

# LOCAL-VS-GLOBAL CONSISTENCY OF ANNOTATED RELATIONS

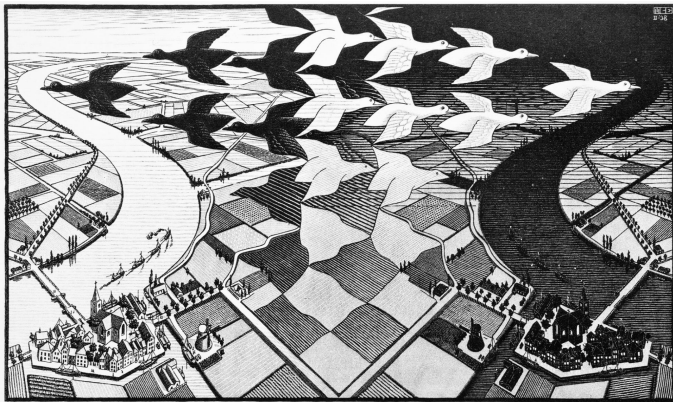
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# Part I

## Motivation

# Escher's Local vs. Global



Day and Night, woodcut, Escher 1938.

[Low resolution image downloaded from Wikipedia]

## Relational database consistency (on the triangle schema)

| $R(X, Y)$ | $S(Y, Z)$ | $T(Z, X)$ | $W(X, Y, Z)$ |
|-----------|-----------|-----------|--------------|
| 1 1       | 1 2       | 2 1       | 1 1 2        |
| 1 2       | 1 3       | 2 2       | 1 1 3        |
| 2 1       | 2 3       | 3 1       | 2 1 2        |
| 3 2       |           | 3 3       | 3 2 3        |
|           |           |           | 1 2 3        |

$$W[X, Y] = R$$

$$W[Y, Z] = S$$

$$W[Z, X] = T$$

$R, S, T$  are **consistent**  
 $W$  is a **witness** of their consistency.

## Relational database consistency (arbitrary schema)

Let  $X_1, \dots, X_m$  be a schema.

Let  $R_1(X_1), \dots, R_m(X_m)$  be relations over that schema.

### Definition [BFMY'83]

The relations  $R_1(X_1), \dots, R_m(X_m)$  are **consistent** if there exists a relation  $W(X_1 \cdots X_m)$  that projects on  $X_i$  to  $R_i$ , for  $i = 1, \dots, m$ ; i.e.,

$$W[X_1] = R_1 \quad W[X_2] = R_2 \quad \cdots \quad W[X_m] = R_m$$

We say that  $W$  is a **witness** of their consistency.

- pairwise consistent: any two are consistent,
- $k$ -wise consistent: any  $k$  are consistent,
- globally consistent: all together are consistent.

## Joins do the job ... right?

### Basic fact about relations:

If  $R(X)$  and  $S(Y)$  are consistent relations,  
then their join  $R \bowtie S$  witnesses their consistency.

**BUT** not so for “*real-world* relations”, i.e., bags.

The **bag-join** is *not* a witness of consistency for bags. [AK'21]

| $R(X)$ | $S(Y)$ | $W(X, Y)$   | $J(X, Y)$   | $J[X]$ | $J[Y]$ |
|--------|--------|-------------|-------------|--------|--------|
| $a_1$  | $b_1$  | $a_1 \ b_1$ | $a_1 \ b_1$ | $a_1$  | $b_1$  |
| $a_2$  | $b_2$  | $a_2 \ b_2$ | $a_1 \ b_2$ | $a_1$  | $b_2$  |
|        |        |             | $a_2 \ b_1$ | $a_2$  | $b_1$  |
|        |        |             | $a_2 \ b_2$ | $a_2$  | $b_2$  |

## A more general problem

Let data come **annotated** with **side information**  $(\alpha_i, \beta_j, \gamma_k, \dots)$ .

| $R(X, Y)$              | $S(Y, Z)$             | $T(Z, X)$              | $W(X, Y, Z)$          |
|------------------------|-----------------------|------------------------|-----------------------|
| $a_1 \ b_1 : \alpha_1$ | $c_1 \ d_1 : \beta_1$ | $e_1 \ f_1 : \gamma_1$ | $g_1 \ h_1 \ i_1 : ?$ |
| $a_2 \ b_2 : \alpha_2$ | $c_2 \ d_2 : \beta_2$ | $e_2 \ f_2 : \gamma_2$ | $g_2 \ h_2 \ i_2 : ?$ |
| $\dots$                | $\dots$               | $\dots$                | $\dots$               |
| $a_m \ b_m : \alpha_m$ | $c_n \ d_n : \beta_n$ | $e_p \ f_p : \gamma_p$ | $g_q \ h_q \ i_q : ?$ |

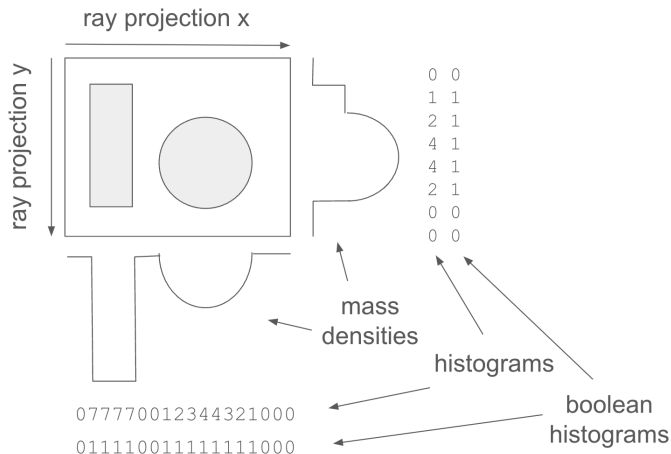
### Questions:

How should data be annotated/measured/compared/aggregated?

Given data, does it come from a common source?

Can we reconstruct the source?

## Example 1: Image reconstruction and tomography



Cormack-Hounsfield 1979 Nobel in Physiology or Medicine

## Example 2: Quantum theory, EPR, and Bell inequalities

Do measurements reflect “elements of physical reality”?

[EPR'35, NYT'35, B'64]



<https://www.nytimes.com/1935/05/04/archives/einstein-attacks-quantum-theory-scientist-and-two-colleagues-find.html?smid=url-share>

## Measuring two classical Head/Tail coins

In classical mechanics, the uncertainty of an experiment can be modelled by hidden variable theories. E.g.,

| Coin 1    | Coin 2    | Wit : $\lambda$ | Wit : $\lambda$ | etc |
|-----------|-----------|-----------------|-----------------|-----|
| $H : 1/2$ | $H : 1/2$ | $HH : 1/4$      | $HH : 1/2$      |     |
| $T : 1/2$ | $T : 1/2$ | $HT : 1/4$      | $HT : 0$        |     |
|           |           | $TH : 1/4$      | $TH : 0$        |     |
|           |           | $TT : 1/4$      | $TT : 1/2$      |     |

The hidden variable theories model elements of physical reality. Facts are “already there”, just unknown before measurement. The hidden variable theory need not be unique.

## Measuring two quantum entangled particles

In quantum mechanics, states are unit vectors and measurements are orthogonal projection operators that collapse the state. E.g.,

$$B_1 = \begin{bmatrix} 1 & 0 \\ 0 & 0 \end{bmatrix} \quad C_1 = \begin{bmatrix} 1/2 & -1/2 \\ -1/2 & 1/2 \end{bmatrix}$$

$$B_2 = \begin{bmatrix} 0 & 0 \\ 0 & 1 \end{bmatrix} \quad C_2 = \begin{bmatrix} 1/2 & 1/2 \\ 1/2 & 1/2 \end{bmatrix}$$

A consequence of Bell's analysis in [B'64] is that the combined system does not admit compatible measurements.

| Particle 1  | Particle 2  | Wit?                |
|-------------|-------------|---------------------|
| $b_1 : B_1$ | $c_1 : C_1$ | $b_1 c_1 : X_{11}?$ |
| $b_2 : B_2$ | $c_2 : C_2$ | $b_1 c_2 : X_{12}?$ |
|             |             | $b_2 c_1 : X_{21}?$ |
|             |             | $b_2 c_2 : X_{22}?$ |

Ergo: no local hidden variable theory can model entanglement.

## Part II

### Annotated Relations

# Annotations from an algebraic structure

- Set semantics use **True** (1) and **False** (0) as annotations.
- Bag semantics uses natural numbers as annotations.
- **Semiring semantics** uses annotations from a semiring:

A **semiring** is an algebraic structure  $\mathbb{K} = (K, +, \times, 0, 1)$  where  $(K, +, 0)$  and  $(K, \times, 1)$  are commutative monoids (associative and commutative with neutral element), and  $\times$  distributes over  $+$ .

## Examples:

- Two-element Boolean algebra  $\mathbb{B} = \{0, 1\}$  with  $\vee$  and  $\wedge$ ,
- Natural numbers  $\mathbb{N}$  with  $+$  and  $\times$ ,
- Extended real numbers  $\mathbb{R} \cup \{\pm\infty\}$  with  $\min$  and  $\max$ .
- Extended real numbers  $\mathbb{R} \cup \{\pm\infty\}$  with  $\min$  and  $+$  (tropical).
- ...

# Semiring semantics in database theory

## Extensively studied in last two decades:

- Provenance [GKT'07, KG'12, DGNT'21].
- Query containment [G'11, KRS'14].
- Datalog and recursion [KNPSW'24, DGNT'21].

## Key idea 1:

- Addition  $+$  is used for “alternative information” (or/projection).
- Multiplication  $\times$  is used for “joint information” (and/join).

## Key idea 2:

- To define consistency, only the **additive** structure is relevant.
- As noted earlier for bags, the standard join ( $\times$ ) may not witness.
- To model consistency, **positivity** (defined next) is natural.

# Positive commutative monoids

A **positive commutative monoid** is an algebraic structure  $\mathbb{K} = (K, +, 0)$  where  $+$  is an associative and commutative operation on  $K$ , with neutral element  $0$ , which satisfies positivity:

$$x + y = 0 \quad \text{implies} \quad x = 0 \text{ and } y = 0.$$

## Examples

- Boolean monoid:  $\mathbb{B} = \{\text{true}, \text{false}\}$  with  $\vee$  and  $\text{false}$ .
- Powerset monoid:  $\mathcal{P}(S)$  with  $\cup$  and  $\emptyset$  for some set  $S$ .
- Bag monoid:  $\mathbb{N}$  with  $+$  and  $0$ .
- Real-valued measures:  $\mathbb{R}_{\geq 0}$  with  $+$  and  $0$ .
- POVM of dimension  $d$ :  $\mathbb{R}_{\geq 0}^{d \times d}$  with  $+$  and  $0$ .
- Tropical/Cost monoid:  $\mathbb{R} \cup \{\infty\}$  with  $\min$  and  $\infty$ .
- Access control [GT'17]:  $P < S < T < I$  with  $\min$  and  $I$ .

## $\mathbb{K}$ -relations and their projections

Let  $\mathbb{K} = (K, +, 0)$  be a positive commutative monoid.

Let  $X$  be a set of attributes with domain  $D$ .

A  $\mathbb{K}$ -relation  $R(X)$  of schema  $X$  is a map  $R : D^X \rightarrow K$  with finite support

$$\text{Supp}(R) := \{t \in D^X : R(t) \neq 0\}.$$

For  $Y \subseteq X$ , the  $Y$ -projection denoted  $R[Y]$  is the  $\mathbb{K}$ -relation of schema  $Y$  defined on every  $Y$ -tuple  $r$  by

$$R[Y](r) := \sum_{\substack{t \in D^X : \\ t[Y] = r}} R(t)$$

**Fact.** Positivity of  $\mathbb{K}$  ensures projection commutes with support:

$$\text{Supp}(R[Y]) = \text{Supp}(R)[Y].$$

# Consistency of relations over monoids

Let  $\mathbb{K}$  be a positive commutative monoid.

Let  $X_1, \dots, X_m$  be a schema.

Let  $R_1(X_1), \dots, R_m(X_m)$  be  $\mathbb{K}$ -relations over that schema.

## Definition [AK'24]

The  $\mathbb{K}$ -relations  $R_1(X_1), \dots, R_m(X_m)$  are **consistent** if there exists a  $\mathbb{K}$ -relation  $W(X_1 \cdots X_m)$  that projects on  $X_i$  to  $R_i$ , for  $i = 1, \dots, m$ ; i.e.,

$$W[X_1] = R_1 \quad W[X_2] = R_2 \quad \cdots \quad W[X_m] = R_m$$

We say that  $W$  is a **witness** of their consistency.

- pairwise consistent: any two are consistent
- $k$ -wise consistent: any  $k$  are consistent
- globally consistent: all together are consistent

## Part III

### Inner Consistency

## A weaker form of consistency

### Definition [AK'24]

Two  $\mathbb{K}$ -relations  $R(X)$  and  $S(Y)$  are called **inner consistent** if

$$R[X \cap Y] = S[X \cap Y].$$

**Fact.** For every positive commutative monoid:

$$\text{consistency} \implies \text{inner consistency}$$

**Indeed:**

Let  $R(X)$  and  $S(Y)$  be  $\mathbb{K}$ -relations.

Let  $Z = X \cap Y$  be the **common attributes**.

Let  $W(X, Y)$  witness consistency.

Then:

$$R[Z] = W[X][Z] = W[Z] = W[Y][Z] = S[Z].$$

# Monoids and inner consistency

**Question.** For which positive commutative monoids

$$\text{inner consistency} \stackrel{?}{\implies} \text{consistency}$$

**Coming up:**

- |                         |      |                              |
|-------------------------|------|------------------------------|
| - Boolean monoid:       | YES  | the standard join            |
| - Powerset monoid:      | YES  | intersections of annotations |
| - Tropical/cost monoid: | YES  | maxima(!) of annotations     |
| - Real-valued measures: | YES  | normalized volume            |
| - Bag monoid:           | YES! | flow theory                  |
| - POVM:                 | NO.  |                              |

**plus**

a characterization and its consequences

## From inner consistency to consistency by solving equations

| $R(X, Y)$              | $S(Y, Z)$             | $W(X, Y, Z)$                |
|------------------------|-----------------------|-----------------------------|
| $a_1 \ c_1 : \alpha_1$ | $c_1 \ d_1 : \beta_1$ | $a_1 \ c_1 \ d_1 : x_{11}?$ |
| $a_2 \ c_1 : \alpha_2$ | $c_1 \ d_2 : \beta_2$ | $a_1 \ c_1 \ d_2 : x_{12}?$ |
| $a_3 \ c_1 : \alpha_3$ |                       | $a_2 \ c_1 \ d_1 : x_{21}?$ |
|                        |                       | $a_2 \ c_1 \ d_2 : x_{22}?$ |
|                        |                       | $a_3 \ c_1 \ d_1 : x_{31}?$ |
|                        |                       | $a_3 \ c_1 \ d_2 : x_{32}?$ |

The inner consistency assumption is, in this case,

$$\alpha_1 + \alpha_2 + \alpha_3 = \beta_1 + \beta_2$$

The consistency witness is, in this case, any solution to the system

$$\begin{array}{lcl} x_{11} + x_{12} & = & \alpha_1 \\ x_{21} + x_{22} & = & \alpha_2 \\ x_{31} + x_{32} & = & \alpha_3 \end{array} \qquad \begin{array}{lcl} x_{11} + x_{21} + x_{31} & = & \beta_1 \\ x_{12} + x_{22} + x_{32} & = & \beta_2 \end{array}$$

# Instances of the Transportation Problem $\mathbf{TP}(m,n)$

**Given**  $\alpha_1, \dots, \alpha_m$  **and**  $\beta_1, \dots, \beta_n$  **such that**

$$\alpha_1 + \dots + \alpha_m = \beta_1 + \dots + \beta_n$$

**find**  $x_{ij}$  **such that**

$$\begin{array}{ccccccccc} x_{11} & + & x_{12} & + & \cdots & + & x_{1n} & = & \alpha_1 \\ & + & & + & & & + & & \\ x_{21} & + & x_{22} & + & \cdots & + & x_{2n} & = & \alpha_2 \\ & + & & + & & & + & & \\ \vdots & & \vdots & & \ddots & & \vdots & & \\ & + & & + & & & + & & \\ x_{m1} & + & x_{m2} & + & \cdots & + & x_{mn} & = & \alpha_m \\ \parallel & & \parallel & & & & \parallel & & \\ \beta_1 & & \beta_2 & & & & \beta_n & & \end{array}$$

# Characterization

## Characterization Theorem [AK'24].

For every positive commutative monoid  $\mathbb{K}$ , the following statements are equivalent:

- (1) Every two  $\mathbb{K}$ -relations that are inner consistent are consistent.
- (2) Every instance of TP over  $\mathbb{K}$  is feasible.
- (3) Every instance of TP(2,2) over  $\mathbb{K}$  is feasible.

We say that  $\mathbb{K}$  has the **inner consistency property**

We say that  $\mathbb{K}$  has the **transportation property**

### Indeed:

- (1)  $\iff$  (2) : done; see two slides back from this one.
- (2)  $\iff$  (3) : known from the theory of weighted automata [S'07]; see also two slides forward from this one.

# Transportation property failing: an example

$\mathbb{N}_q$  = bag monoid with addition **truncated** to  $q$ , for  $q \geq 2$ .

It's a positive commutative monoid.

The precondition

$$1 + (q - 1) = 1 + q \quad (\text{in } \mathbb{N}_q)$$

holds, BUT the following system is infeasible:

$$\begin{array}{rclcl} x_{11} & + & x_{12} & = & 1 \\ + & & + & & \\ x_{21} & + & x_{22} & = & q - 1 \\ \parallel & & \parallel & & \\ 1 & & q & & \end{array}$$

It suffers from the “short blanket dilemma” at  $x_{22}$ ; i.e.,

By Row 1 & Col 2 we need  $x_{22} \geq q - 1$ .

By Col 1 & Row 2 we need  $x_{22} \leq q - 2$ .

## Reduction from $(m \times n)$ to $(m \times 2)$ , then to $(2 \times 2)$

1. Set  $\beta = \beta_1 + \cdots + \beta_{n-1}$ .
2. Split into two systems (variables  $y_1, \dots, y_m$  are new):

$$\begin{array}{rclclcl}
 y_1 & + & x_{1n} & = & \alpha_1 & & x_{11} & + & \cdots & + & x_{1(n-1)} & = & y_1 \\
 + & & + & & & & + & & & & + & & \\
 \vdots & & \vdots & & & & \vdots & & \ddots & & \vdots & & \\
 + & & + & & & & + & & & & + & & \\
 y_m & + & x_{mn} & = & \alpha_m & & x_{m1} & + & \cdots & + & x_{m(n-1)} & = & y_m \\
 \parallel & & \parallel & & & & \parallel & & & & \parallel & & \\
 \beta & & \beta_n & & & & \beta_1 & & & & \beta_{n-1} & & 
 \end{array}$$

3. Recurse.

## Solving $2 \times 2$ instances in special cases

$$\alpha_1 + \alpha_2 = \gamma = \beta_1 + \beta_2$$

$$\begin{array}{rcccl} x_{11} & + & x_{12} & = & \alpha_1 \\ + & & + & & \\ x_{21} & + & x_{22} & = & \alpha_2 \\ \parallel & & \parallel & & \\ \beta_1 & & \beta_2 & & \end{array}$$

Boolean monoid/powerset/tropical/... distributive lattices:

$$(\alpha_i \wedge \beta_1) \vee (\alpha_i \wedge \beta_2) = \alpha_i \wedge (\beta_1 \vee \beta_2) = \alpha_i \wedge (\alpha_1 \vee \alpha_2) = \alpha_i$$

Real-valued measures/tropical semiring/... semifields:

$$\alpha_i \beta_1 / \gamma + \alpha_i \beta_2 / \gamma = \alpha_i (\beta_1 + \beta_2) / \gamma = \alpha_i \gamma / \gamma = \alpha_i$$

## Solving $2 \times 2$ transportation for bag monoid

Bag monoid  $2 \times 2$  instance:

$$x_{11} + x_{12} = \alpha_1$$

$$+ \quad +$$

$$x_{21} + x_{22} = \alpha_2$$

$$\parallel \quad \parallel$$

$$\beta_1 \quad \beta_2 \quad \gamma = \alpha_1 + \alpha_2 = \beta_1 + \beta_2$$

Set:

$$x_{11} = \min(\alpha_1, \beta_1) \quad \text{totally ordered}$$

$$x_{12} = \alpha_1 - x_{11} \quad \text{non-negative!}$$

$$x_{21} = \beta_1 - x_{11} \quad \text{non-negative!}$$

$$x_{22} = \gamma - \max(\alpha_1, \beta_1) \quad \text{non-negative!}$$

Unrolling the induction gives the Northwest Corner Method  
from the theory of linear programming [AK'24].

## Part IV

### Local vs Global Consistency

# Vorobe'v and BFMY Theorems

## **Vorobe'v Theorem.** [V'68]

For all collections  $X_1, \dots, X_m$  of sets of random variables, TFAE:

- (1)  $X_1, \dots, X_m$  forms a regular simplicial complex.
- (2) Every collection of probability measures on  $X_1, \dots, X_m$  that is pairwise consistent is consistent.

## **Beeri-Fagin-Maier-Yannakakis Theorem.** [BFMY'83]

For all collections  $X_1, \dots, X_m$  of sets of attributes, TFAE:

- (1)  $X_1, \dots, X_m$  is the set of edges of an acyclic hypergraph.
- (2) Every collection of relations over  $X_1, \dots, X_m$  that is pairwise consistent is consistent.

# Hypergraph acyclicity: a database theory classic

1. **Acyclicity** was introduced in the BFMY paper

“On the Desirability of Acyclic Schemes”

with *many different* equivalent characterizations.

2. The equivalent concept of **join-tree** is contemporary to Roberston and Seymour's tree-width and tree-decompositions of Graph Minors I/II (early 80's).

3. It is a key component in Yannakakis' (1981) fundamental **join-tree algorithm** for conjunctive query evaluation.

4. Non-trivially generalizes graph acyclicity [F'83].

Berge acyclic  $<$   $\gamma$ -acyclic  $<$   $\beta$ -acyclic  $<$   $\alpha$ -acyclic

# Generalizing Vorobe'v and BFMY Theorems

## **Theorem.** [AK'24]

Let  $\mathbb{K}$  be a positive commutative monoid that has the transportation property. For all collections  $X_1, \dots, X_m$  of sets of attributes, TFAE:

- (1)  $X_1, \dots, X_m$  is the set of edges of an acyclic hypergraph.
- (2)  $X_1, \dots, X_m$  has the **local-to-global (L2G) property** on  $\mathbb{K}$ ; i.e., every collection of  $\mathbb{K}$ -relations on  $X_1, \dots, X_m$  that is pairwise consistent is consistent.

**Corollary.** BFMY acyclicity and Vorobe'v regularity coincide.

[A direct proof of corollary is also doable... and more natural.]

## Proof of necessity : L2G implies acyclicity (1/2)

**Note:** The proofs in BFMY and V do not generalize (at all).

### **Theorem** [AK'24]

If  $H_0$  is a  $d$ -regular &  $k$ -uniform hypergraph with  $d \geq 2$  and  $k \geq 2$ , then  $H_0$  fails L2G on  $\mathbb{K}$ .

### **Theorem** (reformulated from [BFMY'83])

If  $H$  is non-acyclic, then  $C_n \leq_G H$  or  $S_n \leq_G H$  for some  $n \geq 3$ .

### **Lemma** [AK'24]

If  $H_0 \leq_G H$  and  $H_0$  fails L2G on  $\mathbb{K}$ , then  $H$  fails L2G on  $\mathbb{K}$ .

### **Fact**

$C_n$  is 2-regular and 2-uniform.

$S_n$  is  $(n-1)$ -regular and  $(n-1)$ -uniform.

## Proof of necessity : L2G implies acyclicity (2/2)

Assume  $H_0 = \{X_1, \dots, X_m\}$  is  $d$ -regular and  $k$ -uniform.

Fix arbitrary  $\ell : \{1, \dots, m\} \rightarrow \mathbb{Z}/d\mathbb{Z}$  such that

$$\ell(1) + \dots + \ell(m) \not\equiv 0 \pmod{d}.$$

Such a labelling  $\ell$  exists if  $d \geq 2$  and  $m \geq 1$ .

Fix arbitrary  $\alpha^* \in K \setminus \{0\}$ .

Define  $R_i(X_i) : (\mathbb{Z}/d\mathbb{Z})^k \rightarrow K$  by

$$R_i(a_1, \dots, a_k) := d^k \cdot \alpha^* \quad \text{iff} \quad a_1 + \dots + a_k \equiv \ell(i) \pmod{d}$$

where  $d^k \cdot \alpha^* := \alpha^* + \dots + \alpha^*$  ( $d^k$  times).

**pairwise consistent:** by  $k \geq 2$  and uniformity of  $\mathbb{Z}/d\mathbb{Z}$ -subspaces.

**globally inconsistent:** by  $d$ -regularity and  $\sum_{i=1}^m \ell(i) \not\equiv 0 \pmod{d}$ .

# Proof of sufficiency : acyclicity implies L2G (1/1)

Assume  $\mathbb{K}$  has the transportation property.

Then:

Yannakakis join-tree algorithm  
specialized to full conjunctive queries  
works also for  $\mathbb{K}$ -relations

when

inner consistency  $\implies$  consistency

which, here, is the case by the Characterization Theorem.

# Part V

## Back to Bell

# Transportation property failing for POVMs

Let's argue that the analysis of Bell Inequalities ([B'64]) leads to:

**Fact.**

For all  $d \geq 2$ , the positive commutative monoid  $\mathbb{R}_{\succeq}^{d \times d}$  of POVM with component-wise  $+$  does **not** have the transportation property.

**Recall:**

$\mathbb{R}_{\succeq}^{d \times d}$ : the set of positive semi-definite (PSD) matrices  $M \in \mathbb{R}^{d \times d}$ .  
PSD: symmetric and such that  $z^T M z \geq 0$  holds for all  $z \in \mathbb{R}^d$ .

## The counterexample

The matrices

$$B_1 = \begin{bmatrix} 1 & 0 \\ 0 & 0 \end{bmatrix} \quad C_1 = \begin{bmatrix} 1/2 & -1/2 \\ -1/2 & 1/2 \end{bmatrix}$$

$$B_2 = \begin{bmatrix} 0 & 0 \\ 0 & 1 \end{bmatrix} \quad C_2 = \begin{bmatrix} 1/2 & 1/2 \\ 1/2 & 1/2 \end{bmatrix}$$

are PSD, they satisfy

$$B_1 + B_2 = C_1 + C_2$$

BUT the following system is **infeasible** in PSD matrices:

$$\begin{array}{rcccl} X_{11} & + & X_{12} & = & B_1 \\ + & & + & & \\ X_{21} & + & X_{22} & = & B_2 \\ \parallel & & \parallel & & \\ C_1 & & C_2 & & \end{array}$$

# The certificate of infeasibility is a Bell inequality

Set

$$A_1 = \begin{bmatrix} 1 & 1 \\ 1 & -1 \end{bmatrix} \quad A_2 = \begin{bmatrix} -1 & 1 \\ 1 & 1 \end{bmatrix}$$

and

$$M := A_1 X_{11} + A_2 X_{12} - A_1 X_{21} - A_2 X_{22}.$$

Using the assumption that the  $X_{ij}$  satisfy the system we have:

$$(1) \quad \text{tr}(M) = \text{tr}(2I) = 4$$

$$(2) \quad \text{tr}(M) \leq (\sum_{ij} \text{tr}(X_{ij}))(\max_i \|A_i\|) \leq \text{tr}(I)\sqrt{2} = 2\sqrt{2}$$

I.e., A Bell inequality fails;  
a “quantum short blanket dilemma” of sorts.

## Part VI

# CONCLUSIONS

# Key ideas and findings

## Key ideas:

- Following recent trend (e.g., provenance), data comes annotated.
- In the study of consistency, positive monoids are enough.

## Key finding 1:

- Inner consistency of data is necessary for its coherent existence.
- But it is not always sufficient: see  $\mathbb{N}_q$ , and Bell scenarios.

## Key finding 2:

- Sufficiency of locality is ensured by the transportation property.
- The sufficiency extends to all acyclic scenarios.
- It does **not** extend to **any** non-acyclic scenario **whatsoever**.

## An open-ended question

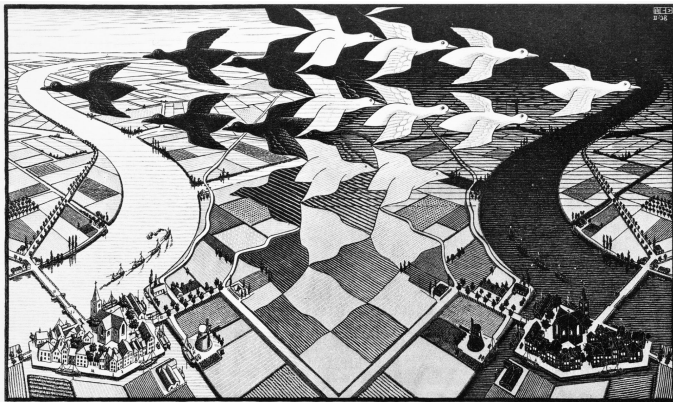
Conventional wisdom has been that data ought to be globally consistent – reminiscent of “an element of physical reality”.

BUT IT IS RARELY ENFORCED!

Are there computational or information-theoretic advantages in **explicitly giving up** on global consistency of data?

[If witnessed, quantum advantage may be an answer,  
but maybe not the only answer]

Maybe not the only answer...



Day and Night, woodcut, Escher 1938.

[Low resolution image downloaded from Wikipedia]

## Three references

[AK'21] A. Atserias and Ph. G. Kolaitis. *Structure and Complexity of Bag Consistency*. PODS'21.

[AK'24/25] A. Atserias and Ph. G. Kolaitis. *Consistency of Relations over Monoids*. Journal of the ACM, Volume 72, Issue 3 Article No.: 18, Pages 1 - 47, 2025. Preliminary version in PODS'24.

[AK'25] A. Atserias and Ph. G. Kolaitis. *Consistency Witnesses for Annotated Relations*. To appear in SIGMOD Record 2025.