Applying Category Theory to Improve the Performance of a Neural Architecture

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This work was supported in part by Sandia National Laboratories, Albuquerque, New Mexico, under contract no. 238984. Sandia is a multiprogram laboratory operated by Sandia Corporation, a Lockheed Martin Company, for the United States Department of Energy's National Nuclear Security Administration under Contract DE-AC04-94AL85000.

### **Semantic Representation**





## Colimits Express Specialization -Limits Express Abstraction





Maximally specific abstraction



image

#### **Stack Interval Network**



Stack Interval Patterns Represent Real Intervals

Positive stackComplement0 < v <= 1 $\bigcirc$  $\bigcirc$ 

Intersection of stack patterns (in template patterns)

0 < v <= 2  $\bigcirc$   $\bigcirc$   $\bigcirc$   $\bigcirc$   $\bigcirc$   $\bigcirc$   $\bigcirc$  Width 2 units

### **ART-1 with Stack Interval Inputs**



## ART-1 + F<sub>1</sub> Colimits, Limits



## Panchromatic Image - 1 m Resolution



# Multispectral Image - Generic ART-1 $\rho = 0.795$ Template density ordering



#### Multispectral Image - ART-1 with Limits $\rho = 0.55$ $F_{-1}$ tol = 0.55 Template density ordering



#### Information Theoretic Measure

 $I(X, Y) = \sum_{j} \sum_{k} p_{jk} \log (p_{jk} / p_{j} q_{k})$ Mutual information between random variables X and Y

Cluster images vs. panchromatic images

 ART-1 with Limits  $\rho = 0.55$   $F_{-1}$  tol = 0.55
 11.1523 bits

 Generic ART-1  $\rho = 0.795$  4.7116 bits

#### References

M. J. Healy, R. D. Olinger, R. J. Young, T. P. Caudell, and K. W. Larson, "Applying Category Theory to Improve the Performance of a Neural Architecture" (under review).

M. J. Healy and T. P. Caudell (2006) "Ontologies and Worlds in Category Theory: Implications for Neural Systems", *Axiomathes*, 16 (1), pp. 165-214.

M. J. Healy and T, P. Caudell (2004) "Neural Networks, Knowledge, and Cognition: A Mathematical Semantic Model Based upon Category Theory", *UNM Technical Report EECE-TR-04-020*, University of New Mexico, Albuquerque, NM, USA.

## **Template Patterns**



#### **Stack Numeral Quanta** Width *0* V = 0units Width 1 unit $0 < v <= 1 \bigcirc \bigcirc \bigcirc \bigcirc$ 3 < v <= 4Width 1 unit Width 1 unit $0 < v <= 2 \bigcirc \bigcirc \bigcirc \bigcirc \bigcirc \bigcirc$ Width 2 units Width 2 units 2 < V <= 4 0 0 0 $\bigcirc$

#### Neural Network Research Objective: Associate an Evolving Knowledge Structure with Neural Structure and Activity



## **Limits Express Abstraction**



## **Colimits Express Specialization**

