(Co)algebraic analysis of social systems: from graphs to hypergraphs

Nina Otter

DataShape, Inria and Université Paris-Saclay

**Topos Institute Colloquium** 

13 March 2025

based on joint work with Nima Motamed and Emily Roff

supported by the National Science Foundation under Grant Number DMS 1641020

# Outline of talk

- I. Structural social science
- II. Algebraic analysis of graphs: role and positional analysis
- III. Higher-order relations
- IV. Coalgebraic analysis of hypergraphs

#### I. Structural social science

#### What is structural social science?

For the last thirty years, empirical social research has been dominated by the sample survey. But as usually practiced, using random sampling of individuals, the survey is a sociological meatgrinder, tearing the individual from his social context and guaranteeing that nobody in the study interacts with anyone else in it. It is a little like a biologist putting his experimental animals through a hamburger machine and looking at every hundredth cell through a microscope; anatomy and physiology get lost, structure and function disappear, and one is left with cell biology.... If our aim is to understand people's behavior rather than simply to record it, we want to know about primary groups, neighborhoods, organizations, social circles, and communities; about interaction, communication, role expectations, and social control.

Allen Barton, 1968

# What is structural social science?

Mainstream social research was and *still is* focused solely on studying individuals.

It neglects the *social* aspect of behaviour: how individuals interact and influence each other.

Structural social science: social science research that focuses on studying the relationships between individuals rather than the individuals themselves.

# Social network analysis

Since 1960s/70s: development of formal methods centered on using networks to study relationships and patterns

The structural approach has an impact well beyond social science:

Most methods used today in Network Science were first developed by social network scientists.

II. Algebraic analysis of graphs: role and positional analysis

# Multirelational graphs

Multirelational graphs:

- nodes: represent social actors or positions

   e.g., employees in a firm, members of a family,
   alliance groups within a political party
- Edges (directed or not, labelled by a relation): represent relationships between social actors or positions

e.g., "being the supervisor of", "being in the same generation as", "having cosponsored the same bill"

# Multirelational graphs

More formally, we define a *k*-relational graph to be a pair  $(V, \{A_i\}_{i=1}^r)$  where:

- V is a finite set of **vertices**
- $A_1, ..., A_r$  are  $|V| \times |V|$  -matrices with Boolean entries (i.e., 0 or 1) that we call matrices of relations

# (Running) example

Here, nodes represent employees in a firm, the relation H encodes "being the supervisor of", and relation L encodes "being able to sub in for"



#### Position and roles

Social positions: collections of actors who are similar in their relationships to others

Social roles: patterns of relationships among actors or positions

Example of social role: In a kinship network we have that the relations "sibling of a mother" and "aunt" tie the same pairs of actors together, and thus correspond to a "role".



# Positional analysis on multirelational graphs

Goal: study **blockmodels** of a given multirelational graph, i.e.,:



# Positional analysis on multirelational graphs

Goal: study **blockmodels** of a given multirelational graph, i.e.,:



#### Equivalence relations that capture similarity

Given this network:



We want to partition the nodes into blocks of similar nodes.

# Structural equivalence

Structural equivalence: two nodes are structurally equivalent if they have exactly the same neighbours



Interpretation: two actors are structurally equivalent if they supervise the same people and are supervised by exactly the same.

#### Structural equivalence

Let  $\left(V, \left\{A_i\right\}_{i=1}^r\right)$  be a multirelational graph.

An equivalence relation  $R \subseteq V \times V$  is a **structural equivalence** iff for all  $v, v' \in V$  we have:

 $(v, v') \in R$  iff v and v' have exactly the same neighbours under all relations.

#### Structural equivalence

Considering each relation separately, we obtain the following partitions for structural equivalence:



However, no two pairs of nodes in the network have exactly the same neighbours under *both* relations.

Problem with structural equivalence: for two actors to occupy the same social position we require them to interact with the same people.

Problem with structural equivalence: for two actors to occupy the same social position we require them to interact with the same people.

Regular equivalence: two nodes are regularly equivalent if they have neighbours who themselves are regularly equivalent.



Let  $\left(V, \left\{A_i\right\}_{i=1}^r\right)$  be a multirelational graph.

An equivalence relation  $R \subseteq V \times V$  is a **regular equivalence** iff for all  $v, v' \in V$  we have  $(v, v') \in R$  implies, for all i = 1, ..., r:

- if  $v \xrightarrow{i} w$  is an edge, then there exists w' with  $(w, w') \in R$  such that  $v' \xrightarrow{i} w'$  is an edge
- if  $v \stackrel{i}{\leftarrow} w$  is an edge, then there exists w' with  $(w, w') \in R$  such that  $v' \stackrel{i}{\leftarrow} w'$  is an edge.

Note: The set of regular equivalence relations on a given set of vertices is a complete lattice with respect to inclusion.

The maximum regular equivalence for our running example, under *both* relations, is:



#### Positional analysis on multirelational graphs

multirelational graph 

reduced multirelational graph

surjective graph homomorphism

reduced multirelational graph

nodes are positions

#### Example:





 $\rightarrow$ 



# Role analysis

# Role analysis

Role analysis's aim is to study all possible compound relations and to find or impose equalities between them.

# Role analysis

Role analysis's aim is to study all possible compound relations and to find or impose equalities between them.

Definition. Given a multirelational graph  $\left(V, \left\{A_i\right\}_{i=1}^r\right)$  its **semigroup** of roles is the semigroup  $SG(A_1, \ldots, A_r)$  generated by  $A_1, \ldots, A_r$ , with binary operation given by Boolean matrix multiplication.

Goal: study homomorphic reductions of the semigroup of roles, e.g.,

$$SG(A_1, ..., A_r) \twoheadrightarrow S$$

#### Running example



0	Н	L	HL	HH
H	HH	HL	HH	0
L	HL	L	HL	HH
HL	HH	HL	HH	0
HH	0	HH	0	0

# Quotient by congruence relation obtained by setting L=id

0	Н	id	HH
Н	HH	Н	0
id	H	id	HH
HH	0	HH	0

# Combining positional and role analysis



0	H	L	HL	HH
Н	HH	HL	HH	0
L	HL	L	HL	HH
HL	HH	HL	HH	0
HH	0	HH	0	0



0	H	id	HH
Η	HH	H	0
id	H	id	HH
HH	0	HH	0

Question: Given 
$$\left(V, \left\{A_i\right\}_{i=1}^r\right) \twoheadrightarrow \left(\bar{V}, \left\{\bar{A}_i\right\}_{i=1}^r\right)$$
 under what conditions is  $SG(\bar{A}_1, ..., \bar{A}_r)$  a homomorphic reduction of  $SG(A_1, ..., A_r)$ ?



#### Functoriality of semigroup of roles assignment

- objects: k-relational graphs
- morphisms: surjective k-relational graph homomorphisms that are locally surjective

SemiGroup<sub>surj</sub>

Graph<sub>suri</sub>

- objects: semigroups
- morphisms: surjective semigroup homomorphisms

Theorem (O., Porter 2020 & Motamed, O., Roff 2025) The semigroup of roles assignment induces a functor

Role: 
$$Graph_{surj} \rightarrow SemiGroup_{surj}$$
.

## Functoriality of semigroup of roles assignment

- objects: k-relational graphs
- morphisms: surjective k-relational graph homomorphisms that are locally surjective

These give exactly the blockmodels associated to regular equivalences

SemiGroup<sub>surj</sub>

Graph<sub>surj</sub>

- objects: semigroups
- morphisms: surjective semigroup homomorphisms

Theorem (O., Porter 2020 & Motamed, O., Roff 2025) The semigroup of roles assignment induces a functor

Role: 
$$Graph_{surj} \rightarrow SemiGroup_{surj}$$
.

# What is this good for?

- Gives a natural choice for homomorphic reductions in role analysis
- Allows to tie several iterations of positional analysis to role analysis
- Conceptual clarity
- Stability questions: we could ask, e.g., is Role Lipschitz?

#### Functoriality theorem in action





 $\mathbf{*}$ 

0	$\overline{H}$	Ī	$\overline{H}\overline{H}$
H L HH	<i>Н Н</i> <i>Н Н</i> 0	H L HH	0 <i>H H</i> 0

0

#### Here we are barely scratching the surface

Some further reading..





#### **III.** Higher-order relations

# Why higher-order models?

Example: coauthorship systems.

We consider papers in different disciplines, e.g.

- algebraic topology (A)
- deep learning (D)

Papers in either A or D encode co-authorship relations between authors of each paper.

How shall we model this?

# Why higher-order models?

• Undirected graphs, i.e. (V, E) with  $E \subseteq \mathscr{P}_2(V)$ 

We encode pairwise relationships between authors, but we loose more refined information. We label edges according to the topics.


• Undirected graphs, i.e. (V, E) with  $E \subseteq \mathscr{P}_2(V)$ 

We encode pairwise relationships between authors, but we loose more refined information. We label edges according to the topics.

#### • Directed graphs, i.e., (V, E) with $E \subseteq V \times V$

We can encode, e.g., first or last authorship in applied papers. We label edges according to the topics.





• Simplicial complexes, i.e.,  $(V, \Sigma)$  with  $\Sigma \subseteq \mathscr{P}(V)$  downward closed



We encode a paper in topic A or D with n authors by an n - 1-simplex labelled by A or D.

• Simplicial complexes, i.e.,  $(V, \Sigma)$  with  $\Sigma \subseteq \mathscr{P}(V)$  downward closed



We encode a paper in topic A or D with *n* authors by an *n*-simplex labelled by A or D.

Note: here we also encode information about all co-authorship between subsets of the set of *n* authors.

We can interpret this model as follows: simplices encode co-authorship between their vertices, and maximal simplices represent papers.

• Undirected hypergraphs, i.e., (V, H)with  $H \subseteq \mathscr{P}(V)$ 

Hyperedges represent papers.



• Undirected hypergraphs, i.e., (V, H)with  $\mathbf{H} \subseteq \mathscr{P}(V)$ 

Hyperedges represent papers.

• Directed hypergraphs, i.e., (V, D) with D  $\subseteq \mathscr{P}(V) \times \mathscr{P}(V)$ 

Directed hyperedges represent papers. We can additionally, e.g., encode information about first and last author.





author n-1



Each model captures different type of information: in general no model is better than any other.

#### The objective

Generalise, to hypergraphs/simplicial complexes:

- Positional analysis
- Role analysis
- Tie the analyses together through a functoriality result

#### AMS MRC 2022 on Applied Category Theory





Nima Motamed, Utrecht University

Nima's insight: regular equivalences can be generalised through bisimulations on coalgebras

#### IV. Coalgebraic analysis of hypergraphs



Categorical approach to systems theory: coalgebras arose in the 1970s as a way to develop a unified framework for sequential machines and control systems.

In a nutshell: coalgebras capture the behaviour of a system.



# Example: non-deterministic transition systems

Let X be a finite set.

A non-deterministic transition system is a map  $\alpha: X \to \mathscr{P}(X)$ .

#### Example: non-deterministic transition systems Let X be a finite set.

A non-deterministic transition system is a map  $\alpha: X \to \mathscr{P}(X)$ .

Example: 
$$X = \{x_0, x_1, x_2\}$$

$$\alpha(x_0) = \{x_1, x_2\}$$
$$\alpha(x_1) = \{x_0\}$$
$$\alpha(x_2) = \{x_1\}$$

Such a system can be represented graphically by drawing a directed edge from each state to each of the states in its set of transitions:



# Example: labelled non-deterministic transition systems

Let X and A be finite sets.

A labelled non-deterministic transition systems is a map  $\alpha: X \to \mathscr{P}(A \times X)$ .

Example:  $X = \{x_0, x_1, x_2\}$  and  $A = \{a, b\}$ .  $\alpha(x_0) = \{(a, x_{1}), (a, x_2)\}$   $\alpha(x_1) = \emptyset$  $\alpha(x_2) = \{(b, x_1)\}$ 



# Example: discrete probabilistic systems: Markov chains

Let X be a finite set, and let  $\mathscr{D}(X)$  denote the set of discrete probability distributions on X:

$$\mathcal{D}(X) = \left\{ \mu \colon X \to [0,1] \mid \sum_{x \in X} \mu(x) = 1 \right\} \,.$$

A discrete probabilistic system is a map  $\alpha: X \to \mathcal{D}(X)$ .

# Example: discrete probabilistic systems: Markov chains

Let X be a finite set, and let  $\mathscr{D}(X)$  denote the set of discrete probability distributions on X:

$$\mathcal{D}(X) = \left\{ \mu \colon X \to [0,1] \mid \sum_{x \in X} \mu(x) = 1 \right\} \,.$$

A discrete probabilistic system is a map  $\alpha: X \to \mathcal{D}(X)$ .

Example: 
$$X = \{x_0, x_1, x_2\}$$
where  $\mu$  is defined as: $\alpha(x_1) = \delta_{x_0}$  $\mu: x_0 \mapsto 0$  $\alpha(x_2) = \delta_{x_1}$  $x_1 \mapsto \frac{1}{3}$  $\alpha(x_2) = \mu$  $x_2 \mapsto \frac{2}{3}$ .



#### **Coalgebra: definition**

Let  $T: Set \to Set$  a functor. A *T***-coalgebra** is a pair  $(A, \alpha)$  where A is a set and  $\alpha: A \to TA$  is a map of sets.

#### **Coalgebra: definition**

Let  $T: Set \to Set$  a functor. A *T***-coalgebra** is a pair  $(A, \alpha)$  where A is a set and  $\alpha: A \to TA$  is a map of sets.

Example: graphs as coalgebras. Given a directed graph (V, E), we can encode it by specifying its *out-neighborhood function* 

$$N_G^{\text{out}}: V \to \mathcal{P}(V)$$
$$v \mapsto \{ w \in V \mid (v, w) \in E \}$$

We have: Let C = Set. The  $\mathscr{P}$ -coalgebras are directed graphs.

#### Multi-relational graphs as coalgebras

More generally, k-relational directed graphs are F-coalgebras where

 $F: Set \rightarrow Set$ 

is the functor induced by the object-level map  $V \mapsto \mathscr{P}(A \times V)$ where  $A = \{1, ..., k\}$ .

#### T-coalgebra homomorphisms

Let  $T: Set \rightarrow Set$  a functor.

A *T*-coalgebra homomorphism  $(A, \alpha) \rightarrow (B, \beta)$  is a map  $f: A \rightarrow B$  such that the following diagram commutes:



#### Example: homomorphisms of *P*-coalgebras

Given two directed graphs G = (V, E) and G' = (V', E'), a coalgebra homomorphism  $(V, N_G^{out}) \rightarrow (V', N_{G'}^{out})$  is a map  $V \rightarrow V'$  such that the following diagram commutes:



#### Example: homomorphisms of *P*-coalgebras

Given two directed graphs G = (V, E) and G' = (V', E'), a coalgebra homomorphism  $(V, N_G^{out}) \rightarrow (V', N_{G'}^{out})$  is a map  $V \rightarrow V'$  such that the following diagram commutes:



This is equivalent to the following two conditions:

(ii)  $\forall v \in V$  and for any edge  $f(v) \rightarrow y$  in G' there exists  $v' \in V$  such that  $v \to v'$  is an edge in G. "f reflects edges"

#### Hypergraphs as *PP*-coalgebras

We restrict ourselves to a special type of directed hypergraph, in which the tail of each directed hyperedge is a singleton:



Note: everything can be extended to more general hypergraphs if one considers *di*algebras instead of coalgebras.

In what follows: A (directed) **hypergraph** is a pair H = (V, R) where V is a finite set and  $R \subseteq V \times \mathscr{P}(V)$ .

#### Hypergraphs as *PP*-coalgebras

Every hypergraph can be specified by its *hyper-neighbourhood* function:

$$V \to \mathcal{P}(\mathcal{P}(V))$$
$$v \mapsto \{X \subseteq V \mid (v, X) \in R\}$$

Let C = Set. The  $\mathscr{PP}$ -coalgebras are directed hypergraphs.

#### Multirelational hypergraphs as coalgebras

An *r*-relational hypergraph is a pair  $H = (V, \{R_i\}_{i=1, \dots, r})$  such that each  $(V, R_i)$  is a hypergraph.

k-relational hypergraphs are F-coalgebras where

 $F: Set \rightarrow Set$ 

is the functor induced by the object-level map  $V \mapsto \mathscr{P}(A \times \mathscr{P}(V))$ where  $A = \{1, ..., k\}$ .

#### **Bisimulations**

Intuition: allow to study a directed graph by focusing only on the movements that are possible along its edges.

Introduced independently in the 1970s in computer science, modal logic and set theory.

"The independent discovery of bisimulation in three different fields suggests that only limited exchanges and contacts among researchers existed at the time." Sangiorgi, 2009

Sangiorgi, D. 2009. On the origins of bisimulation and coinduction. ACM Trans. Program. Lang. Syst.

#### **Bisimulation equivalence**

Intuitively, a bisimulation equivalence on a transition system  $(A, \alpha)$  is an equivalence relation  $R \subseteq A \times A$  that respects the transition structure.

Given a functor  $T: Set \to Set$  and a T-coalgebra ( $A, \alpha$ ) a T-bisimulation equivalence on ( $A, \alpha$ ) is an equivalence relation  $R \subseteq A \times A$  together with a T-coalgebra structure  $\rho: R \to T(R)$  such that the projection- induced maps  $A \stackrel{p_1}{\leftarrow} R \stackrel{p_2}{\to} A$  are T-coalgebra homomorphisms, or in other words, such that the following diagram commutes:



### P-bisimulation equivalences are regular equivalences

Proposition:  $\mathscr{P}$ -bisimulation equivalences on  $\mathscr{P}$ -coalgebras are exactly regular equivalences on directed graphs.

A similar result holds for the multirelational setting.

### P-bisimulation equivalences are regular equivalences

Proposition:  $\mathscr{P}$ -bisimulation equivalences on  $\mathscr{P}$ -coalgebras are exactly regular equivalences on directed graphs.

A similar result holds for the multirelational setting.

This gives us a way to extend regular equivalences to hypergraphs: these are given by  $\mathcal{PP}$ -bisimulation equivalences on  $\mathcal{PP}$ -coalgebras.

#### Positional analysis for *T*-coalgebras

Thus, we can generalise the notion of blockmodel (coming from a regular equivalence) of a multirelational graph to, in particular, multirelational hypergraphs:

**Definition.** Let  $T: Set \to Set$  and  $\alpha: A \to TA$  a coalgebra and  $\rho: R \to TR$  a bisimulation equivalence on  $(A, \alpha)$ . The *T***-blockmodel of**  $(A, \alpha)$  with respect to  $\rho$  is the coequalizer in coalg(T) of

$$(\mathbf{R},\rho) \xrightarrow{p_1}{p_2} (\mathbf{A},\alpha)$$

#### ...but wait, there is more!

The powerset functor also carries the structure of a *monad, i.e., there* are natural transformations

$$\eta: \mathrm{Id}_{\mathbf{Set}} \Rightarrow \mathcal{P} \text{ and } \mu: \mathcal{PP} \Rightarrow \mathcal{P}$$

satisfying unitality and associativity properties, where

$$\eta_X : X \to \mathscr{P}(X)$$
  
 $x \mapsto \{x\}$  and  $\mu_X : \mathscr{PP}(X) \to \mathscr{P}(X)$   
 $U \mapsto \bigcup_{V \in U} V.$ 

#### Semigroup of roles for $\mathcal{P}$ -coalgebras

Like any monad, we can associate to  $\mathscr{P}$  the *Kleisli category*  $Set_{\mathscr{P}}$ , with objects sets and morphisms  $Set_{\mathscr{P}}(X, Y) = Set(X, \mathscr{P}(Y))$ .

Identity morphisms are defined through  $\eta$  and composition through  $\mu$ .

Definition. Given a  $\mathscr{P}$ -coalgebra  $(V, \alpha)$ , we define the semigroup of roles  $Role_{\mathscr{P}}(\alpha)$  as the subsemigroup of  $Set_{\mathscr{P}}(V, V)$  generated by  $\alpha: V \to \mathscr{P}(V)$ .

#### Uh-oh!

#### Iterated Covariant Powerset is not a Monad<sup>1</sup>

Bartek  $Klin^2$ 

Faculty of Mathematics, Informatics, and Mechanics University of Warsaw Warsaw, Poland

#### Julian Salamanca <sup>3</sup>

Faculty of Mathematics, Informatics, and Mechanics University of Warsaw Warsaw, Poland

#### We don't really need a monad

Let  $T: Set \rightarrow Set$  be a functor and  $\mu: TT \implies T$  a natural transformation such that the following diagram commutes:



which we call an **associative multiplication**.

The **Kleisli semi-category**  $Set_T$  has objects sets and morphisms  $Set_T(X, Y) = Set(X, T(Y))$ . Composition is defined through  $\mu$ .

#### Tying the two analyses together

Theorem [Motamed, O, Roff 2025]

Let  $T: Set \rightarrow Set$  be a functor equipped with an associative multiplication. The assignment of semigroup of roles extends to a functor

Role:  $\operatorname{Coalg}_{\operatorname{surj}}(T) \to \operatorname{SemiGroup}_{\operatorname{surj}}$ .

In particular, any blockmodel of a social system modelled by a T -algebra induces a quotient of the associated semigroup of roles.

Coalgebraic analysis of social systems, N. Motamed, O., E. Roff

#### Multiplications on $\mathcal{PP}$

In 2018 John Baez asked on the *n*-Category Cafe...

**Question.** Does there exist an associative multiplication  $m: P^2P^2 \Rightarrow P^2$ ? In other words, is there a natural transformation  $m: P^2P^2 \Rightarrow P^2$  such that

$$P^2 P^2 P^2 \xrightarrow{mP^2} P^2 P^2 \xrightarrow{m} P^2$$

equals

$$P^2 P^2 P^2 \stackrel{P^2 m}{\Longrightarrow} P^2 P^2 \stackrel{m}{\Rightarrow} P^2.$$

Greg Egan answered: Yes! There are at least two:

$$\mu_1: \mathcal{PPPP} \xrightarrow{\mu_{\mathcal{PP}}} \mathcal{PPP} \xrightarrow{\mu_{\mathcal{P}}} \mathcal{PP} \xrightarrow{\mu_{\mathcal{P}}} \mathcal{PP} \text{ and } \mu_2: \mathcal{PPPP} \xrightarrow{\mathcal{PP}\mu} \mathcal{PPP} \xrightarrow{\mathcal{P}\mu} \mathcal{PP}$$

where  $\mu$  is the multiplication of the monad  $\mathcal{P}$ .
# Back to our running example: relationships between employees in a firm



#### Just "supervision" (S)

Example of partition from a bisimulation equivalence:



Multiplication 1:

	S	S;S	S;S;S
S	S;S	S;S;S	S;S;S
S;S	S;S;S	S;S;S	S;S;S
S;S;S	S;S;S	S;S;S	S;S;S

Multiplication 2:

	S	S;S	S;S;S
S	S;S	S;S;S	S;S;S
S;S	S;S;S	S;S;S	S;S;S
S;S;S	S;S;S	S;S;S	S;S;S

Note: every blockmodel of a hypergraph induces a blockmodel of underlying graph, however, it contains more refined information.



#### Just "subbing in" (B)

Example of bisimulation equivalence (maximal one):





#### The two combined

Maximal partition from bisimulation equivalence:



Multiplication 1: 7 elements

Multiplication 2: 8 elements

## Functoriality theorem in action (for mult. 1)



	в	S	S;B	S;S	B;S	S;S;S	S;S;B
в	В	B;S	S;B	S;S	B;S	S;S;S	S;S;B
S	S;B	S;S	S;S;B	S;S;S	S;S	S;S;S	S;S;S
S;B	S;B	S;S	S;S;B	S;S;S	S;S	S;S;S	S;S;S
S;S	S;S;B	S;S;S	S;S;S	S;S;S	S;S;S	S;S;S	S;S;S
B;S	S;B	S;S	S;S;B	S;S;S	S;S	S;S;S	S;S;S
S;S;S							
S;S;B	S;S;B	S;S;S	S;S;S	S;S;S	S;S;S	S;S;S	S;S;S

S S;S S;S;S В S S;S S S;S;S S;S;S В S S;S S;S;S В S;S S;S;S S;S S;S;S S;S;S **S;S;S** S;S;S S;S;S S;S;S S;S;S

## The objective

Generalise, to hypergraphs/simplicial complexes:

- Positional analysis
- Role analysis 🖌
- Tie the analyses together through a functoriality result

### Future work and Open problems

• Easy-to-use software for practitioners

 Suite of methods to analyse lattices of bisimulations and congruences in semigroups of relations

• General hypergraphs

• Approximate equivalences

#### Some references

- Coalgebraic analysis of social systems, N. Motamed, N.O., E. Roff, in preparation
- A unified framework for equivalences in social networks, N.O., M.A. Porter, 2020
- Social Network Analysis, Wasserman, Faust, CUP, 1994
- The development of social network analysis, Freeman, EP, 2004
- Introduction to coalgebra, Jacobs, CUP, 2017
- Universal coalgebra: a theory of systems, Rutten, *Theoretical Computer* Science, 2000

#### .. joint work with



Nima Motamed, Utrecht University



Emily Roff, University of Edinburgh

## Thank you!