## The Open Algebraic Path Problem

CALCO - Jade Master - Sep 32021


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## §1: Shortest Paths



The shortest path problem asks for the sequence of edges between a given pair of vertices with minimum total distance.

## §1: Shortest Paths



The shortest path problem asks for the sequence of edges between a given pair of vertices with minimum total distance.

$$
\begin{aligned}
& \begin{array}{|c|c|}
\hline \text { path } & \text { total length } \\
\hline(\mathrm{a}, \mathrm{~b}) & 3.14 \\
\hline(\mathrm{a}, \mathrm{c})(\mathrm{c}, \mathrm{~b}) & 52+4=56 \\
\hline
\end{array} \\
& \text { shortest path }=\min _{\text {paths } \mathrm{p}}\{\text { length }(p)\} \\
& =\min \{3.14,56\}=3.14
\end{aligned}
$$

What structure allows us to generalize this?

## §1: Semirings

- A semiring $(R,+, \cdot)$ is like a ring except + is only a monoid and need not have negatives.


## Example

The natural numbers $\mathbb{N}$ form a semiring with the usual + and .

## Motivating Example

$[0, \infty]$ with min as the additive monoid and + as the multiplicative monoid.

## §1: Semirings

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## Example

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## Motivating Example

$[0, \infty]$ with min as the additive monoid

## Warning!

This example can be very confusing

| addition | $\min$ |
| :---: | :---: |
| multiplication | + |
| additive identity | $\infty$ |
| multiplicative identity | 0 | and + as the multiplicative monoid.

# The Algebraic Path Problem 

## §1: The Algebraic Path Problem

Let $X$ be a set of vertices.
Let $M: X \times X \rightarrow R$ be an $R$-matrix.

## Definition

An edge in $M$ is a pair of vertices $(a, b)$.
A path in $M$ is a sequence of edges

$$
p=\left\{\left(i, a_{1}\right),\left(a_{1}, a_{2}\right), \ldots,\left(a_{n}, j\right)\right\} .
$$

The weight $w(p)$ of a path $p$ is the product in $R$

$$
M\left(i, a_{1}\right) M\left(a_{1}, a_{2}\right) \ldots M\left(a_{n}, j\right) .
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$$

For $i, j \in X$, Let

$$
P_{i j}=\{\text { paths } p \text { from } i \text { to } j\}
$$

The shortest path is

$$
\min _{p \in P_{i j}}\{\text { length }(p)\}
$$

The algebraic path problem asks for

$$
\sum_{p \in P_{i j}} w(p)
$$

There are lots of examples!

| semiring | sum | product | solution of path problem |
| :---: | :---: | :---: | :---: |
| $[0, \infty]$ | inf | + | shortest paths in a weighted graph |
| $[0, \infty]$ | sup | inf | maximum capacity in the tunnel problem |
| $[0,1]$ | sup | $\times$ | most likely paths in a Markov process |
| $\{T, F\}$ | or | and | transitive closure of a directed graph |
| $\left(\mathcal{P}\left(\Sigma^{*}\right), \subseteq\right)$ | $\bigcup$ | concatenation | decidable language of a NFA |

The Universal Property of the Algebraic Path Problem

## §2: Why Matrices?

## Idea

$M^{n}$ has entries $M^{n}(i, j)$ given by the length of the shortest path from $i$ to $j$ with exactly $n$-steps.

When $R=[0, \infty]$,

$$
\begin{aligned}
M^{2}(i, j) & =\sum_{k \in X} M(i, k) M(k, j) \\
& =\min _{k \in X}\{M(i, k)+M(k, j)\}
\end{aligned}
$$

## §2: Why Matrices?

The pointwise minimum

## Idea

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$$

$$
F(M)(i, j)=\min _{n \geq 0}\left\{M^{n}(i, j)\right\}
$$

gives solutions to the algebraic path problem.
For an arbitrary $R$

$$
F(M)(i, j)=\sum_{n \geq 0} M^{n}(i, j)
$$

Next will see how this is the formula for the "free $R$-enriched category on $M$ ".

## §2: Free Categories

## Idea

Paths of length $n$ in $G$ are given by iterated pullbacks of $G$ with itself.

A graph is a diagram of sets and functions

$$
E \underset{t}{\stackrel{s}{\rightrightarrows}} V
$$

take the pullback with itself


## §2: Free Categories

## Idea

Paths of length $n$ in $G$ are given by iterated pullbacks of $G$ with itself.

A graph is a diagram of sets and functions

$$
E \xrightarrow[t]{\stackrel{s}{\rightrightarrows}} V
$$

take the pullback with itself
Edges of $G^{2}=\left\{\left(e, e^{\prime}\right) \in E \times E \mid t(e)=s(e)\right\}$
taking the $n$-fold pulback gives $G^{n}$ with
Edges of $G^{n}=\{$ paths of length $n$ in $G\}$.
The coproduct

$$
F(G)=\coprod_{n \geq 0} G^{n}
$$

is the free category.

## Proposition

There is an adjunction

$U(C)=$ the underlying graph of $C$ $F(G)=\coprod_{n \geq 0} G^{n}$.

Generalizes to...

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Generalizes to...

## Proposition

For a monoidal closed category $\mathcal{V}$ with countable coproducts there is an adjunction


- A semiring $R$ may be turned into a poset suitable for enrichment
- An $R$-enriched graph is an $R$-matrix.

A semiring $(R,+, \cdot)$ becomes a poset with $a \leq b \Longleftrightarrow \exists c$ s.t. $a+c=b$

| V | R |
| :---: | :---: |
| objects | elements |
| morphisms | $\leq$ |
| $\amalg$ | $\sum$ |
| $\otimes$ | $\cdot$ |
| distr. of $\amalg$ over $\otimes$ | distr. of + over $\cdot$ |

## Warning!

This gives $[0, \infty]$ the reverse of the usual ordering.

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## Warning!

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## Proposition

For a quantale $R$, there is an adjunction


## Realization!

The left adjoint $F$ gives solutions to the algebraic path problem.

## §2: Now We're in Business

## Big Idea

Let $M: X \times X \rightarrow R$ be an $R$-matrix and let $i, j \in X$. The entry of the free $R$-category on $M$

$$
F(M)(i, j)=\sum_{n \geq 0} M^{n}(i, j)
$$

is the solution to the algebraic path problem on $M$ from $i$ to $j$.

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Let $M: X \times X \rightarrow R$ be an $R$-matrix and let $i, j \in X$. The entry of the free $R$-category on $M$

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is the solution to the algebraic path problem on $M$ from $i$ to $j$.

- $R$-matrices may be joined together using colimits
- Left adjoints preserve colimits
- Can this help us glue together solutions?


## Applications

## §3: Compositionality



Algorithms for the algebraic path problem have $O\left(V^{3}\right)$ complexity.

## Question

Can solutions to the APP be built up from smaller components?

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## Question

Can solutions to the APP be built up from smaller components?


## Idea

To glue graphs together first designate some of the vertices as inputs or outputs.

## §3: Building Graphs with Composition



$$
G: X \rightarrow Y
$$



$$
H: Y \rightarrow Z
$$

## §3: Building Graphs with Composition



$$
G: X \rightarrow Y
$$


$H: Y \rightarrow Z$


$$
H \circ G: X \rightarrow Z
$$

- "Open $R$-matrices" are cospans in RMat
- They are glued together with pushouts
- For overlapping weights we use min


## The Good News

Left adjoints preserve pushouts so

$$
F(H \circ M a t) \cong F(H) \circ C_{a t} F(G)
$$

where $\circ_{M a t}$ is the pushout of $R$-matrices and ${ }^{\circ} C_{a t}$ is the pushout of $R$-categories.

## The Bad News

Pushouts of categories are hard.

## The Good News Again

Under certain circumstances they get
easier.

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## The Good News Again

Under certain circumstances they get easier.

## Theorem (JEM)

For "functional open $R$-matrices"
$G: X \rightarrow Y$ and $H: Y \rightarrow Z$, there is an equality

$$
\square(H \circ M a t)=\square(H) \square(G)
$$

where the product on the right hand is matrix multiplication.

- What is a functional open $R$-matrix?
- What does $\square$ mean?


## §2: Black-boxing



## Idea

Focus on the inputs and outputs and forget about the rest.

## §2: Black-boxing



For an open $R$-matrix $G: X \rightarrow Y$ its black-boxing is the $R$-matrix

$$
■(G): X \times Y \rightarrow R
$$

with values
$\square(G)(x, y)=$ solution of APP from $x$ to $y$

## §2: Matrix Multiplication does not Preserve Gluing



## §2: Matrix Multiplication does not Preserve Gluing



$$
\begin{gathered}
\square(G: X \rightarrow Y)=\left[\begin{array}{lll}
.1 & \infty & \infty
\end{array}\right]^{\top} \\
\square(H: Y \rightarrow Z)=\left[\begin{array}{lll}
\infty & \infty & .1
\end{array}\right] \\
\square(G) \square(H)=[\infty]
\end{gathered}
$$

On the other hand. . .

$$
\square\left(H \circ{ }_{M a t} G\right)=[0.4]
$$

## Idea

A functional open $R$-matrix has no edges going into its inputs and no edges going out of its outputs.

## Further Questions

## Theorem

For functional open $R$-matrices
$G: X \rightarrow Y$ and $H: Y \rightarrow Z$, there is an equality

$$
\square(H \circ G)=\square(H) \square(G) \text {. }
$$

For more see..

- Composing Behaviors of Networks, Ph.D. Thesis.
- Watch a more detailed version of this talk here:
https://youtu.be/inH26ggKJfc


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https://youtu.be/inH26ggKJfc
- Compositionalmarkov, Github repo in Python
- OpenStarSemiring.Ihs, Github gist in Haskell by Sjoerd Visscher
- Coalgebraic trace semantics?

