

# Thirty Years of Abstract Interpretation A UK Perspective

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# Outline

**1** Introduction

2 Foundations to Applications

3 Current Developments

4 Conclusions

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# Some History

1981 Mycroft – Applicative Programs

1984 Nielson – Domain Theory

1985 Canterbury workshop (Higher-order Strictness Analysis)

1987 Abstract Interpretation of Declarative Languages published

1987 Hughes and Wadler – Projections

1989 First Semantique project

# Some History – continued

1991 PEPM launched

1991 Hunt – PERS

1992 Semantique 2 Working Group

1994 SAS launched

1999 Principles of Program Analysis published

2001 Parma Polyhedral Library launched

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# Foundations

- Domains (Burn, Hill, King, Mellish, Mycroft, Wadler)
- Projections and PERS (Hughes, Hunt, Wadler)
- Stone Duality – Strictness Types (Jensen, Benton)
- Game Semantics (Malacaria, Hankin)
- Quantitative Analysis (Clark, Hankin, Hunt, Malacaria, Wiklicky)

# Algorithms

- Frontiers Algorithms (Clack, Peyton-Jones, Hankin, Hunt, Martin) – Approximation methods (Hankin, Hunt)
- Minimal Function Graphs (Mycroft, Rosendahl)
- Lazy Types (Hankin, Le Métayer)
- Polyhedra (Hill, King)
- BDDs (King)

# Applications

**Functional:** Strictness Analysis; Binding Time Analysis; Escape Analysis; Control Flow

**Logic:** Groundedness Analysis; Dependency Analyses; Circularities – Occurs Check avoidance; Type Analysis

**Imperative:** Pointers; Numerical analyses

**Object-Oriented:** Control Flow; Escape Analysis; Security

**Language Based Security:** Confinement; Protocol Analysis; Buffer Over-runs

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# Cambridge (Mycroft)

- Program analysis and compilation techniques applied to hardware
- Semantics and compilation using continuations
- Inverse program analysis – extracting program corrections from program analysis inconsistencies

# City, Kings and Queen Mary (Hunt, Clark and Malacaria)

- Quantitative Information Flow – language based security using Shannon's Information Theory
- Flow-sensitive security types (with Sands)
- PERs and Abstract Non-Interference (with Mastroeni)

# Kent (King)

- Backward analysis for reasoning about legacy code, concurrency, determinacy and verification
- Representation of Boolean functions for groundedness analysis, dependency analyses and Reduced-Ordered BDD approximation techniques
- Security issues and buffer-overrun
- Polyhedral techniques

# Leeds (Hill)

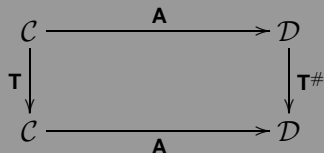
- A Library of Polyhedra – free software distributed under the terms of the GNU General Public License
- Domain Construction and Grids for Software Analysis
- Analyzing the Natural Semantics of Programs
- Analyzing Object-Oriented Languages
- Numerical Stability of software – detecting numerical instability in software caused by the approximate binary or floating point representations of numbers.

# Imperial (Di Pierro, Hankin and Wiklicky)

- Analysis of protocols for ad hoc wireless networks (with Nanz)
- Pointer analysis for C (with Pearce and Kelly)
- Probabilistic Abstract Interpretation (with Di Pierro and Wiklicky)

# Probabilistic Abstraction

Consider a **Concrete Domain**  $\mathcal{C}$  and an **Abstract Domain**  $\mathcal{D}$ :

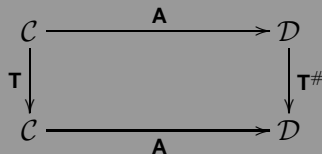


With an **abstraction**  $\mathbf{A} : \mathcal{C} \rightarrow \mathcal{D}$  and a **concretisation**  $\mathbf{G} : \mathcal{D} \rightarrow \mathcal{C}$ :

$$\mathbf{T}^\# = \mathbf{GTA}$$

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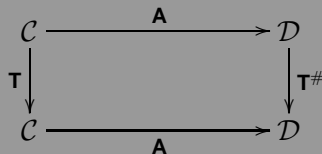
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Abstract Interpretation:  $(\mathbf{A}, \mathbf{G})$  form a **Galois Connection**.

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Probabilistic Abst.Int.:  $(\mathbf{A}, \mathbf{G})$  **Moore-Penrose Pseudo-Inverse**.

# Moore Penrose Pseudo-Inverse

## Definition

Let  $\mathcal{C}$  and  $\mathcal{D}$  be two Hilbert spaces and  $\mathbf{A} : \mathcal{C} \rightarrow \mathcal{D}$  a bounded linear map. A bounded linear map  $\mathbf{A}^\dagger = \mathbf{G} : \mathcal{D} \rightarrow \mathcal{C}$  is the **Moore-Penrose pseudo-inverse** of  $\mathbf{A}$  iff

- (i)  $\mathbf{A} \circ \mathbf{G} = \mathbf{P}_A$ ,
- (ii)  $\mathbf{G} \circ \mathbf{A} = \mathbf{P}_G$ ,

where  $\mathbf{P}_A$  and  $\mathbf{P}_G$  denote orthogonal projections onto the ranges of  $\mathbf{A}$  and  $\mathbf{G}$ .

An (orthogonal) projection is an operator  $\mathbf{P}$  with  $\mathbf{P}^* = \mathbf{P} = \mathbf{P}\mathbf{P}$ .

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# Moore-Penrose Pseudo-Inverse II

## Definition

An operator  $\mathbf{A} \in \mathcal{B}(\mathcal{H})$  is **Moore-Penrose invertible** if there exists an element  $\mathbf{G} \in \mathcal{B}(\mathcal{H})$  such that:

- (i)  $\mathbf{AGA} = \mathbf{A}$ ,
- (ii)  $\mathbf{GAG} = \mathbf{G}$ ,
- (iii)  $(\mathbf{AG})^* = \mathbf{AG}$ ,
- (iv)  $(\mathbf{GA})^* = \mathbf{GA}$ .

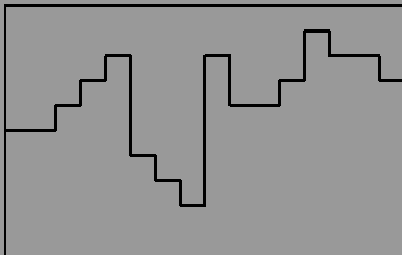
If it exists  $\mathbf{G} = \mathbf{A}^\dagger$  is called **Moore-Penrose pseudo-inverse**.

## Example: Function Approximation

Concrete and abstract domain are **step-functions** on  $[a, b]$ .

The set of (real-valued) step-function  $\mathcal{T}_n$  is based on the sub-division of the interval into  $n = 16, 8, 4, 2, 1$  sub-intervals.

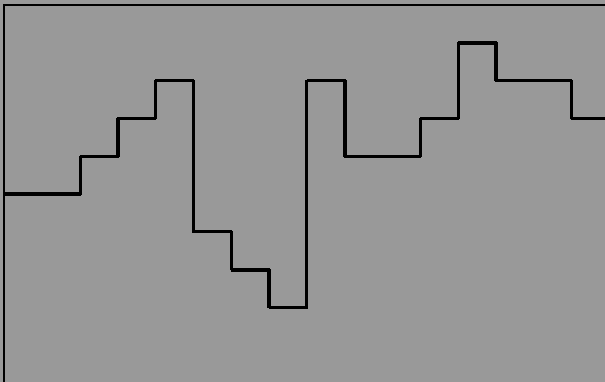
Each step function in  $\mathcal{T}_n$  corresponds to a vector in  $\mathbb{R}^n$ .



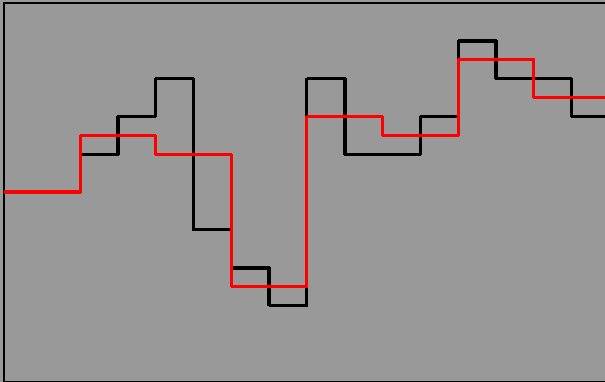
( 5 5 6 7 8 4 3 2 8 6 6 7 9 8 8 7 )



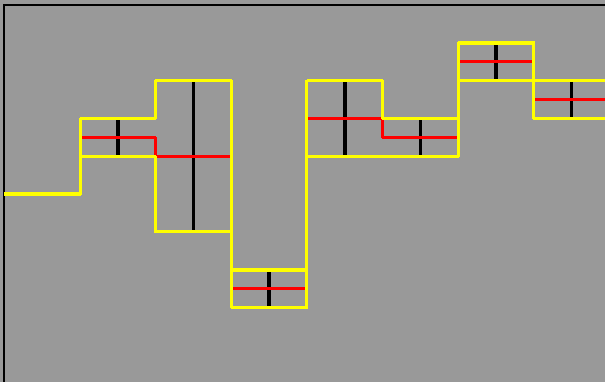
# Example: Geometric Comparison



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# Applications

- Approximate confinement
- Virus propagation in distributed systems
- Padding to remove timing leaks
- Probabilistic pointer analysis

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Congratulations to Patrick on 30 years of Abstract Interpretation!

# The End