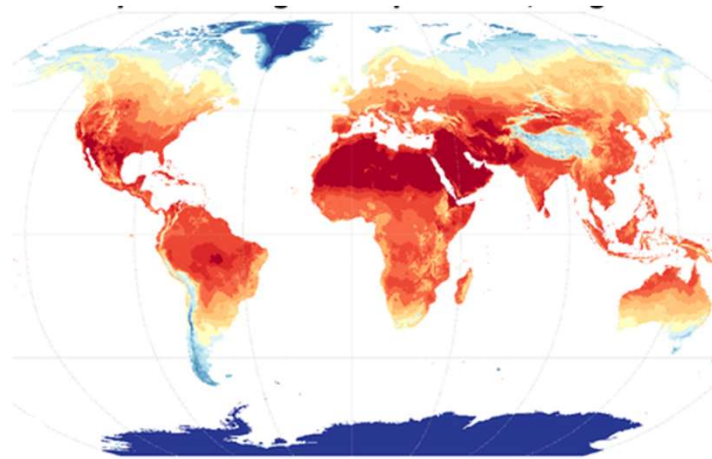


# Augment Economic Contribution Analysis with a Semantic Model

Add Reasoning to I-O with Theory-Directed Semantic Decomposition



**Dr. Greg Alward**  
*Alward Institute for Collaborative Science  
and  
University of Idaho*



MCRSA  
June 9-11, 2021



# Augment Economic Contribution Analysis with a Semantic Model

## Add Reasoning to I-O with Theory-Directed Semantic Decomposition

### ***Abstract***

Studies describing the economic contribution of agriculture and forestry industries are common. Even though studies usually draw information from a common source (I-O), they can vary widely regarding the precise meaning of “economic contribution” or simply “contribution”. Study-to-study comparisons are difficult because the *meaning* of contribution varies. This paper describes a method called “Theory-Directed Semantic Decomposition” (TDSD) that extends the common practice of structural decomposition applied to I-O and SAMs by including steps to identify characteristics that correspond to an extant economic theory such as economic base theory. This way, TDSD adds an explicit bridge between I-O data about contribution and theory-based knowledge about contribution. The augmented model, with added semantic layers of knowledge about contribution, can be investigated using multi-dimensional, semantic reasoning, and natural language querying tools. TDSD will benefit several use cases involving contribution analysis including learning/research, monitoring/reporting, and providing web-based analytical services.

# Motivation

- Discussions and explanations of Economic Contribution studies are often conflated with I-O accounting, I-O models, impact analysis, economic growth modeling ...
- Why not have a model that only describes contribution?

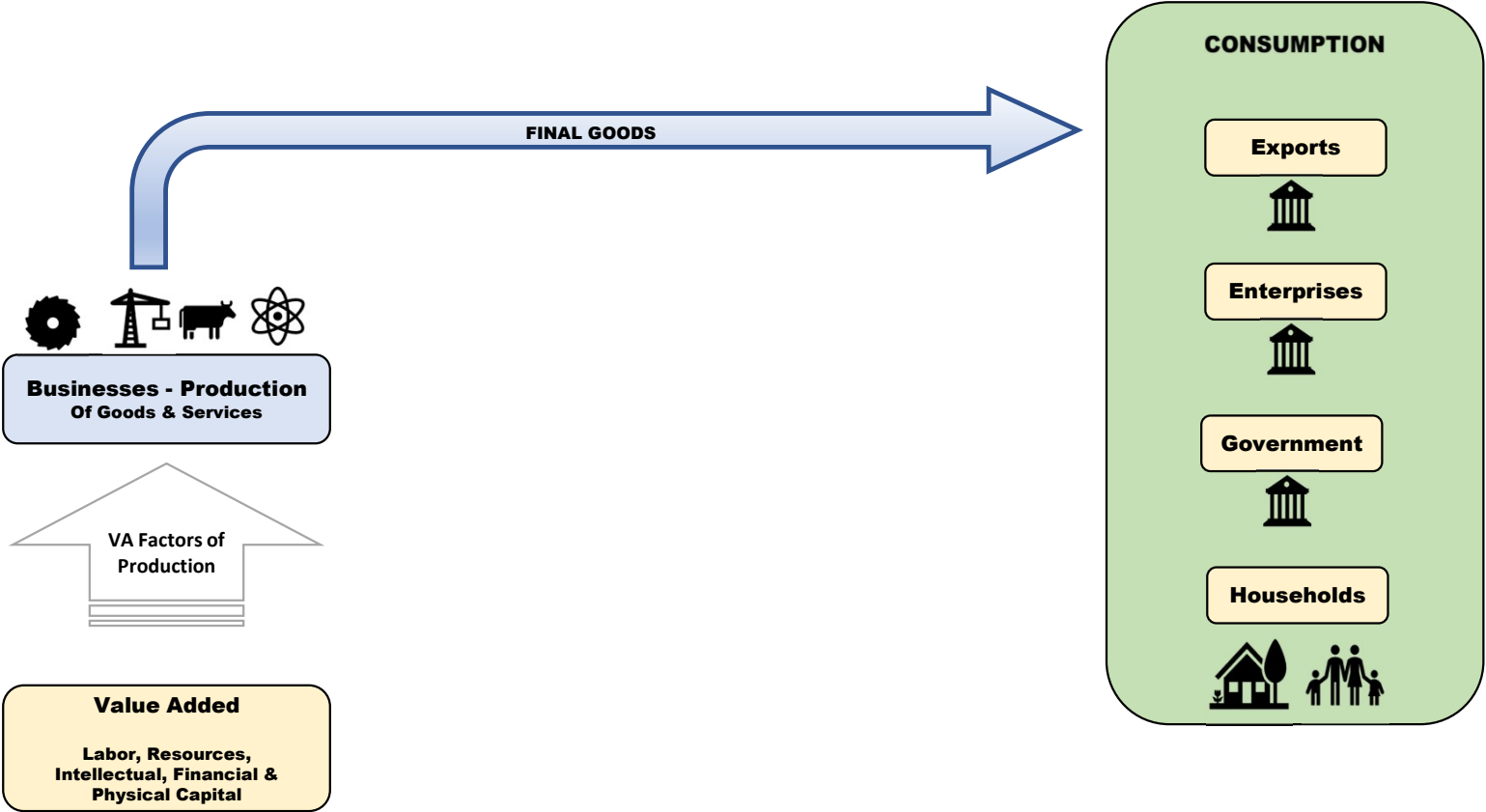
# TDSD and Regional Contribution Analysis

- Apply *Theory-Directed Semantic Decomposition* (TDSD) to Multi-Regional Social Accounts to build a Contribution Knowledge Network model
- TDSD is a replicable protocol for Economic Contribution Analysis, standardizing the “meaning” or semantics of contribution analysis
- TDSD uses information structured by Economic Base Theory to categorize/explain Contribution using Social Accounts data
  - The way production relates to internal vs external markets (Direct vs Support)
  - Exploits the relationship (accounting identity) of output and VA
  - Definitive about contribution ... to whom, of what, where, how
- The TDSD-derived contribution database can be “re-packaged” as a *Contribution Knowledge Network Model* that returns explanation patterns of contribution when queried

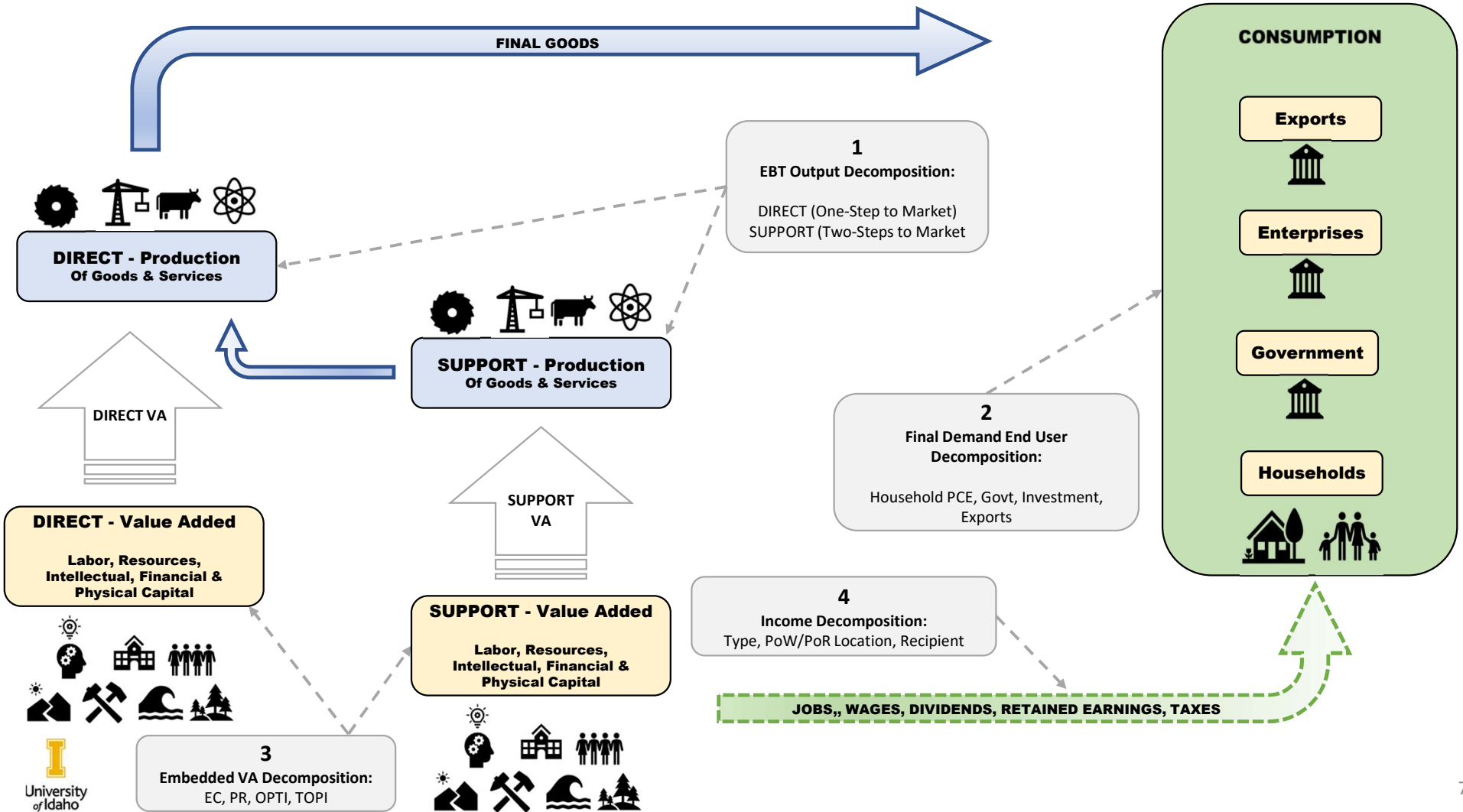
# TDSD Regional Contribution Analysis

- Contribution analysis uses information from Social Accounts along with relationships derived from Economic Base Theory to depict how a region's industries use the region's endowment of primary inputs (VA factors) to make final products which are sold to consumers.
- In short, contribution analysis is about connecting the incomes earned by owners of factors to final products delivered to consumers.

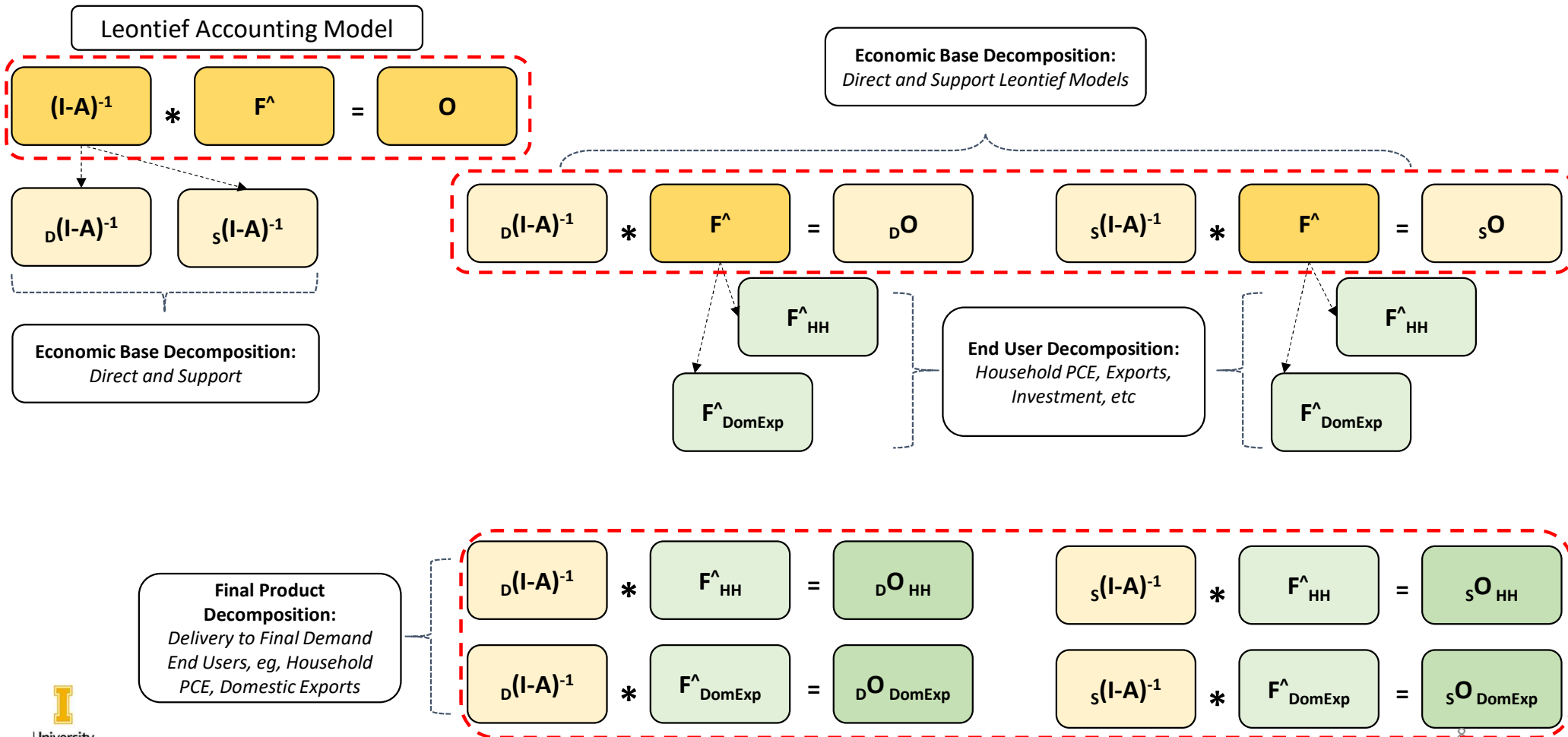
# Simplified Accounting Framework



# Theory-Directed Semantic Decomposition



# Decomposition of Final Product Output





# Decomposition of VA

**Final Product Decomposition:**  
 Delivered to End Users, eg, HH PCE, Domestic Exports, Investment, Foreign Exports

$$\begin{aligned}
 &D(I-A)^{-1} * F^{\wedge}_{HH} = D^O_{HH} \\
 &D(I-A)^{-1} * F^{\wedge}_{DomExp} = D^O_{DomExp} \\
 &D(I-A)^{-1} * F^{\wedge}_{OtherFD} = D^O_{OtherFD}
 \end{aligned}$$

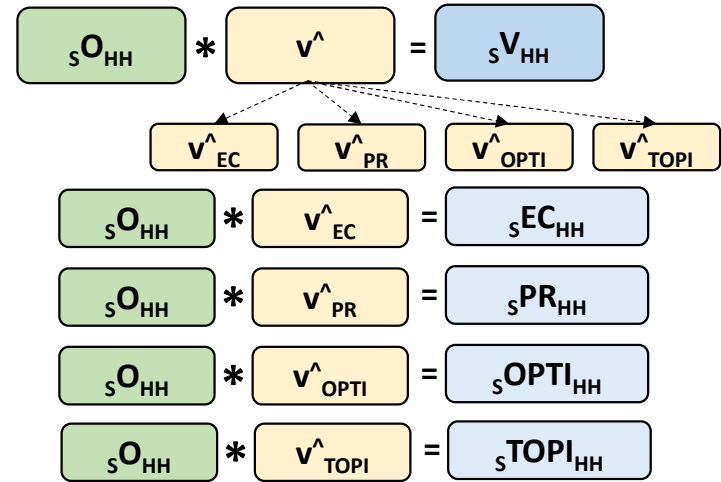
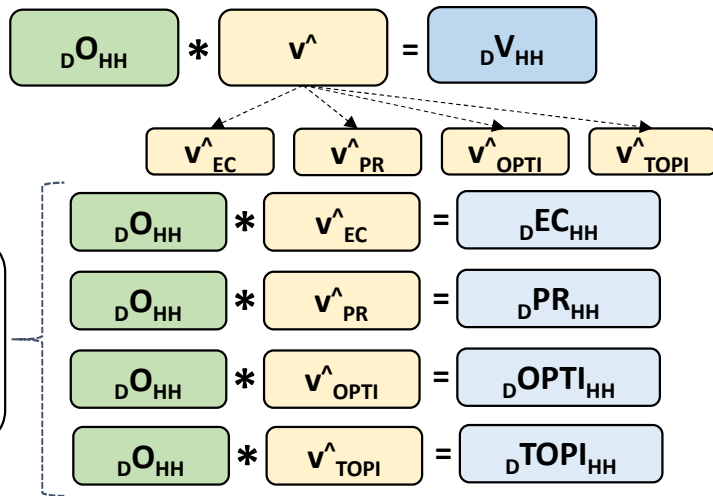
$$\begin{aligned}
 &S(I-A)^{-1} * F^{\wedge}_{HH} = S^O_{HH} \\
 &S(I-A)^{-1} * F^{\wedge}_{DomExp} = S^O_{DomExp} \\
 &S(I-A)^{-1} * F^{\wedge}_{OtherFD} = S^O_{OtherFD}
 \end{aligned}$$

**VA Embedded in Final Products**  
 Delivered to End Users, eg, HH PCE, Domestic Exports, Investment, Foreign Exports

$$\begin{aligned}
 &D^O_{HH} * v^{\wedge} = D^V_{HH} \\
 &D^O_{DomExp} * v^{\wedge} = D^V_{DomExp} \\
 &D^O_{OtherFD} * v^{\wedge} = D^V_{OtherFD}
 \end{aligned}$$

$$\begin{aligned}
 &S^O_{HH} * v^{\wedge} = S^V_{HH} \\
 &S^O_{DomExp} * v^{\wedge} = S^V_{DomExp} \\
 &S^O_{OtherFD} * v^{\wedge} = S^V_{OtherFD}
 \end{aligned}$$

# Contribution Database of VA (PoP & PoR) and Household Income (PoR)



**VA Components Embedded in Final Products for HH**  
 Employee Comp, Proprietor Income, OPTI, TOPI

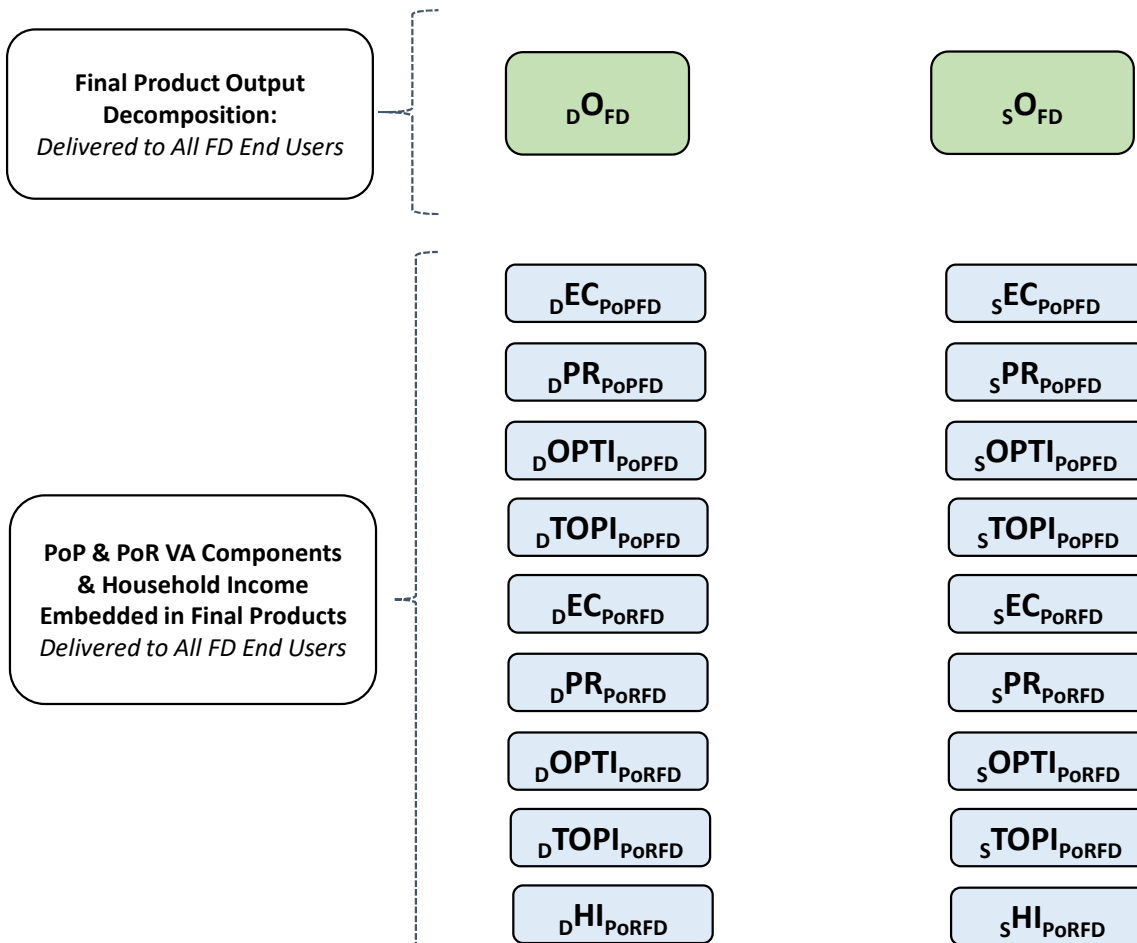
**VA Components Embedded in Final Products for Other FD**  
 Employee Comp, Proprietor Income, OPTI, TOPI

**Etc for Embedded PoP VA Components for Other FD End Users**

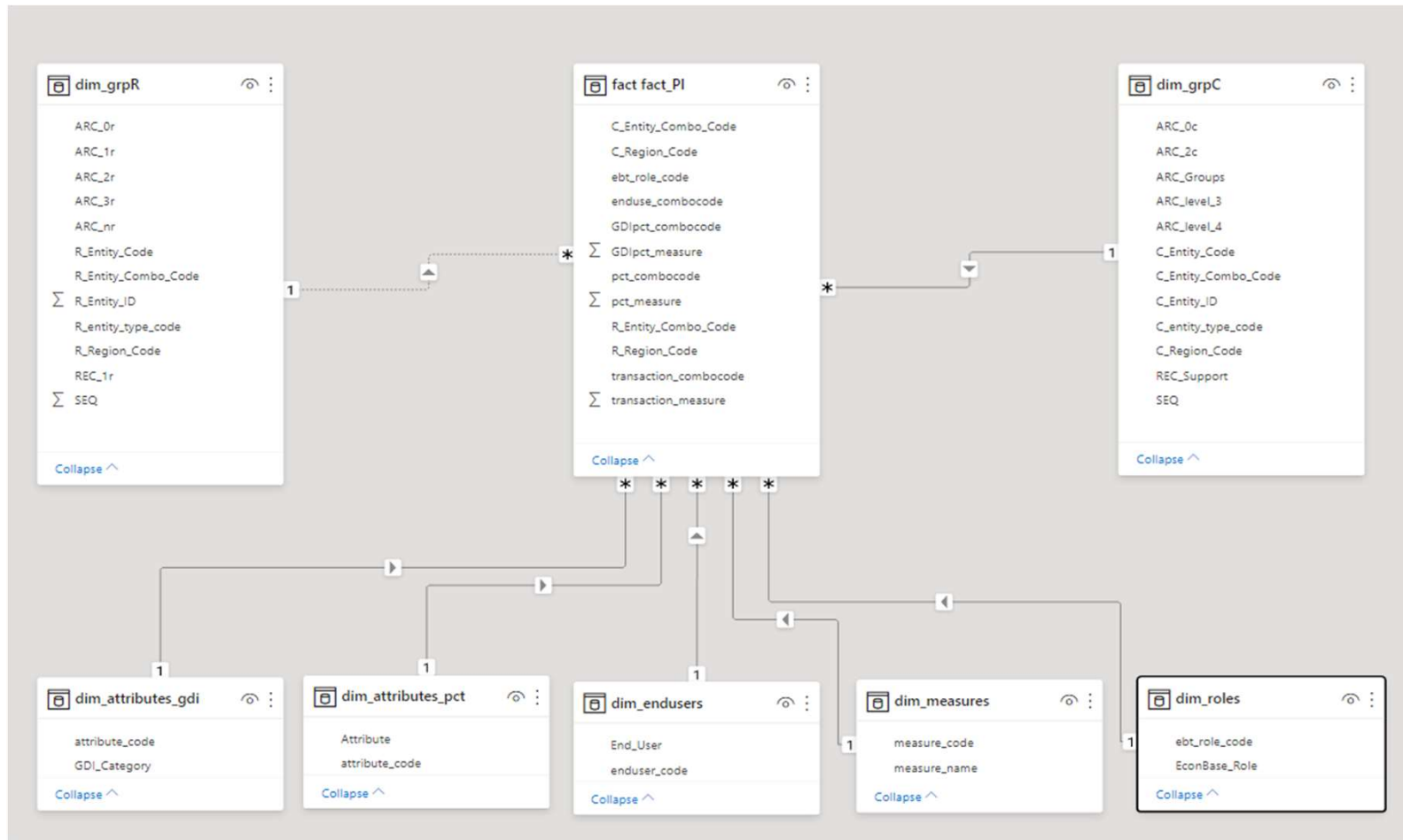
**Etc for Embedded PoR VA Components for All FD End Users**

**Etc for Embedded PoR Household Income for All FD End Users**

# Decomposed Contribution Database



# Multi-Dimensional Data Model



# Contribution Analysis with Contribution Data Model

- Decompose the SAM accounts to build a Contribution Data Model that explicitly relates the delivery of each final product to each:
  - Job (*Place of Production & Place of Residence*),
  - VA component (*Place of Production & Place of Residence*) transaction,
  - Household Income (*Place of Residence*) transaction, and
  - Output transaction to final products
- Use aggregation and decomposition queries producers contribute to the regional economy.

# Querying a Decomposed Contribution Database

## Jobs (PoP) by Resource Group

EconBase_Role	1_AGRIC	2_FOREST	3_MINERAL	4_CONSTRUCTION	5_ALL_OTHER	Total
01_DIRECT	50,792	13,375	4,438	66,291	575,193	710,088
02_SUPPORT	57,398	8,798	5,718	22,014	223,585	317,512
<b>Total</b>	<b>108,190</b>	<b>22,173</b>	<b>10,155</b>	<b>88,305</b>	<b>798,777</b>	<b>1,027,600</b>

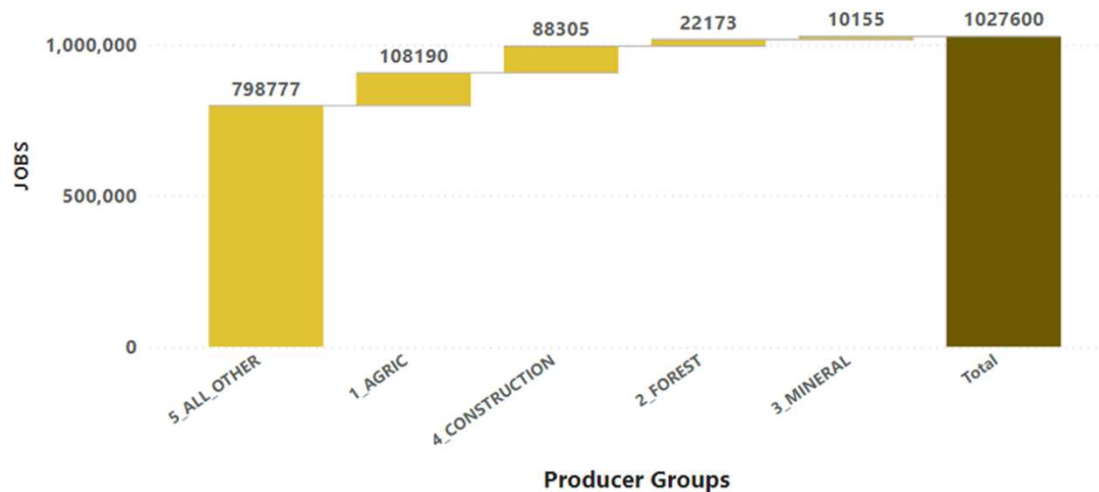
## Measure Selector

< 28\_DIMP 33\_OUTPUT 34\_JOBS\_PoP

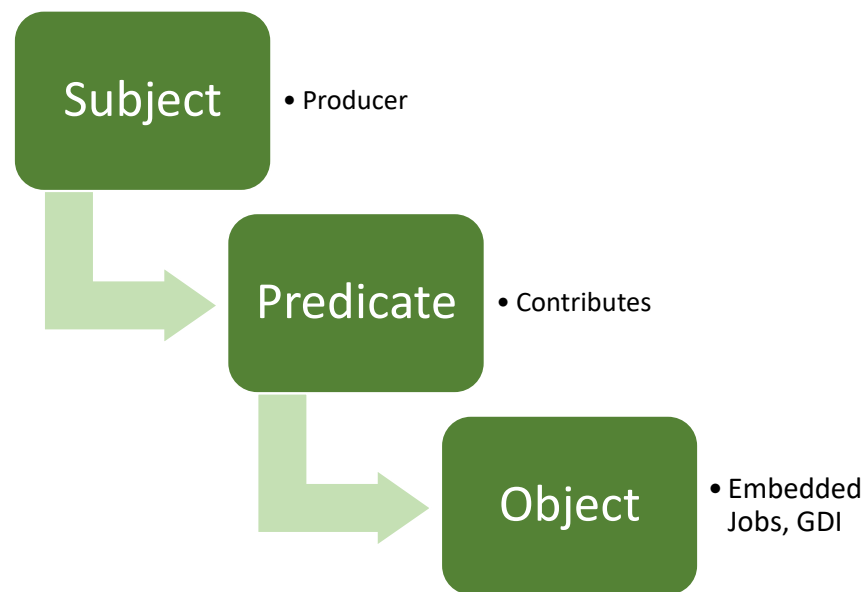
## Resource Group Selector

1\_AGRIC 2\_FOREST 3\_MINERAL >

## Idaho Jobs by Producer Group



# Database to Knowledgebase: Semantic Triples



## Semantic Triple

**Semantic queries** work on *linked triples*. This enables the query to process the relationships *between* information and *infer* the answers from the *network of knowledge* e.g., using *backward chaining*.

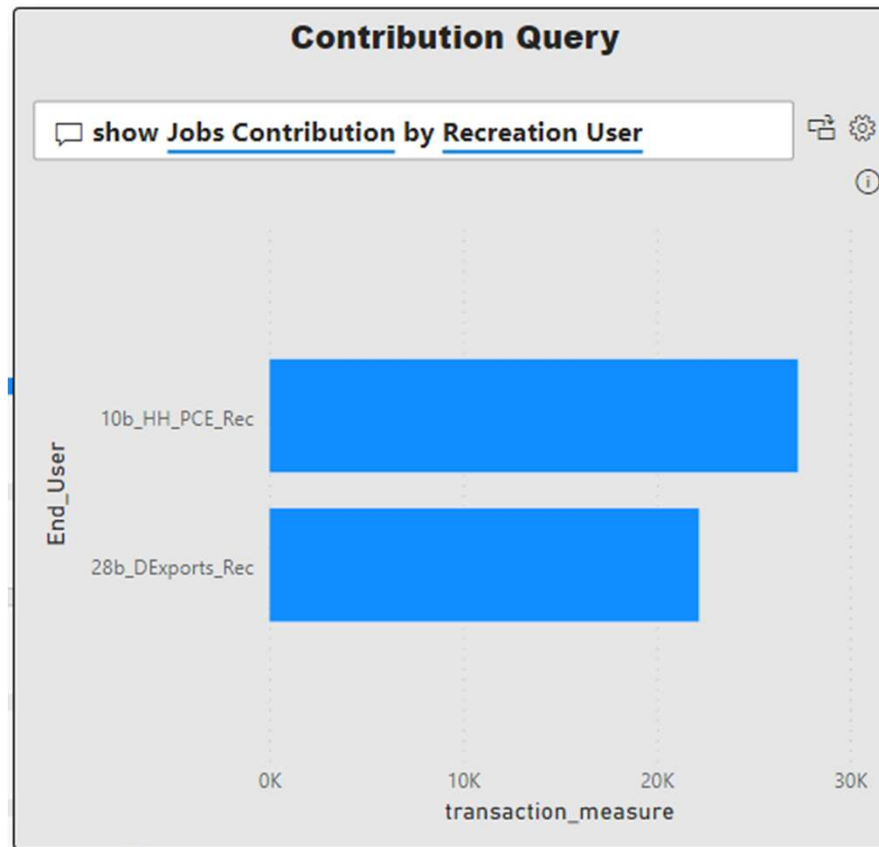
A **controlled vocabulary** organizes semantic knowledge about *contribution analysis* for subsequent retrieval, mandating the use of *predefined terms* consistent with *Economic Base Theory*.

# Contribution Analysis with a Knowledge Network Model

- Reframe the Data Model as a Knowledge Network using *semantic triples* to encode how each transaction relates to a measure of Contribution
- Formulate ***Semantic Queries*** using a ***Controlled Vocabulary*** and ***Backward Chaining*** to navigate the Contribution Knowledge Network.



# Semantic Query Using Controlled Vocabulary



# Explanation Pattern: Chain of Contribution of Jobs by Producers Serving Outdoor Recreation Market

< Back to report

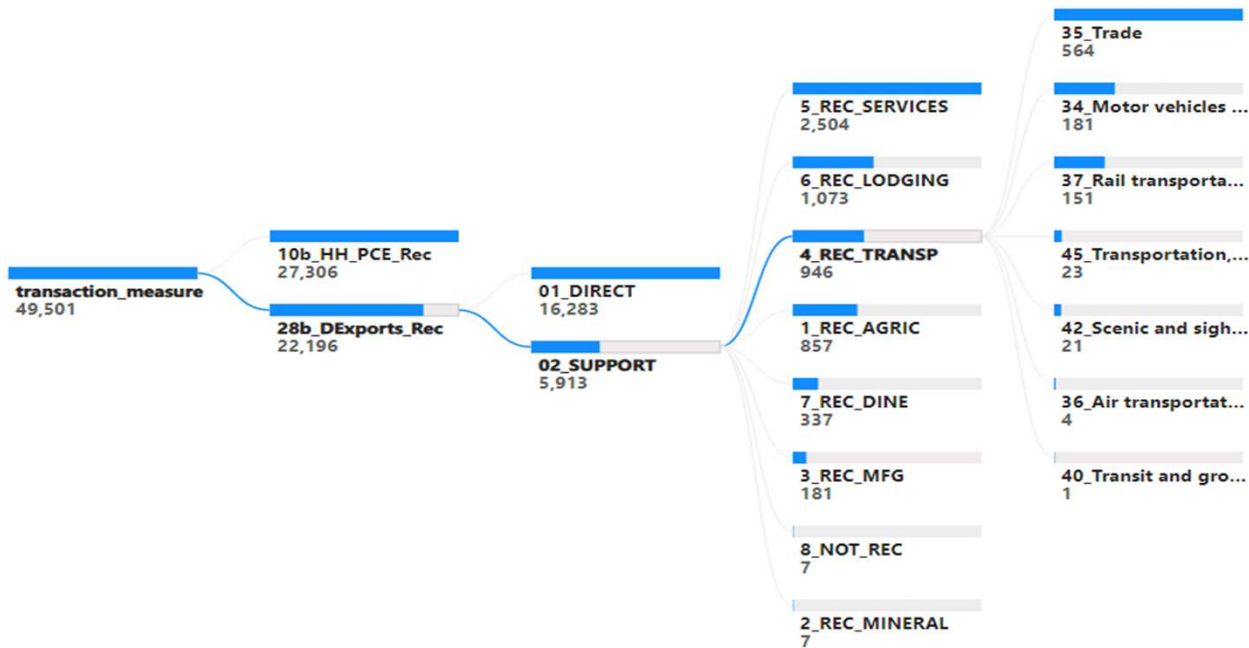
OUTDOOR RECREATION JOBS BY USER CATEGORY

End\_User x  
28b\_DExports\_Rec

EconBase\_Role x  
02\_SUPPORT

REC\_Support x  
4\_REC\_TRANSP

ARC\_level\_4 x

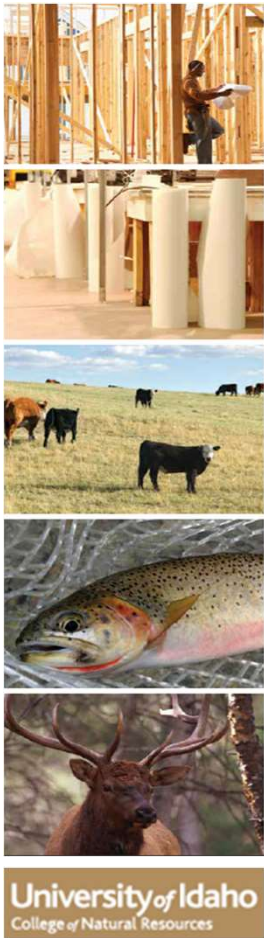


# Augmented Contribution Analysis with a Knowledge Network Model

- Knowledge Network instantiates a semantic model of Contribution Analysis
- *Semantic Queries* using *Controlled Vocabulary* **constrains** questions about Contribution Analysis to the set of information about Contribution only – repeatable and comparable Contribution Analysis
- Both summary and pattern knowledge about Contribution
- Both Regional and Multi-Regional Contribution Analysis: VA of Region A embedded in final products of Region B (e.g., TiVA)
- Distinguishes Contribution Analysis from Impact Analysis

# Thanks!

[Greg.Alward@AlwardInstitute.org](mailto:Greg.Alward@AlwardInstitute.org)  
[galward@uidaho.edu](mailto:galward@uidaho.edu)



**% Jobs (PoP) by Resource Group**

EconBase_Role	1_AGRIC	2_FOREST	3_MINERAL	Total
01_DIRECT	4.9	1.3	0.4	6.7
02_SUPPORT	5.6	0.9	0.6	7.0
<b>Total</b>	<b>10.5</b>	<b>2.2</b>	<b>1.0</b>	<b>13.7</b>

**Measure Selector**

< 28\_DIMP 33\_OUTPUT **34\_JOBS\_PoP**

**Resource Group Selector**

**1\_AGRIC** 2\_FOREST 3\_MINERAL >

**Percent of All Idaho Jobs by Resource Group**

