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**PRAIRIE VIEW  
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**TEXAS**  
The University of Texas at Austin

# **Poop For You: A Case Study of the Manure Matching Problem**

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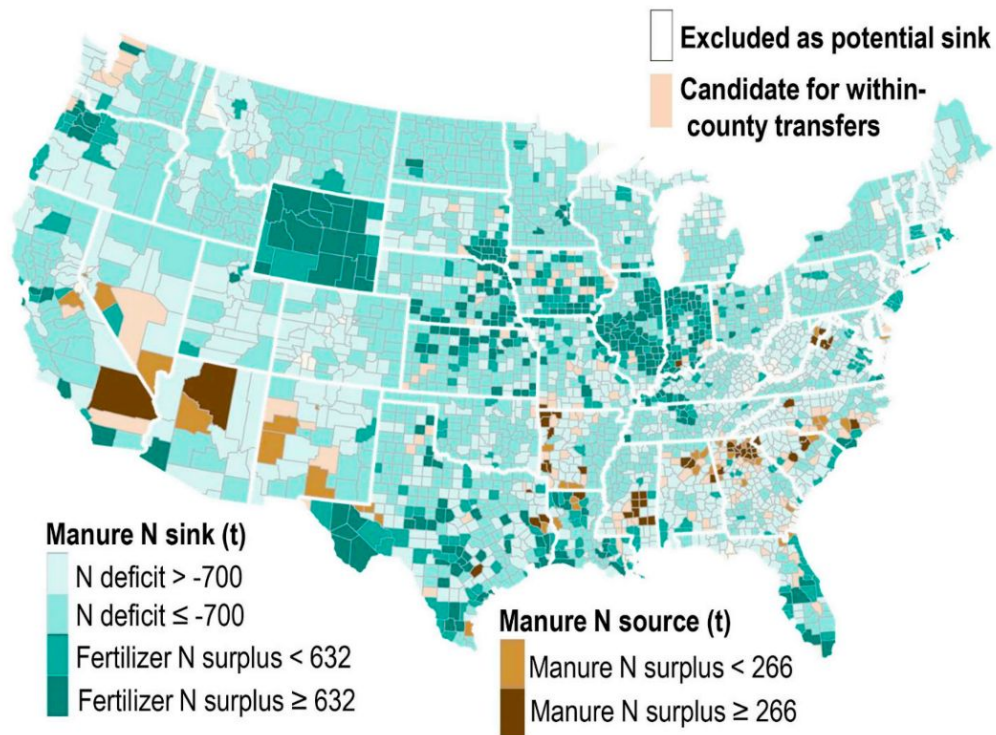
# Outline

1. Project Overview
2. Methodology
  - a. Assumptions
  - b. Nomenclature
  - c. Formulation
3. Case Study
4. Results
5. Conclusions

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# Motivation



**N in manure  
produced**

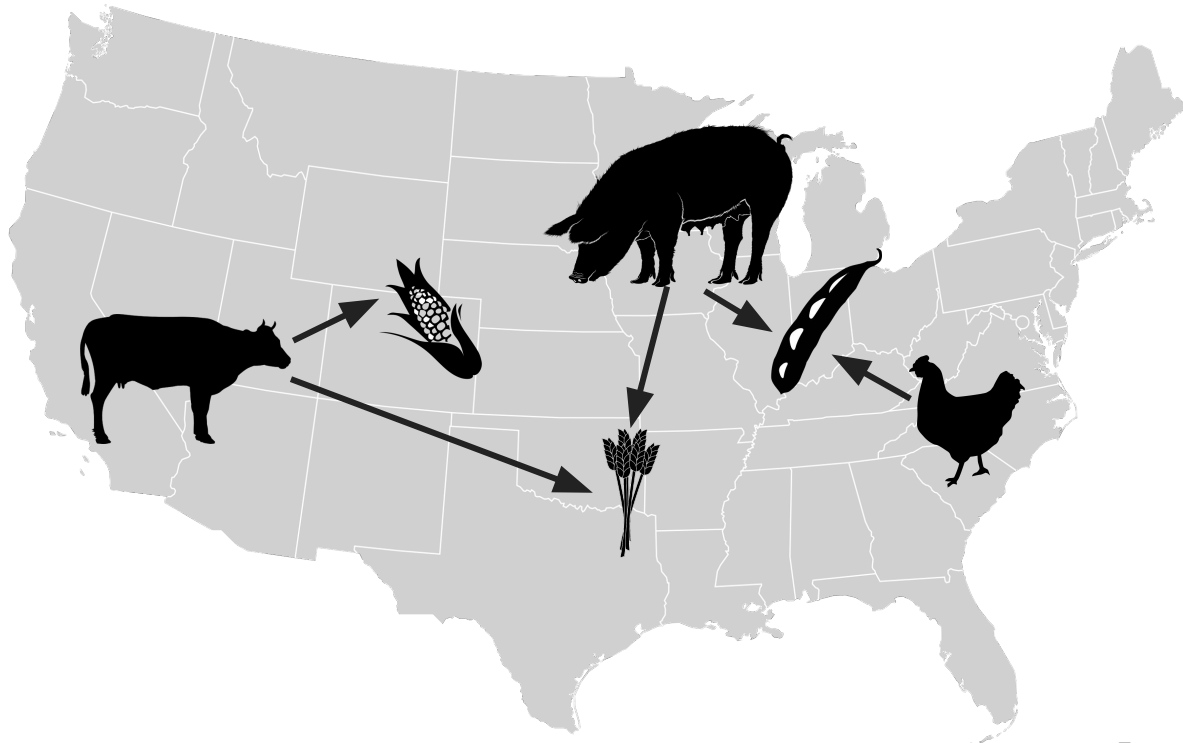
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**Synthetic N  
fertilizer  
purchased**

[1]

# Research Question

How can  
manure be  
optimally  
re-allocated to  
minimize total  
costs?



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# Assumptions

1. Losses are negligible
2. A central entity controls the manure market
3. Individual farms can be aggregated to the county level

# What is a Mixed Integer Program (MIP)?

$$\min c^T x + d^T y \quad \left. \vphantom{\min c^T x + d^T y} \right\} \text{objective function}$$

s.t.

$$Ax + By \leq q$$

$$x \in \mathbb{R}^n$$

$$y \in \mathbb{Z}^m$$

decision  
variables

constraints



# Formulation: Variables

## Sets

$I^+$  : counties with excess manure (sources)

$I^-$  : counties in need of manure (sinks)

$K$  : manure treatments

## Decision Variables

$x_{ijk}$  : amount of type  $k$  manure transported from county  $i$  to county  $j$

$y_{ijk}$  : whether manure type  $k$  is transported from county  $i$  to county  $j$

$w_{ik}$  : whether source county treats manure to type  $k$  or sink county receives type  $k$  manure

$z_i$  : amount of manure disposed of in source county or synthetic fertilizer purchased in sink county

$q_i$  : whether manure is disposed of in source county or synthetic fertilizer is purchased in sink county

# Formulation: Objective Function

$$\begin{aligned}
 \min \quad & \sum_{i \in I^+} \sum_{j \in I^-} \sum_{k \in K} (c_{ijk}^v x_{ijk} + c_{ijk}^f y_{ijk}) \quad \left. \vphantom{\sum_{i \in I^+} \sum_{j \in I^-} \sum_{k \in K}} \right\} \text{transportation costs} \\
 & + \sum_{j \in I^-} \sum_{k \in K} \left( p_{jk}^v \sum_{i \in I^+} x_{ijk} \right) + \sum_{i \in I^+} \sum_{k \in K} \left( p_{ik}^v \sum_{j \in I^-} x_{ijk} \right) \quad \left. \vphantom{\sum_{j \in I^-} \sum_{k \in K} \left( p_{jk}^v \sum_{i \in I^+} x_{ijk} \right)} \right\} \text{manure} \\
 & \quad \quad \quad \text{application costs} \\
 & + \sum_{i \in \{I^+, I^-\}} \sum_{k \in K} p_{ik}^f w_{ik} + \sum_{i \in \{I^+, I^-\}} (t_i^v z_i + t_i^f q_i) \quad \left. \vphantom{\sum_{i \in \{I^+, I^-\}} \sum_{k \in K} p_{ik}^f w_{ik}} \right\} \text{manure disposal \&} \\
 & \quad \quad \quad \text{synthetic fertilizer costs}
 \end{aligned}$$

# Formulation: Constraints

$$\sum_{j \in I^-} \sum_{k \in K} x_{ijk} + z_i = s_i \quad \forall i \in I^+$$

1: source mass balance

$$\sum_{i \in I^+} \sum_{k \in K} x_{ijk} + z_j = d_j \quad \forall j \in I^-$$

2: sink mass balance

$$\sum_{j \in I^-} x_{ijk} \leq s_i w_{ik} \quad \forall i \in I^+, k \in K$$

3: supply binary variable

$$\sum_{i \in I^+} x_{ijk} \leq d_j w_{jk} \quad \forall j \in I^-, k \in K$$

4: demand binary variable

$$x_{ijk} \leq \min\{s_i, d_j\} y_{ijk} \quad \forall i \in I^+, j \in I^-, k \in K$$

5: transport binary variable

$$z_i \leq s_i q_i \quad \forall i \in I^+$$

6: excess supply binary variable

$$z_j \leq d_j q_j \quad \forall j \in I^-$$

7: unmet demand binary variable

# Formulation: Decision Variable Bounds

$$0 \leq x_{ijk} \leq \min\{s_i, d_j\} \quad \forall i \in I^+, j \in I^-, k \in K$$

$$y_{ijk} \in \{0,1\} \quad \forall i \in I^+, j \in I^-, k \in K$$

$$w_{ik} \in \{0,1\} \quad \forall i \in I, k \in K$$

$$0 \leq z_i \leq s_i \quad \forall i \in I^+$$

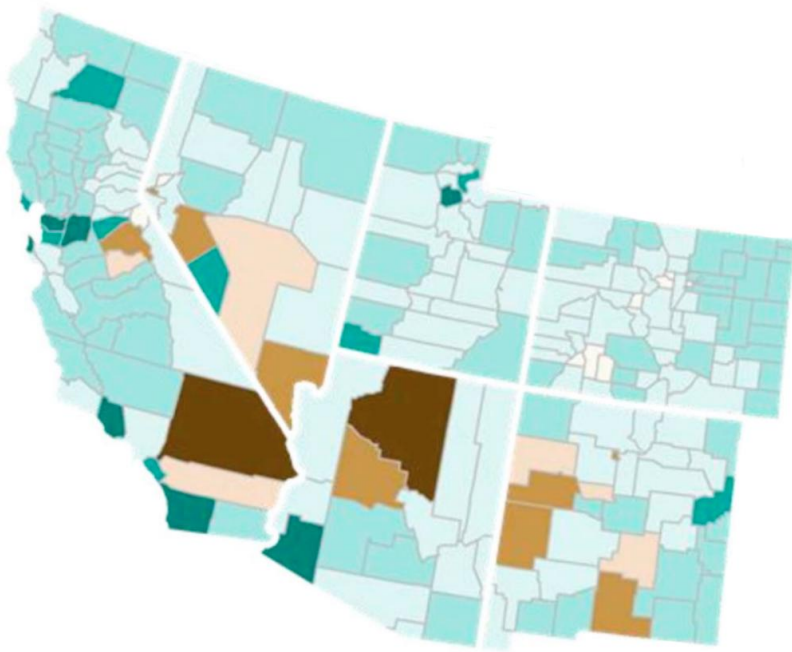
$$0 \leq z_j \leq d_j \quad \forall j \in I^-$$

$$q_i \in \{0,1\} \quad \forall i \in I$$

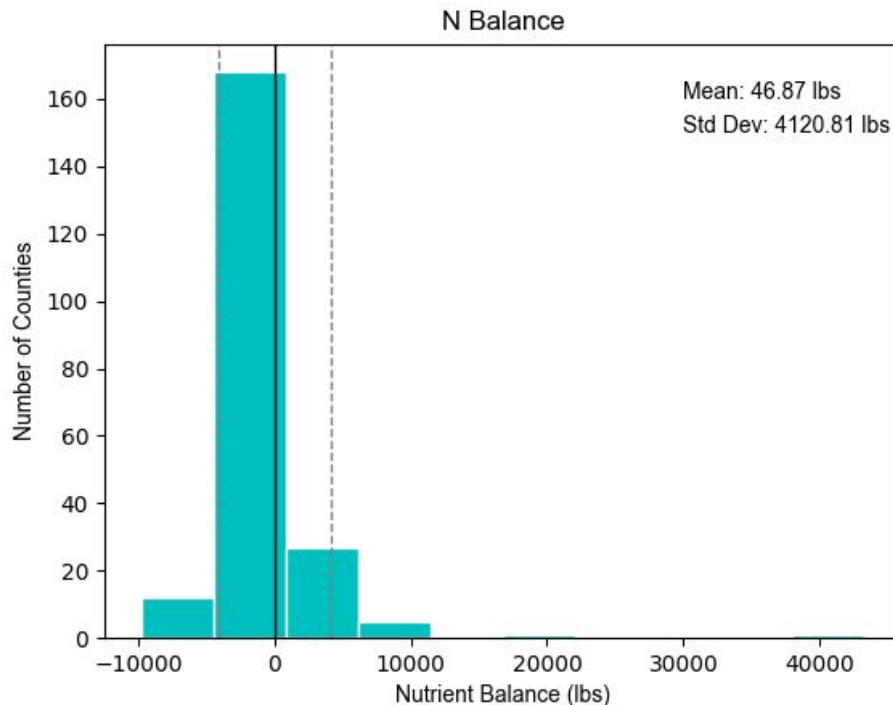
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# Case Study: CA-CO-NV-UT-AZ-NM



# Case Study: Nitrogen Balance



# Parameters

Symbol	Description	Value	Units	Source
$s_i$	Supply of manure from each source county	-	tons	[2]
$d_j$	Demand of manure for each sink county	-	tons	[2]
$c_{ij}^V$	Distance between counties (straight-line distance)	-	miles	[9]
	Cost of manure transport	\$0.0089	\$ / mi - lb N	[4]
$p_j^v$	Variable cost of applying manure (price of manure)	\$0.63	/lb N	[5]
$t_i^f$	Fixed cost of manure disposal	\$141,894	-	[6]
$t_i^v$	Variable cost of manure disposal	\$0.53	/lb N	[7]
$t_j^v$	Variable cost of synthetic fertilizer	\$0.92	/lb N	[8]

*All other parameters assumed to be zero*



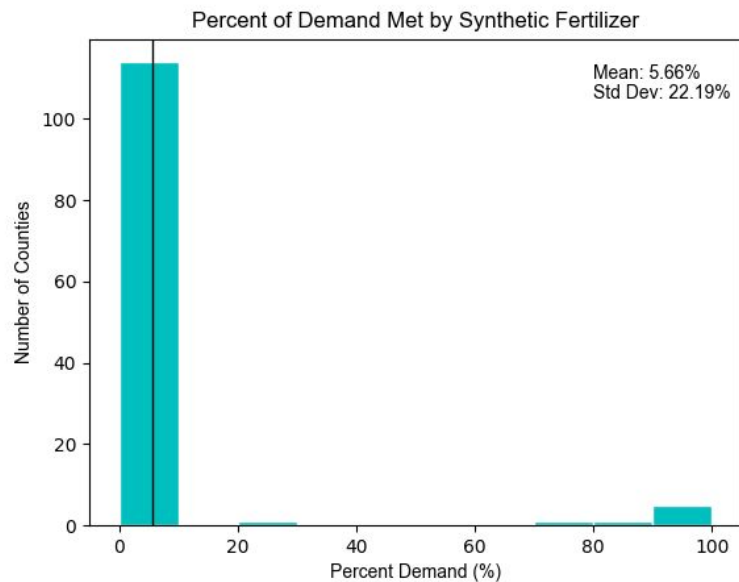
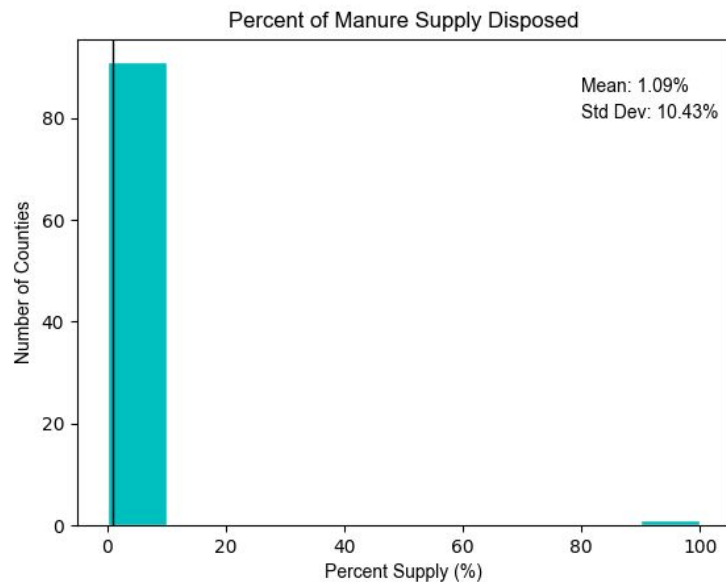
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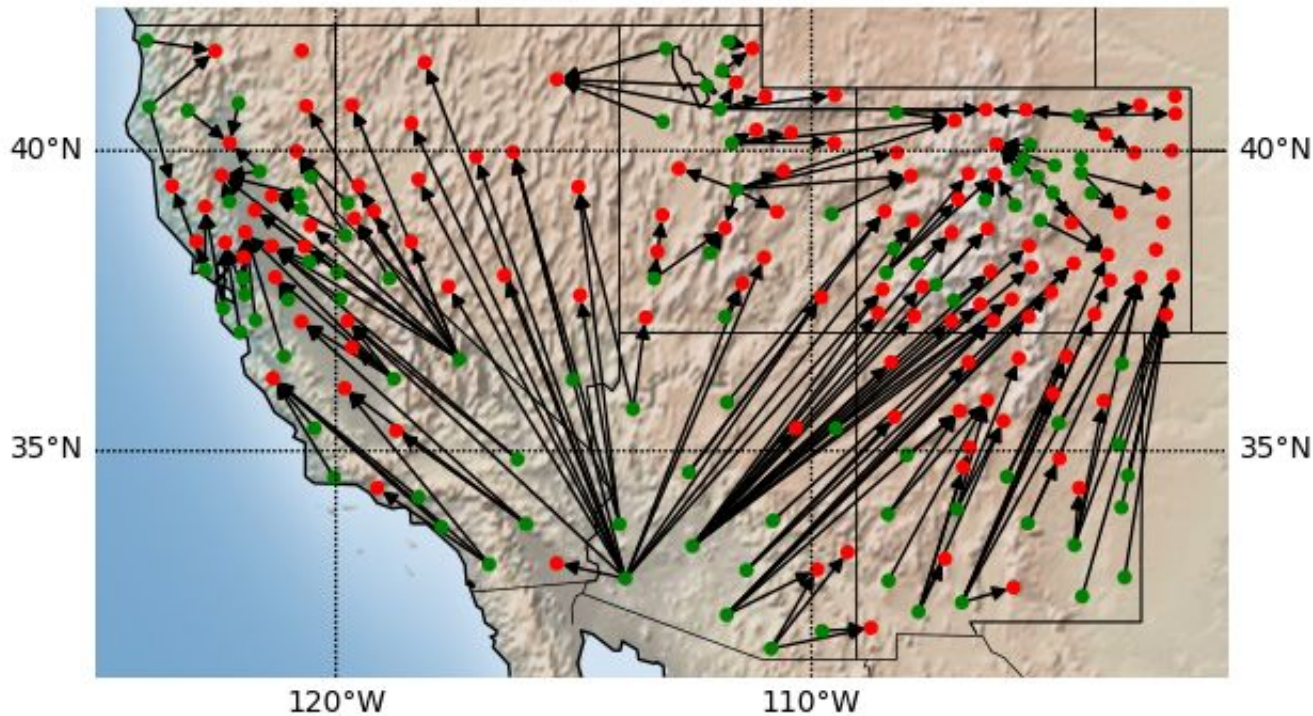
# Results Summary

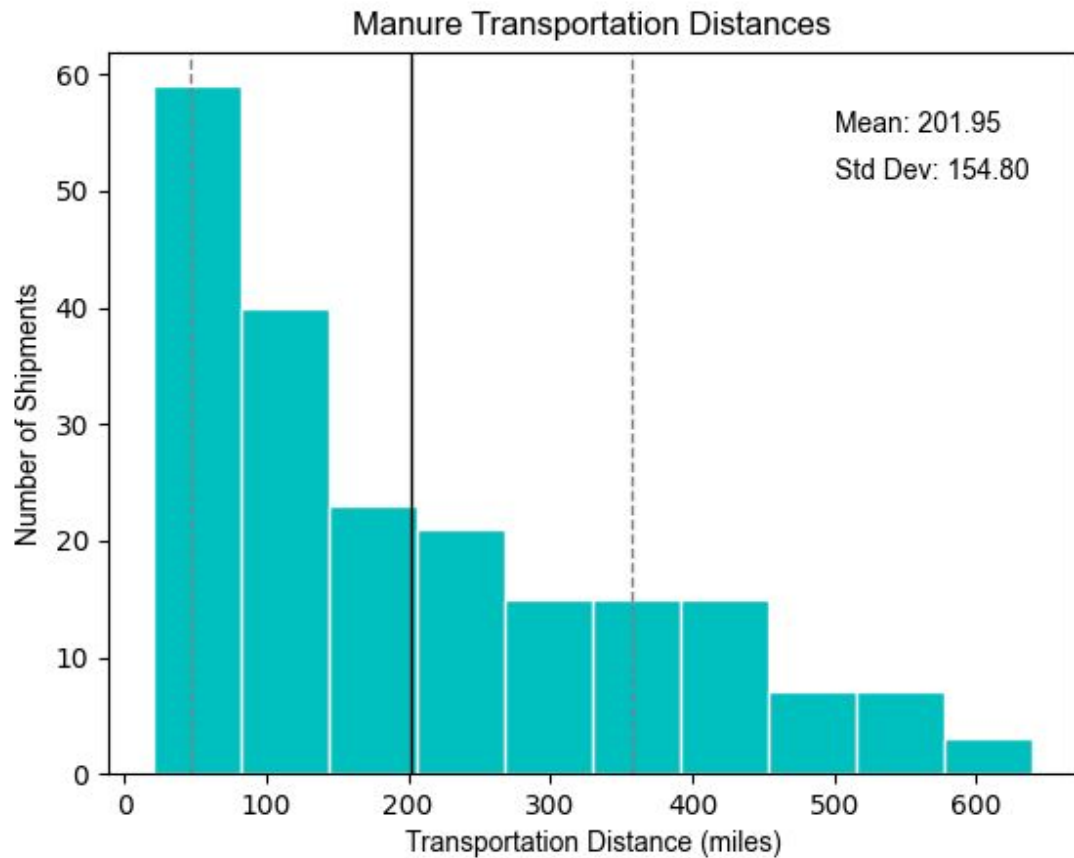
	Status Quo [2]		Least-Cost Matching	
	Weight (lbs N)	Cost (\$)	Weight (lbs N)	Cost (\$)
Manure Wasted	178,390	\$ 13,148,795	43,322	\$ 164,855
Synthetic Fertilizer Purchased	168,359	\$ 154,890	33,292	\$ 30,628
Other Costs (Transportation, etc.)	-	-	135,067	\$ 330,489
Total Cost	-	\$ 13,303,685	-	\$ 525,972

# Results Summary



## Optimal Manure Matching





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# Conclusions

1. Significant savings possible through manure reallocation
2. In the least-cost matching solution, the majority of expense comes from transportation
3. Sources and sinks may not be matched purely by proximity due to relatively low transportation costs

# Extensions & Future Work

1. Sensitivity Analysis
2. Expand geographic region of study
3. Different manure treatment options
4. Alternative objective: environmental impact optimization
5. Game-theoretic paradigm



# Acknowledgements

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- Laura Klopfenstein



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SCHOLAR PROGRAM

# References

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# QUESTIONS?