = monoid IntM.bzero IntM.plus IntMC.plus
  let zero = of_immediate IntM.zero
end
```

```
module IntMC = struct
  type n = Int
  type 'a nc = ('a, n) code
  let plus = .<fun x y -> .~x + .~y>.
  let zero = .< 0 >.
end
```

²Yes, more category theory hidden here

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