

Community Resilience: Demonstrating the Socioeconomic Value of Earth Science Data



Arika Virapongse
Middle Path EcoSolutions & Ronin Institute
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ESIP summer meeting 2018, Tucson, AZ, July 18, 2018

Session Co-organizers:

- Arika Virapongse, Middle Path EcoSolutions & Ronin Institute
- Lindsay Barbieri, University of Vermont
- Ruth Duerr, Ronin Institute
- Beth Huffer, Lingua Logica

Acknowledgements:

- Brian Wee, Neptune and Company, Inc.
- Christine White, Esri
- Elizabeth Covelli Metcalf, University of Montana

- Background
- Goals of the session
- Introduction of Presenters
- Presentations
- Feedback
- Next steps



Background

A place-based community: physical, geographically-defined entities, such as towns, cities, or incorporated rural areas, with a governance structure and an ability to engage in meaningful ways toward a structured resilience plan (Adapted from NSF S&CC)

Community resilience: a community's capacity to **utilize available resources** and respond to disturbances by recovering rapidly, **adapting to change**, building back better (bouncing forward), and improving their quality of life. (NIST, RAND, PHE)



ESIP winter 2018 session

Goals were to seek out:

- Linkages between data-driven community resilience and other ESIP work, as well as with the overall Earth Science data community
- Specific ways that ESIP can contribute to place-based community resilience

Blog:

<http://esipfed.org/collaboration-updates/the-socioeconomic-value-of-earth-science-data-for-community-resilience>

White paper: <https://tinyurl.com/y6vl4oev>

Peer-reviewed paper: Virapongse, A., R. Duerr, E.C. Metcalf (in press). Knowledge mobilization for community resilience: Perspectives from data, informatics, and information science. Sustainability science.

Results

1. Helping communities access the right tools and information
2. Documenting place-based community resilience use cases to help enable the development of useful data and information products, processes, and tools
3. Developing and sharing conceptual and technical tools that enable transdisciplinary collaboration and community resilience

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Moving forward

- Partner with other ESIP clusters
- Create an actionable framework within ESIP
- Capture the process of our workflow

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White paper: <https://tinyurl.com/y6vl4oey>

Peer-reviewed paper: Virapongse, A., R. Duerr, E.C. Metcalf (in press). Knowledge mobilization for community resilience: Perspectives from data, informatics, and information science.. Sustainability science.

Goals of the session

- Present case studies of community resilience issues that highlight their data challenges
- Seek feedback from the ESIP community on how to overcome data challenges
 - Feedback at <https://tinyurl.com/ybdz9hrk>



Presenters



Chelsie Romulo

Assistant Professor

Environmental & Sustainability Studies,

University of Northern Colorado

email: chelsie.romulo@unco.edu

“Modeling conditions that enable payments
for watershed services programs”



Sari Ladin-Sienne

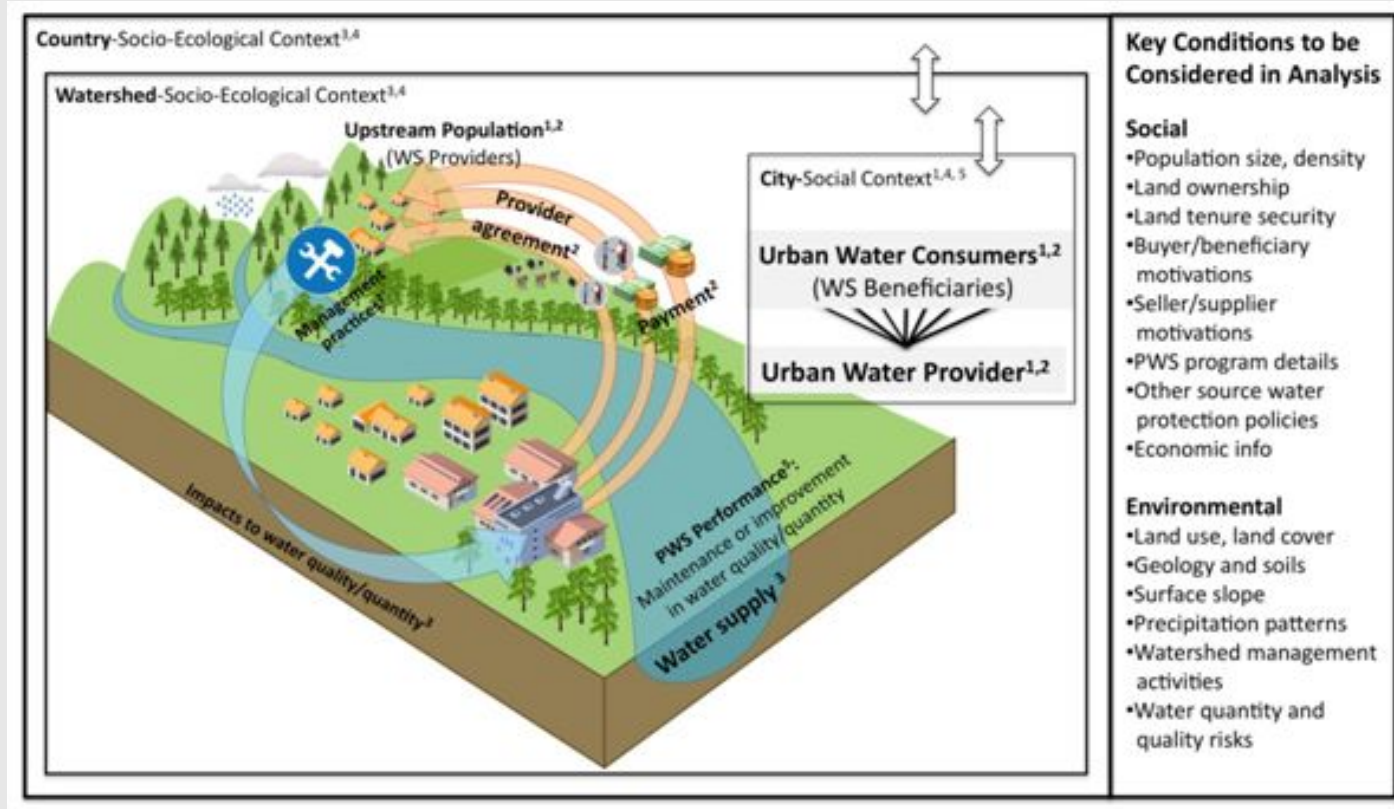
Chief Data Officer

City of Los Angeles

email: sari.ladin-Sienne@lacity.org

“From Data Literacy to Civic Action”

Modeling conditions that enable payments for watershed services programs



Chelsie L. Romulo


Assistant Professor, Environmental & Sustainability Studies, UNC

Outline

- Background
 - Investment in Watershed Services
 - The Nature Conservancy Data Concerns
- Enabling Conditions
 - Terminology
 - Literature Review
- IWS Programs
 - Enabling Condition Data
 - Modeling Importance
- Next Steps



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Home

Enabling Payments for Watershed Services



Award Year: 2014

Principal Investigator:
Drew Bennett, Colorado State University
Jenn Hoyle, Yale University

Associated Program:
[Graduate Student Pursuit RFP](#)

For the first time in human history more than half of the world's people live in urban areas. Increased urban populations intensify pressures on natural systems surrounding cities, particularly watersheds that provide drinking water. This project seeks to explore linkages between social and environmental characteristics of urban water supplies and governance strategies to minimize supply risk. Specifically, we are interested in understanding factors related to the emergence and functioning of payments for watershed services (PWS) initiatives that aim to protect drinking water supplies.

Our goals are to:

1. identify general characteristics associated with PWS and
2. compare the characteristics of existing PWS programs with those of areas at high risk for future water insecurity.

Our investigation will build on existing urban drinking water data, including the City Water Map, World Resources Institute's Aqueduct Water Risk framework, Forest Trends' State of Watershed Payments 2014 survey, World Bank's governance indicators, and select case studies of PWS for source water protection. Our team will:

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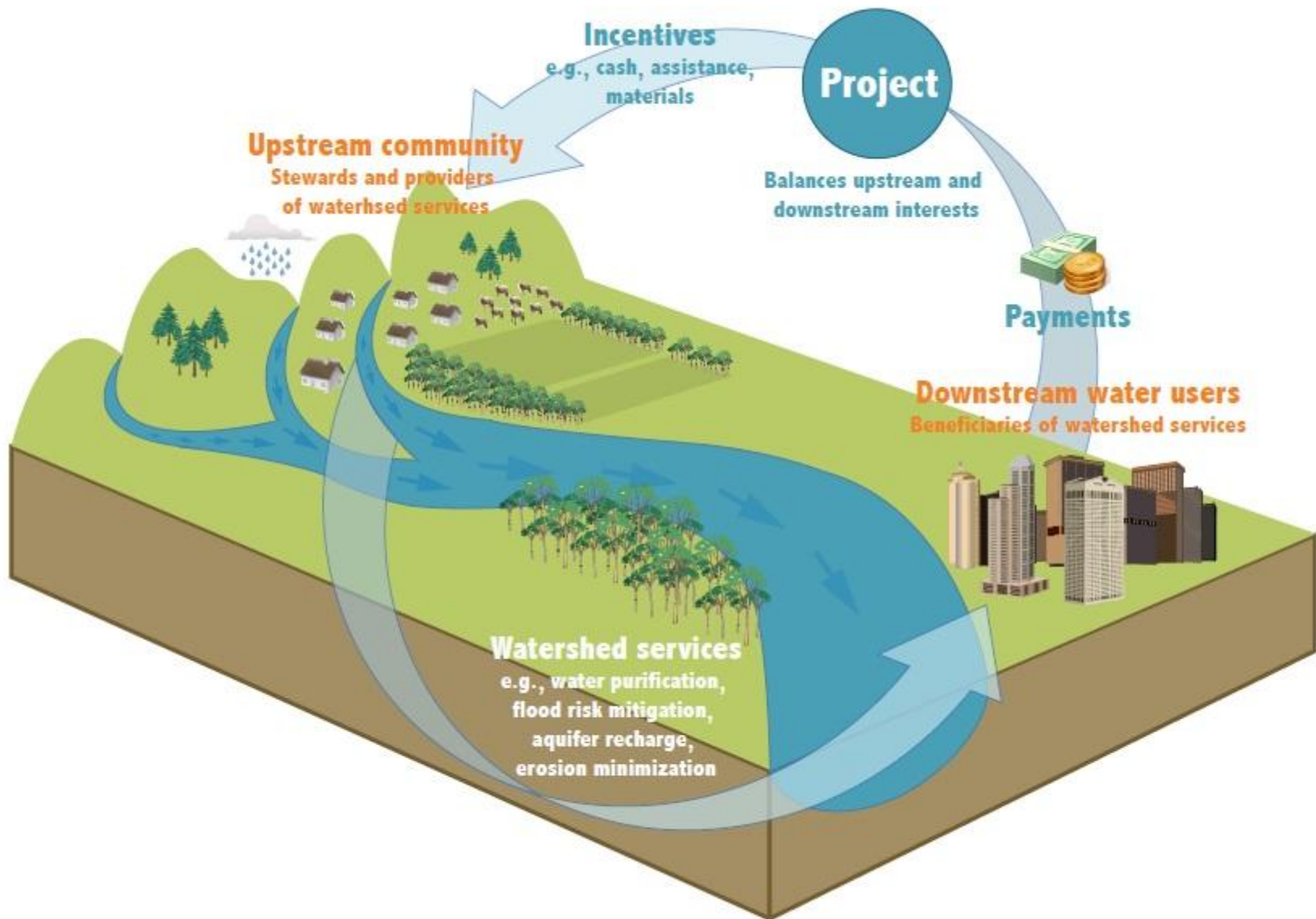
[Contact Us](#)

UPCOMING EVENTS

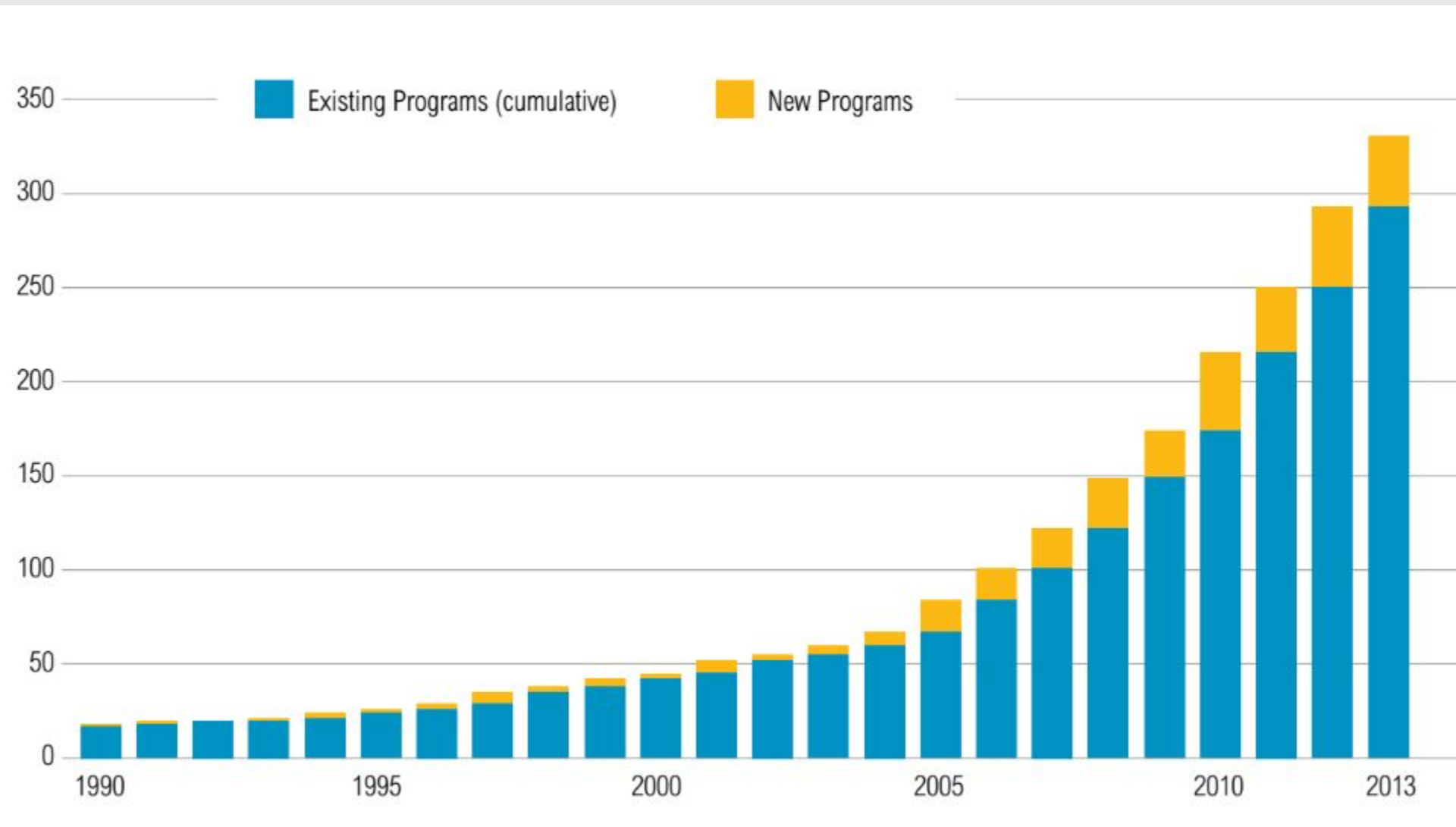
Jan 23

Workshop: Graduate Student Workshop on Socio-Environmental Synthesis

Investment in Watershed Services Programs



Number of Global Watershed Investment Programs 1990-2013



Source: Bennett & Carroll 2014

Establishing Water Funds



OUR WORK

GET INVOLVED

ABOUT US

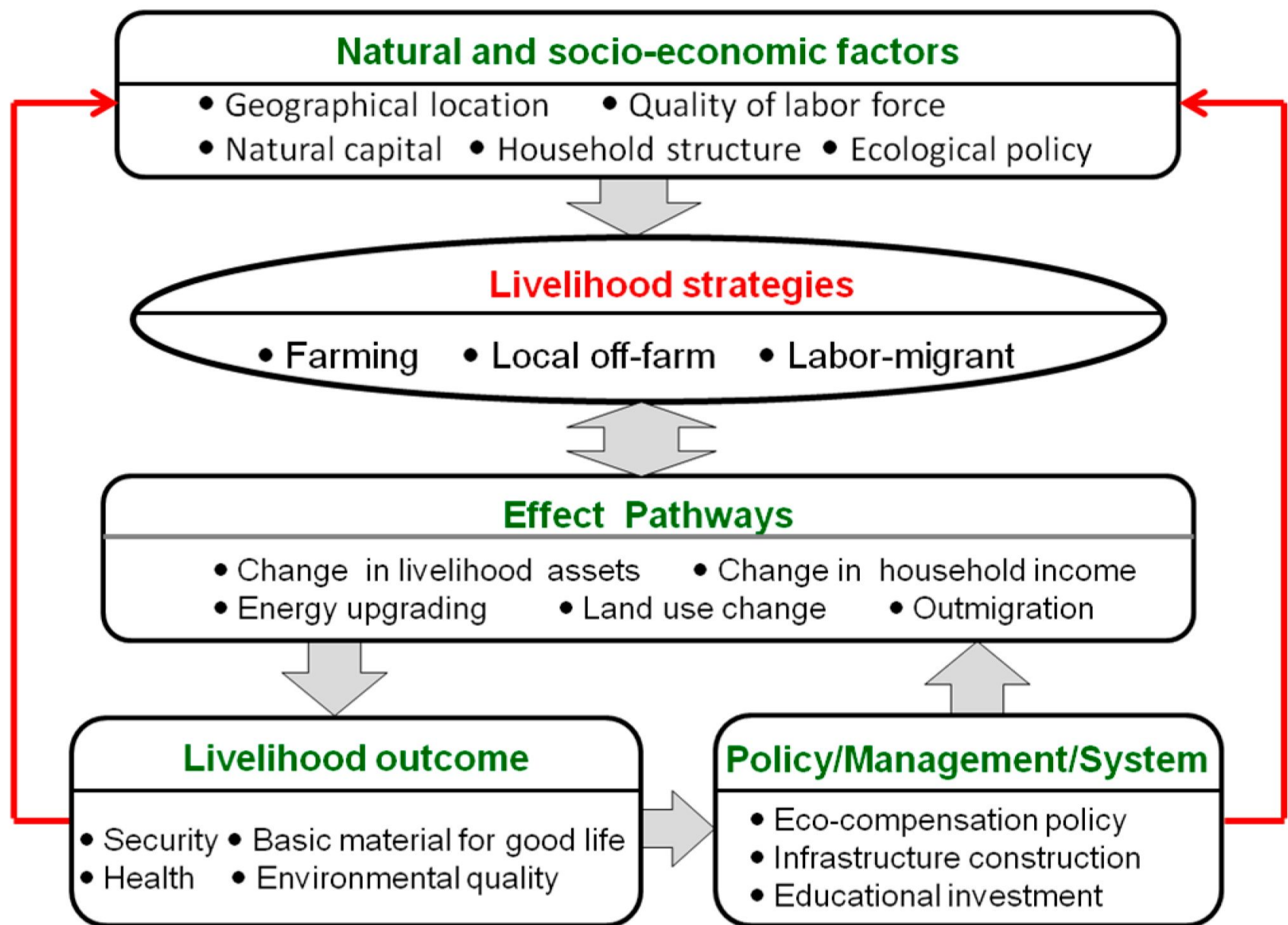
Latin America

Creating Water Funds for People and Nature



Water funds help to provide fresh water today and into the future.

Nature Conservancy Data Needs

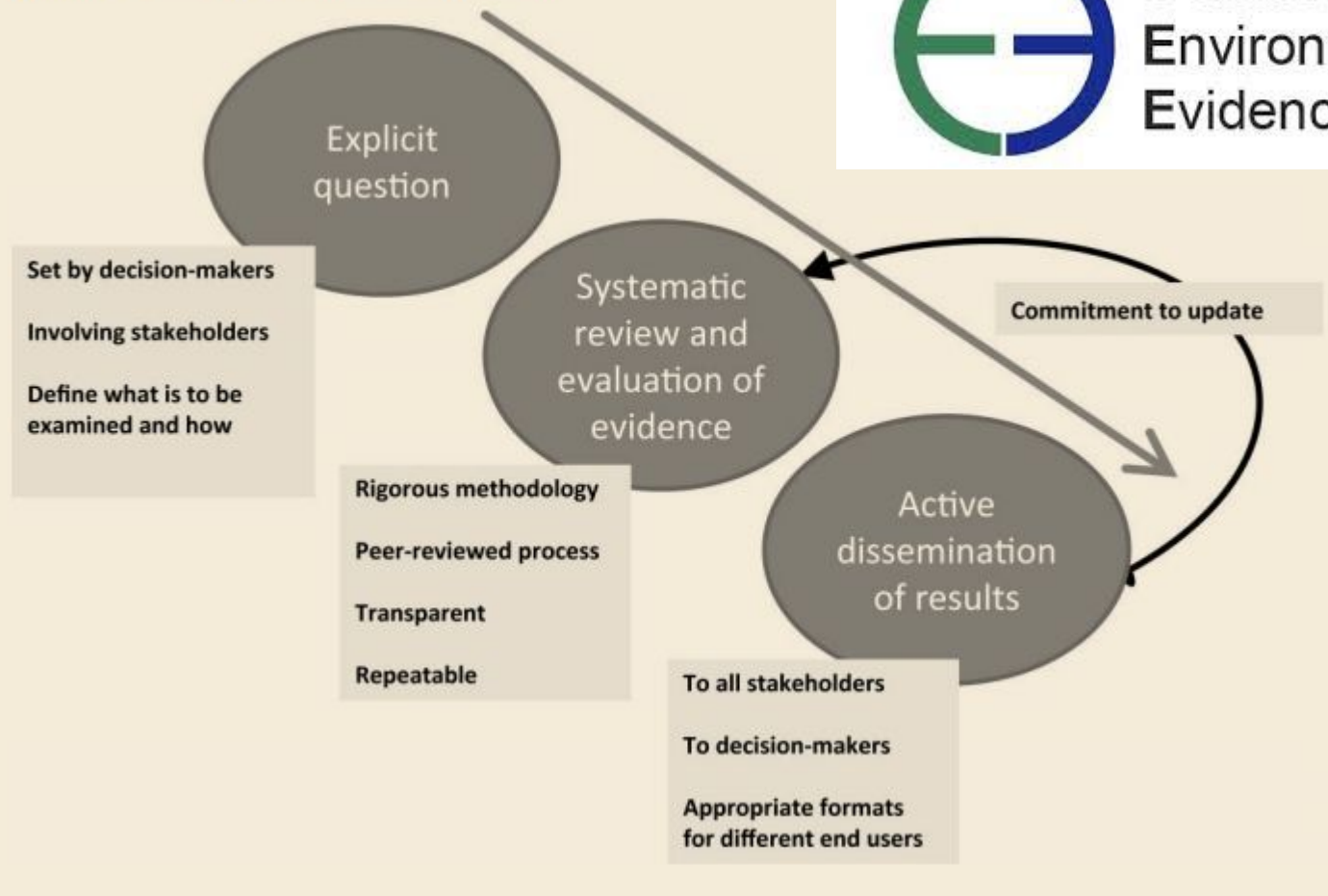


Nature Conservancy Data Needs

We hypothesized that there ARE general conditions that are important, and that some are more important than others.

Systematic Review

FIGURE 3 *Evidence framework for decision-making*



Collaboration for
Environmental
Evidence

Petrofsky et al. 2011
<https://doi.org/10.1505/146554811798201161>

The Collaboration for Environmental Evidence
<http://www.environmentalevidence.org/>

Systematic Review

Google Scholar

enabling conditions for investments in watershed services



Articles

About 47,200 results (0.13 sec)

Any time

Since 2018

Since 2017

Since 2014

Custom range...

Sort by relevance

Sort by date

☒ include patents

☒ include citations

☐ Create alert

[HTML] Notes from the field: lessons learned from using ecosystem **service** approaches to inform real-world decisions

M Ruckelshaus, E McKenzie, H Tallis, A Guerry... - Ecological ..., 2015 - Elsevier

... Please **enable** JavaScript to use all the features on this page ... Transforming natural resource decisions requires not only credible information, but also specific **enabling conditions** and institutional ... months to years to decades for a policy window to open that **enables** new technical ...

☆ ⓘ Cited by 229 Related articles All 12 versions Web of Science: 75 ⓘ

[HTML] sciencedirect.com
Find it at UNC

Watershed management: lessons from common property theory

J Kerr - International Journal of the Commons, 2007 - dspace.library.uu.nl

... Agrawal (2001) synthesized and revised these factors, focusing on those that **enable** sustainable governance of the ... Most of them were not replicated very widely, **enabling** the NGO to provide close ... links to early attempts by Wade (1988) to identify the **conditions** associated with ...

☆ ⓘ Cited by 143 Related articles All 16 versions

[PDF] uu.nl
Find it at UNC

[HTML] **Watershed** development, environmental **services**, and poverty alleviation in India

J Kerr - World development, 2002 - Elsevier

... local people's ability to manage their own natural resources given certain **enabling conditions** (eg, Tiffen ... the uncultivated land, the data were disaggregated within each village to **enable** an analysis ... 5. Analysis of both **conditions** of the main drainage line and of uncultivated lands ...

☆ ⓘ Cited by 279 Related articles All 8 versions Web of Science: 67 ⓘ

[HTML] sciencedirect.com
Find it at UNC

Water funds and payments for ecosystem **services**: practice learns from theory and theory can learn from practice

[HTML] proquest.com

Enabling Conditions

Terminology	Focal Area(s)	Citation
<i>Variables</i> associated with self-organization for collective action	Collective action, new institutional economics	Ostrom 2009
<i>Facilitating conditions</i> for the successful governance of common-pool resources; <i>Critical enabling conditions</i> for sustainability on the commons	Collective action, common-pool resources	Agrawal 2001
<i>Antecedent conditions</i> associated with the successful adoption and operation of community-based collaborative governance arrangements	Collaborative governance	Weber 2009
<i>Appropriate social arrangement</i> for dealing with harmful effects	Transaction cost economics	Coase 1960
<i>Enabling conditions</i> for policy implementation	Ecology, biodiversity conservation	Rands et al. 2010
<i>Preconditions</i> for policy diffusion	Environmental policy, policy diffusion	Kern et al. 2001
<i>Social dimension that enables</i> adaptive ecosystem-based management	Resilience theory, adaptive governance	Folke et al. 2005

NOTE: Inconsistent data terminology

Source: Huber-Stearns et al. 2017

Enabling Conditions

Factors that increase the likelihood of an intended change in the governance approach, strategy, or management regime.

NOTE: Lack of enabling conditions can create a barrier to intended change.

Enabling Conditions

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Huber-Stearns, H. R., D. E. Bennett, S. Posner, R. C. Richards, J. B. H. Fair, S. J. M. Cousins, and C. L. Romulo. 2017. Social-ecological enabling conditions for payments for ecosystem services. *Ecology and Society* 22(1):18. <https://doi.org/10.5751/ES-08979-220118>



Synthesis

Social-ecological enabling conditions for payments for ecosystem services

*Heidi R. Huber-Stearns*¹, *Drew E. Bennett*², *Stephen Posner*^{3,4}, *Ryan C. Richards*^{5,6}, *Jenn Hoyle Fair*⁷, *Stella J. M. Cousins*⁸ and *Chelstie L. Romulo*^{5,6}

ABSTRACT. The concept of “enabling conditions” centers on conditions that facilitate approaches to addressing social and ecological challenges. Although multiple fields have independently addressed the concept of enabling conditions, the literature lacks a shared understanding or integration of concepts. We propose a more synthesized understanding of enabling conditions beyond disciplinary boundaries by focusing on the enabling conditions that influence the implementation of a range of environmental policies termed payments for ecosystem services (PES). Through an analysis of key literature from different disciplinary perspectives, we examined how researchers and practitioners refer to and identify enabling conditions within the context of PES. Through our synthesis, we identified 24 distinct enabling conditions organized within 4 broad themes: biophysical, economic, governance, and social-cultural conditions. We found that the literature coalesces around certain enabling conditions, such as strong ecosystem science and existing institutions, regardless of disciplinary background or journal audience. We also observed key differences in how authors perceive the direction of influence for property type, program objectives, and number of actors. Additionally, we noted an emphasis on the importance of the contextual nature of many enabling conditions that may cause certain conditions to have a disproportionate impact on successful implementation in some circumstances. Unraveling the relative importance of specific enabling conditions in diverse contexts remains a research frontier. Ultimately, no single disciplinary perspective is likely to provide all necessary insights for PES creation, and given the intertwined nature of enabling conditions, practitioners need to consider insights from multiple dimensions. Our work suggests opportunities to better connect diverse conversations through integration of concepts, a common vocabulary, and a synthetic framework.

Key Words: *content analysis; enabling conditions; environmental governance; environmental synthesis; payments for ecosystem services; social-ecological systems*

Enabling Conditions

Biophysical conditions

- Small resource area
- Resource location & arrangement
- Well-defined boundaries of PES system
- Existing fundamental ecosystem science and baseline data
- Linkages between ES provision and management practices
- Clear threat or risk to ES

Economic conditions

- Significant value of ES
- Low opportunity costs
- Manageable transaction costs
- Defining ES as an economic good or service
- Economic growth

Governance conditions

- Presence/absence of intermediaries
- Strong capacity among actors
- Influential champion
- Strong existing institutions
- Secure land tenure & property type
- Fit of governance structure with scale of PES
- Multiple/single PES objectives

Sociocultural conditions

- Trust & transparency among actors
- Stakeholder communication & engagement
- Pre-existing market based culture
- Participant willingness
- Proximity of actors to each other
- Large/small number of actors

Enabling Conditions

Which conditions are most important for establishing and sustaining programs?

Enabling Conditions

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Huber-Stearns, H. R., D. E. Bennett, S. Posner, R. C. Richards, J. B. H. Fair, S. J. M. Cousins, and C. L. Romulo. 2017. Social-ecological enabling conditions for payments for ecosystem services. *Ecology and Society* 22(1):18. <https://doi.org/10.5751/ES-08979-220118>



Synthesis

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DRAFT MANUSCRIPT

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Title:

Global State and Potential Scope of Investments in Watershed Services to Manage Urban Water Supplies

Abstract

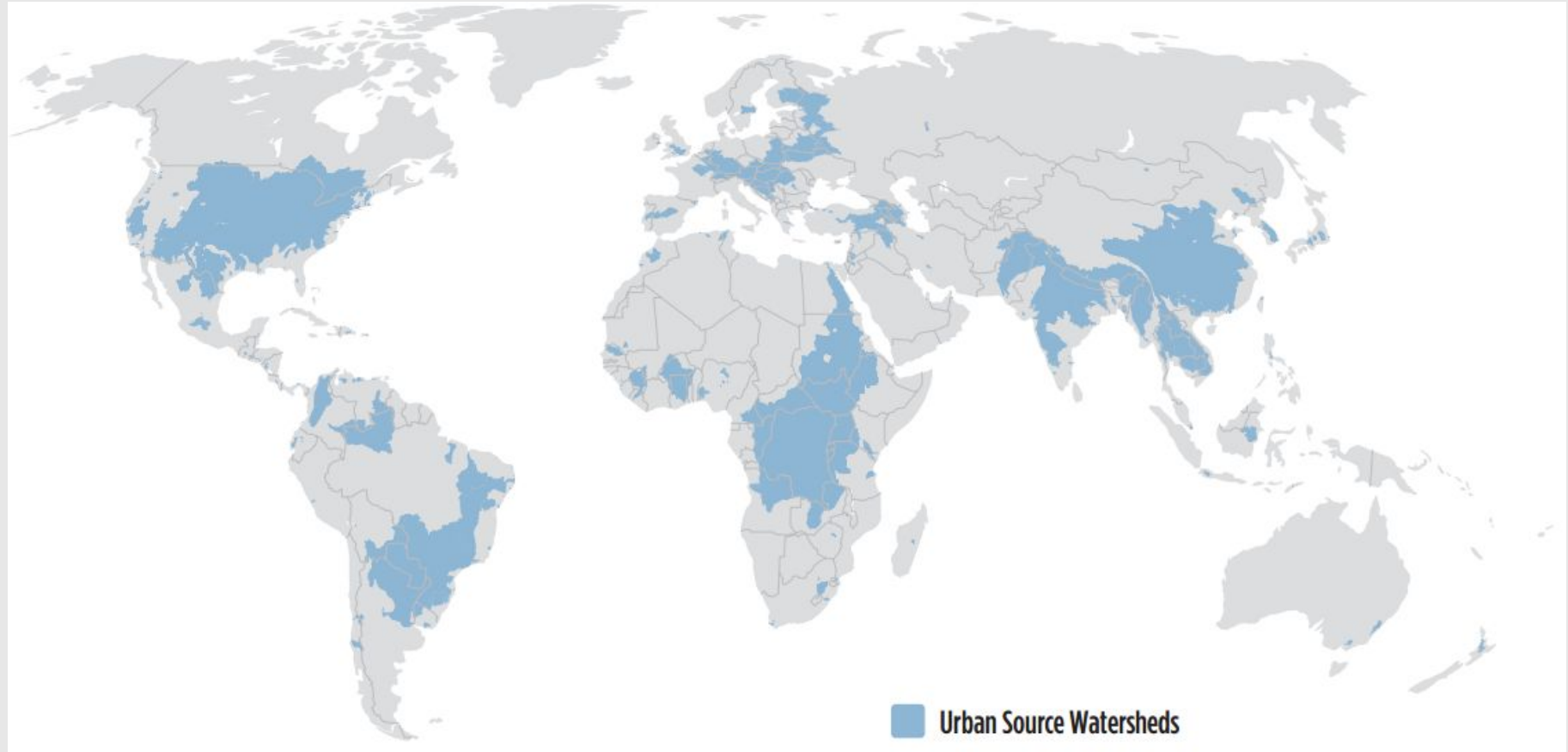
Investment in watershed services (IWS) programs, in which downstream water users pay upstream watershed service suppliers for actions that protect drinking water, are increasing in number and scope. It is not yet clear what factors contribute to the establishment and sustainability of IWS. We conducted a representative global survey of 416 of the world’s largest cities, including 59 with IWS programs. These programs represent over \$170 million of investment in over 4.3 million ha of watersheds, providing water to over 230 million people. Using random forest statistical models, we evaluated the relative importance of social and ecological factors as predictors of IWS presence. IWS programs are more likely to be present in source watersheds with more agricultural land and less protected area than otherwise similar watersheds. Our results suggest there is potential to expand the IWS strategy and provide an initial step to guide decisions about future program sites.

Investments for Watershed Services

Identifying Cities with IWS Programs

Investments for Watershed Services

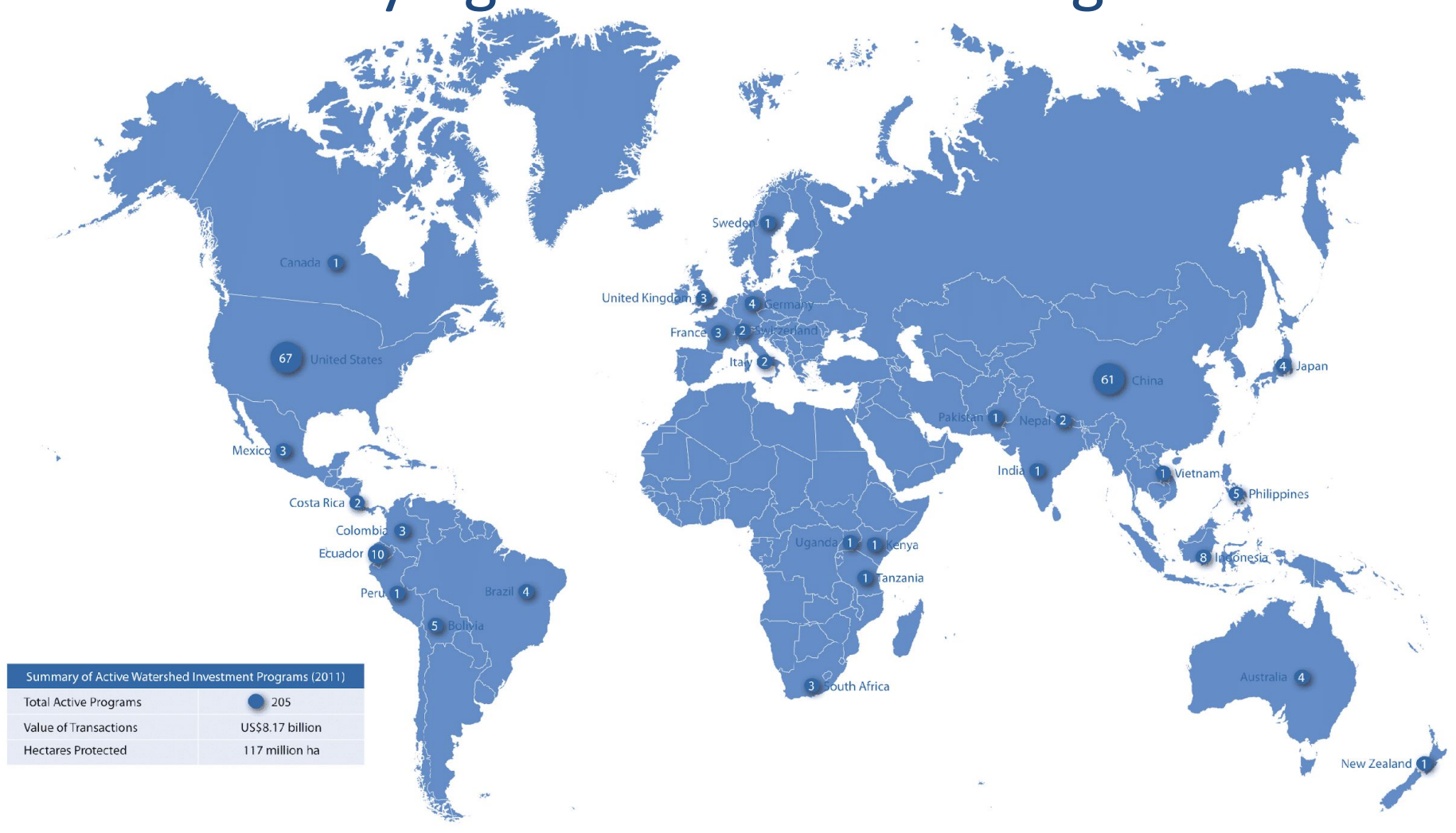
Identifying Cities with IWS Programs



Source: McDonald et al. 2014

Investments for Watershed Services

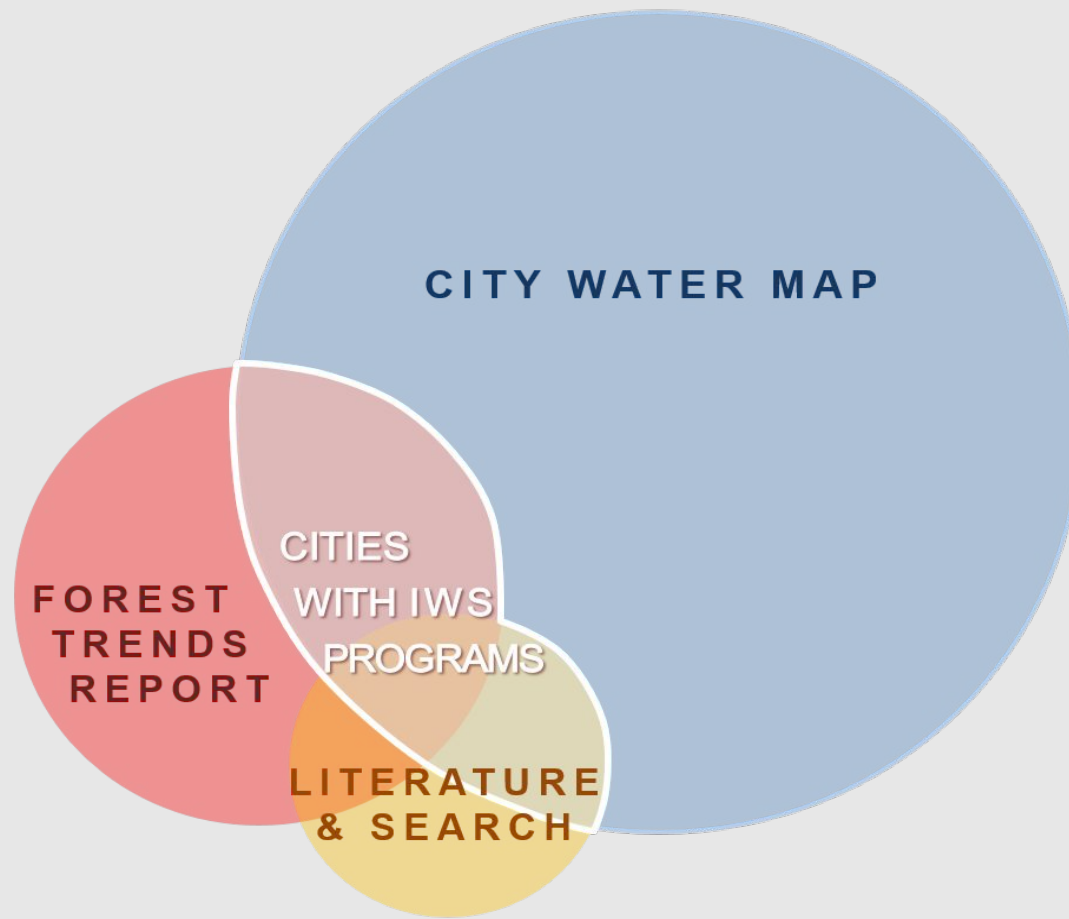
Identifying Cities with IWS Programs



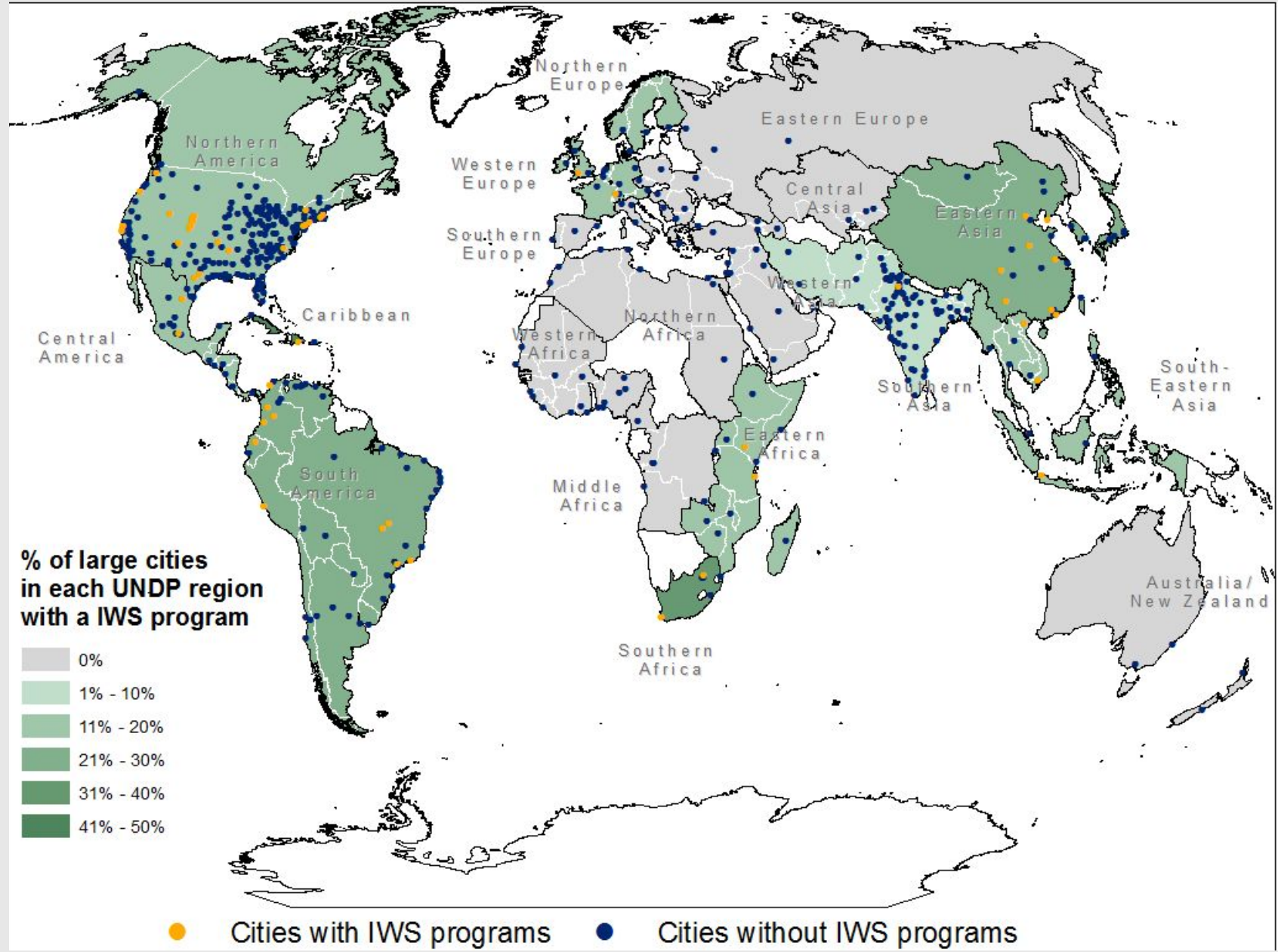
Source: Bennett & Ruef 2016

Investments for Watershed Services

Identifying Cities with IWS Programs



Investments for Watershed Services



Enabling Conditions

CITY LEVEL DATA

Analysis groups

IWS Program (Yes/No)

Located in USA (Yes/No)

Water source attributes

Average Distance

Average Elevation

City Population

Distance

Elevation Range

International Boundary Crossings

Mean Groundwater Drought Vulnerability

Mean Surface Water Drought Vulnerability

Number of Diversions

Percent Agricultural Cover

Percent Forest Cover

Percent Protected Area

Percent Surface Water Withdrawals

Quantity of Withdrawals

Total Watershed Population

Water Quantity

Watershed Area

Watershed Population Density

Weighted Drought Vulnerability

COUNTRY LEVEL DATA

Average Annual Growth

Average Governance Indicators

Conservation Spending

Doing Business Indicators

Enforcing Contracts Indicators

GCR Property Rights

National GDP

National GDP per Capita

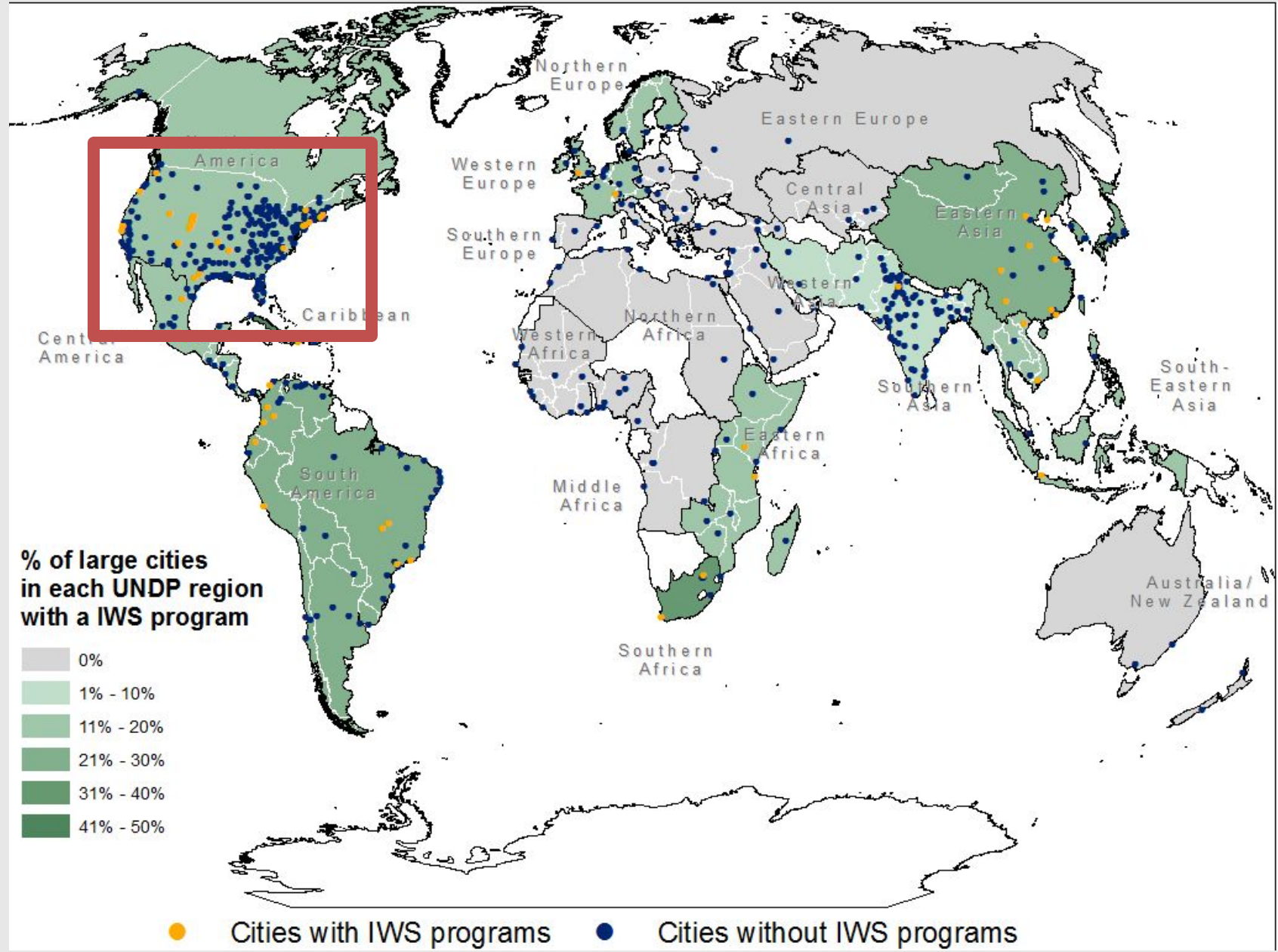
Number of IUCN Organizations Per Million People

Registering Property

Data Concerns

- Inconsistent scale
- Diverse types of data (categorical, numerical, etc)
- Non-normal distribution of variables
- Spatial Distribution

Investments for Watershed Services



Enabling Conditions

CITY LEVEL DATA

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Model 1

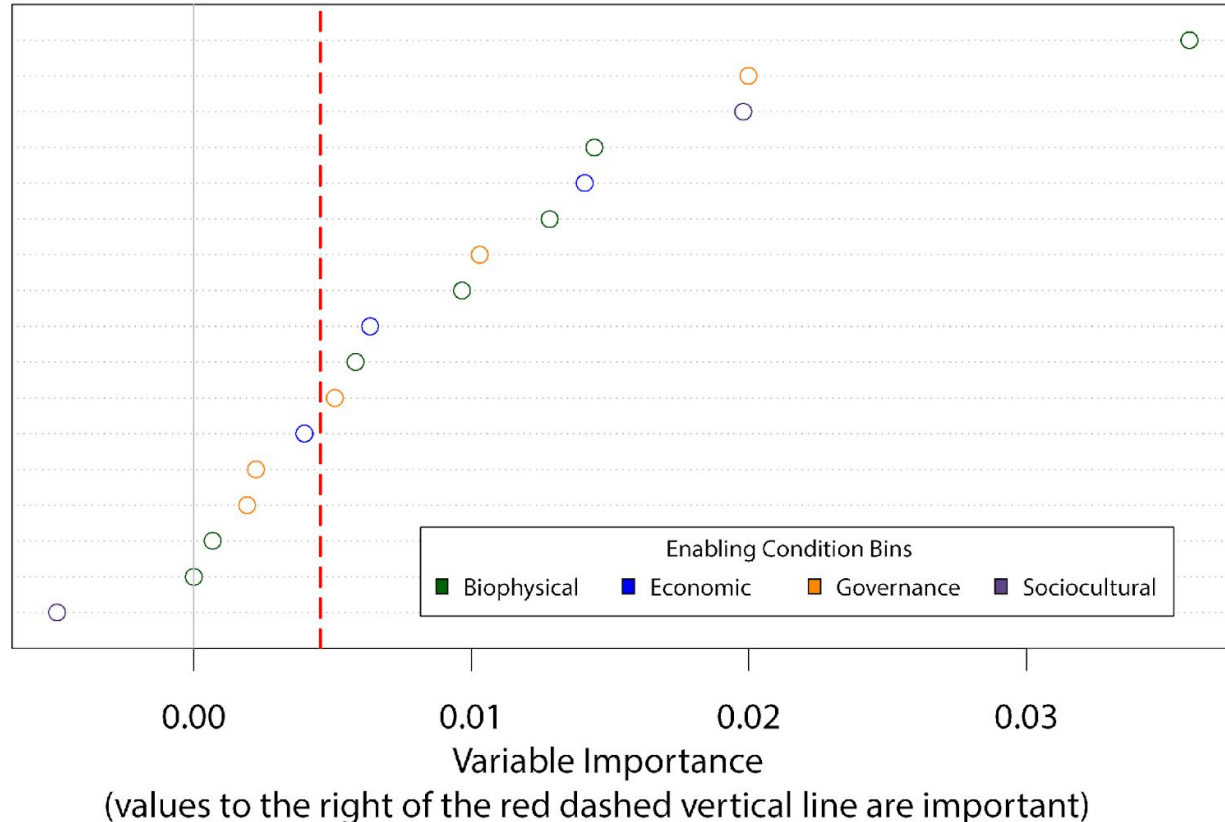
All cities

Model 2

Non-US Cities

Global Cities Model

Percent agriculture cover
Percent protected watershed
City population
Weighted drought vulnerability index
Average annual growth
Average distance*
Average annual conservation spending
Average elevation
Enforcing contracts indicator*
Total watershed area
Registering property indicator*
National GDP per capita
Average governance indicators*
IUCN organizations per million people
Total diversion volume
Percent forest cover
Average watershed population density



The Most Important Conditions

Agriculture Land +

Protected Area -

Enabling Conditions

So what?

Establishing Water Funds

How are cities selected for new Water Fund Projects?



Establishing Water Funds

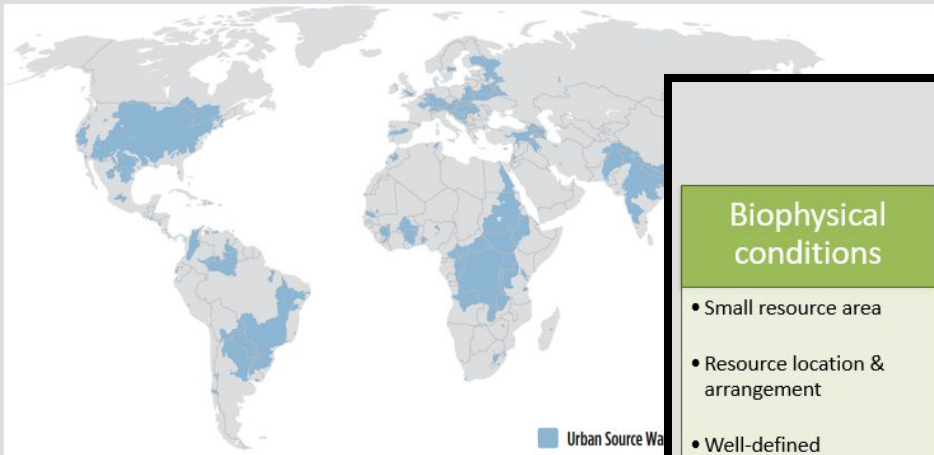
How are cities selected for new Water Fund Projects?

City	Percent Agriculture (+)	Average Elevation (-)
Recife	34.21%	100m
Salvador	9.06%	85m

Enabling Conditions

Investments for Watershed Services

Identifying Cities with IWS Programs



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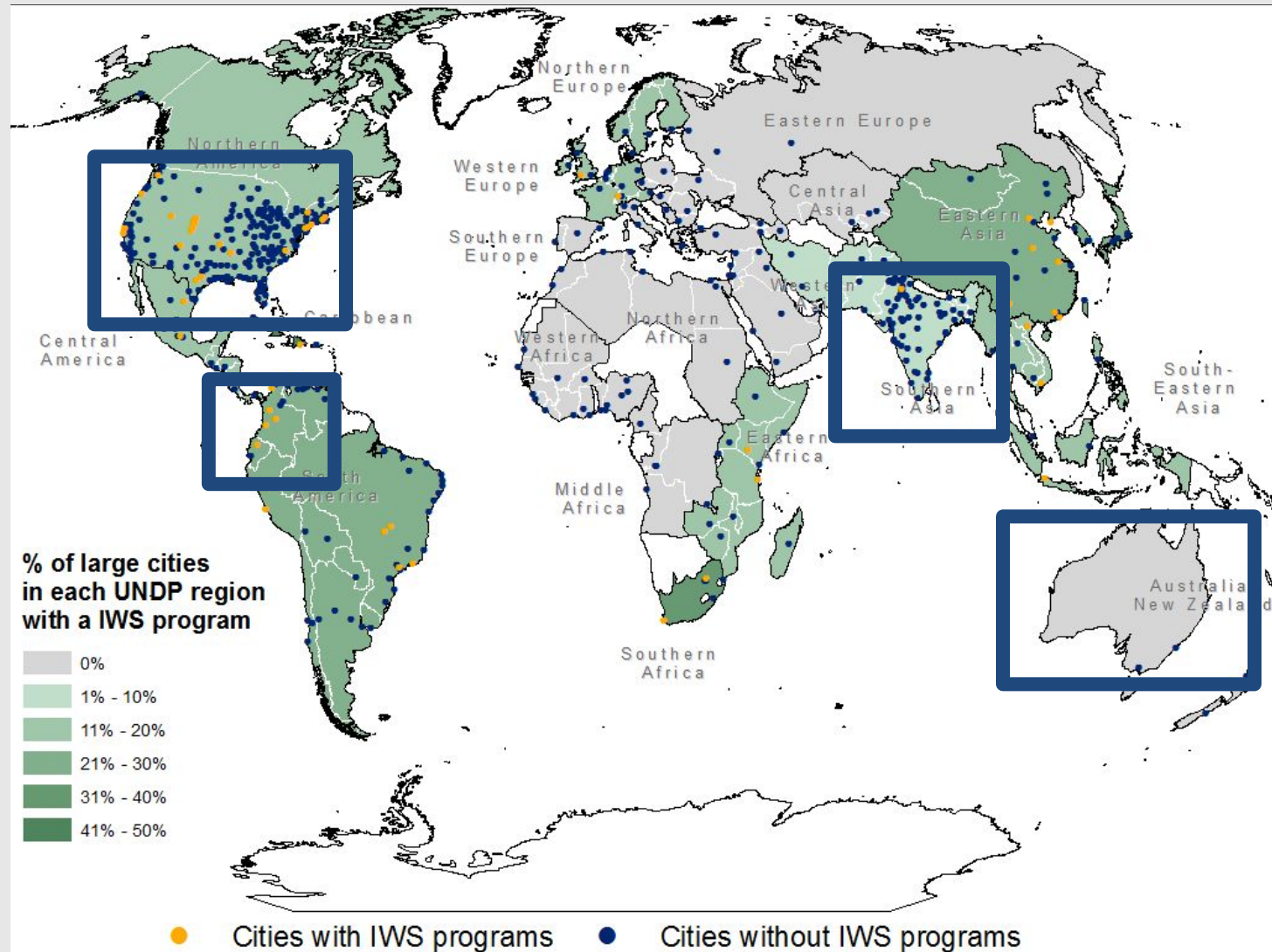
Sociocultural conditions

- Trust & transparency among actors
- Stakeholder communication & engagement
- Pre-existing market based culture
- Participant willingness
- Proximity of actors to each other
- Large/small number of actors

Next Steps



Regional Analysis

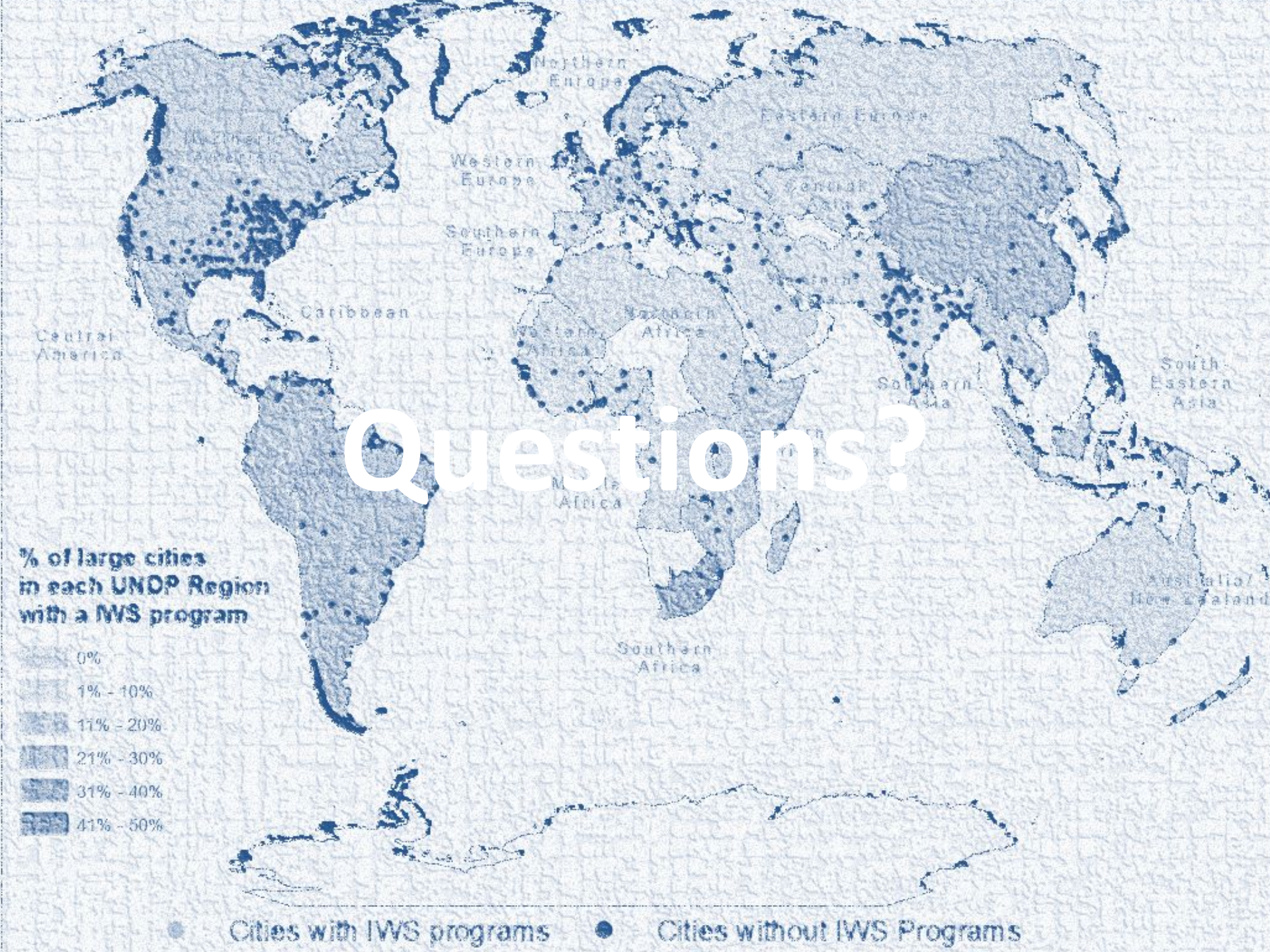


Enabling Conditions

Enabling establishment

vs

Enabling sustainability



Presenters



Chelsie Romulo

Assistant Professor

Environmental & Sustainability Studies,
University of Northern Colorado
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“Modeling conditions that enable payments
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“From Data Literacy to Civic Action”

From Data Literacy to Civic Action



Sari Ladin-Sienne

Chief Data Officer, City of Los Angeles

@sariladin

July 18, 2018



4 million residents

469 square miles

40 departments

50,000 city staff



Mayor Garcetti's vision for open data

Make raw data available on intuitive platforms to:

- Develop new pathways for civic engagement
- Promote innovation among entrepreneurs and businesses
- Leverage one of government's greatest assets: public information
- Foster creative problem-solving with community at forefront

World Class Data Assets

2 data
portals

Eric Garcetti

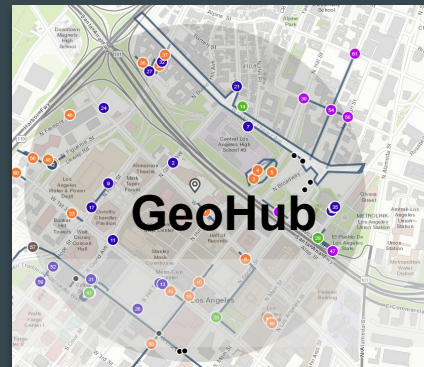
Data Catalog About #DataLA Blog Dev

Permits Information

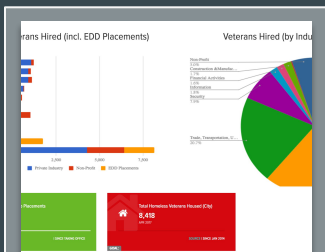
Permits Information for the construction, remodeling, and repair of buildings and structures in the City of Los Angeles. Permits are categorized into building permits, electrical permits, and other permits.

Assessor Page	Assessor Parcel	Tract	Block
020	013	78 4178	
015	008	78 7522	
021	040	78 8292	
025	008	SHAYTON HEIGHTS TRACT	8
003	040	S. M. PUNY'S SUBDIVISION OF	
026	008	SHAYTON HEIGHTS TRACT	8
028	001	78 1188	
001	010	78 911	
031	002	78 14807	
026	042	P 91 72	
001	020	78 4023	
030	003	RENOVATION PLACE	1
020	001	EAST VENICE OF AMERICA TR 1	
010	026	78 2804	
006	002	78 14082	
031	026	78 3335	
016	001	78 2809	
010	040	J. G. MC DONALD TRACT	
011	003	78 7888	
016	011	WEST ADAMS HEIGHTS	4
028	002	78 215	

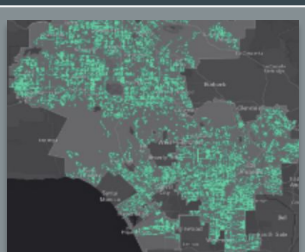
Open Data Portal



Apps powered by city data



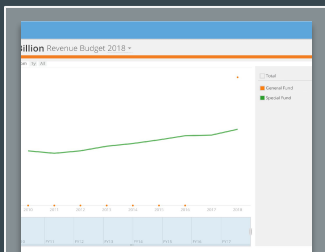
Mayor's Dashboard



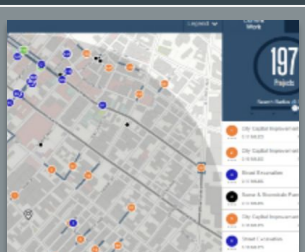
Road to 2400



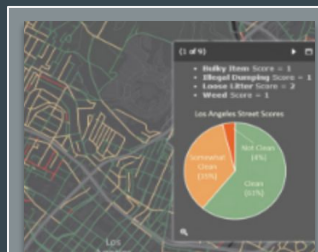
Citywide Web Analytics



Open Budget



Streetwize



CleanStat

... just to name a few!

Background

Spreading Grounds

Rain Barrels &
Cisterns

Green Stormwater
Infrastructure

Incidental Capture

Background

Multiple efforts are already underway to increase stormwater capture, including multiple projects that will capture thousands of acre-feet of stormwater per year. City and local entities that support stormwater capture include the [LA Department of Public Works](#), [LA Department of Water and Power](#), and LA County Flood Control District. Stormwater capture project benefits vary from improving water quality in rivers, creeks, and oceans to capturing stormwater more effectively to increase our local water supply.

Real-Time Rain Capture
(Acre-ft) ?

17,000

Updated 05-21-18 10 am

Total Rain this Season
(Inches) ?

4.56

Below Average

% Capture Designated
for Water Supply ?

100%

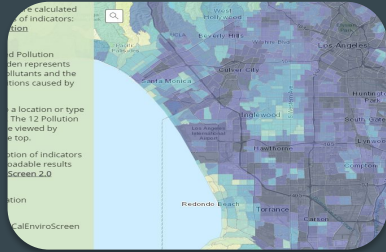
[Learn More](#)

Progress toward pLAN goal to increase stormwater capture capacity by 150,000 acre-ft per year ?

28,900



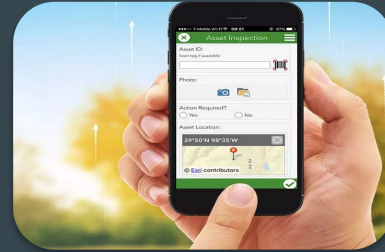
GeoHub: Suite of Data Tools



Storymaps



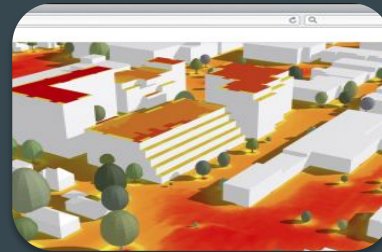
Dashboards



Data Collection

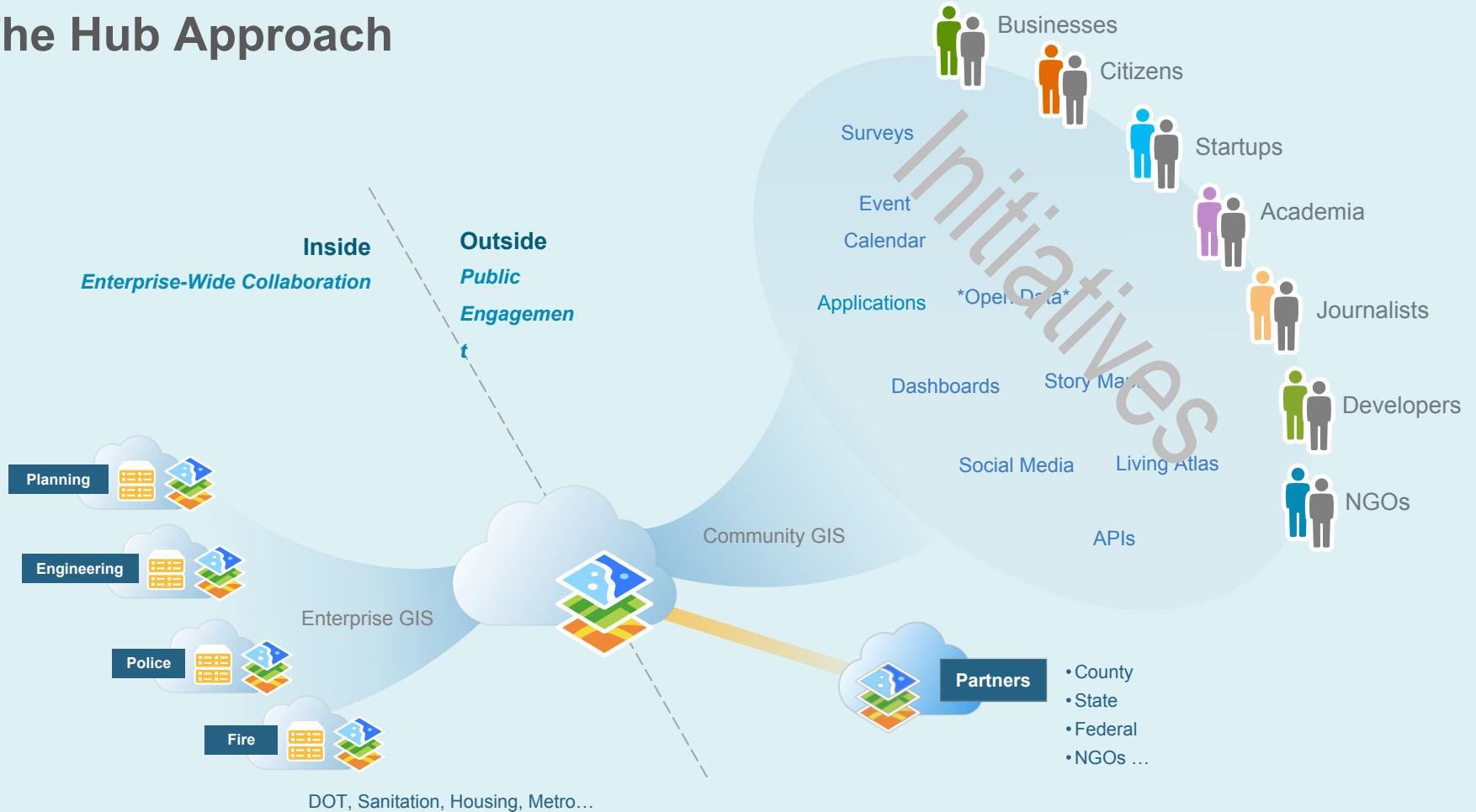


Data Sharing

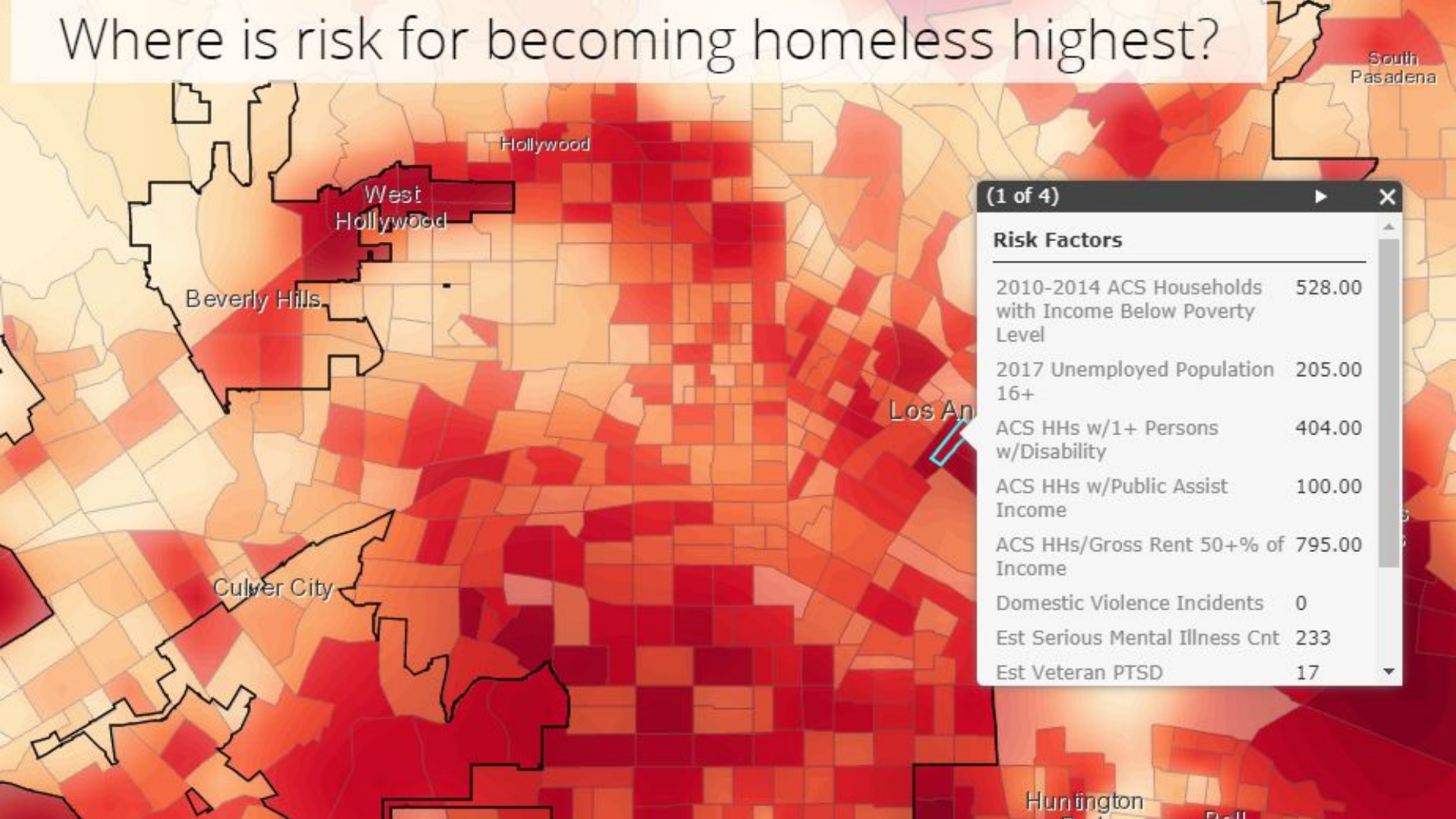


Spatial Analysis

The Hub Approach



Where is risk for becoming homeless highest?



(1 of 4)

Risk Factors

2010-2014 ACS Households with Income Below Poverty Level	528.00
2017 Unemployed Population 16+	205.00
ACS HHs w/1+ Persons w/Disability	404.00
ACS HHs w/Public Assist Income	100.00
ACS HHs/Gross Rent 50+% of Income	795.00
Domestic Violence Incidents	0
Est Serious Mental Illness Cnt	233
Est Veteran PTSD	17

DATA PUBLISHING PRINCIPLES

- What is the **value** of our data?
- How can we **recognize a high-value dataset** that's a great candidate for our open data library?
- What **principles** can we come up with collectively to help new hires and key staff flag these datasets in the future?
- [DataLA Publishing Guide](#)

From Data to Action



Identify which datasets are meaningful and ready to be published.



Publish the dataset to the open data portals. Follow metadata best practices to ensure dataset is easy to interpret.



Public and private partners use the data to communicate, advocate, and innovate.



meaningful
Intuitive / easy to understand
accessible
Valuable
Popularity | High Demand
Current / relevant
low hanging fruit
Verifiable
Contextualized
accurate
if other cities are doing it
reduces your burden
mission-focused
flexible taxonomy

The role of data literacy in open data



Challenge: How do we scale data literacy and encourage community data collection?

Bringing data to the people

OPEN DATA LITERACY PROGRAM

host a free
Data Training Workshop
in your neighborhood



Scaling, growing, innovating

- Train the trainer model
- Open data audits - what's missing? what do you want us to collect?
- Community data collection - findings local partners to grow initiatives, partnering with universities

Get in touch!

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Ideas for Next steps

- Funding sources for collaborative activities: ESIP Lab, FUNding Friday, Foundations, ESIP sponsors, NSF
 - Forming an ESIP cluster on community resilience
 - ESIP Webinar in December
 - Other thoughts?
-
- Contact Arika: Av@middlepatheco.com

Blog:

<http://esipfed.org/collaboration-updates/the-socioeconomic-value-of-earth-science-data-for-community-resilience>

White paper: <https://tinyurl.com/y6vl4oev>

Peer-reviewed paper: Virapongse, A., R. Duerr, E.C. Metcalf (in press). Knowledge mobilization for community resilience: Perspectives from data, informatics, and information science. Sustainability science.