

# gamut: A Geospatial Analysis of Multisector Urban Teleconnections

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## Software

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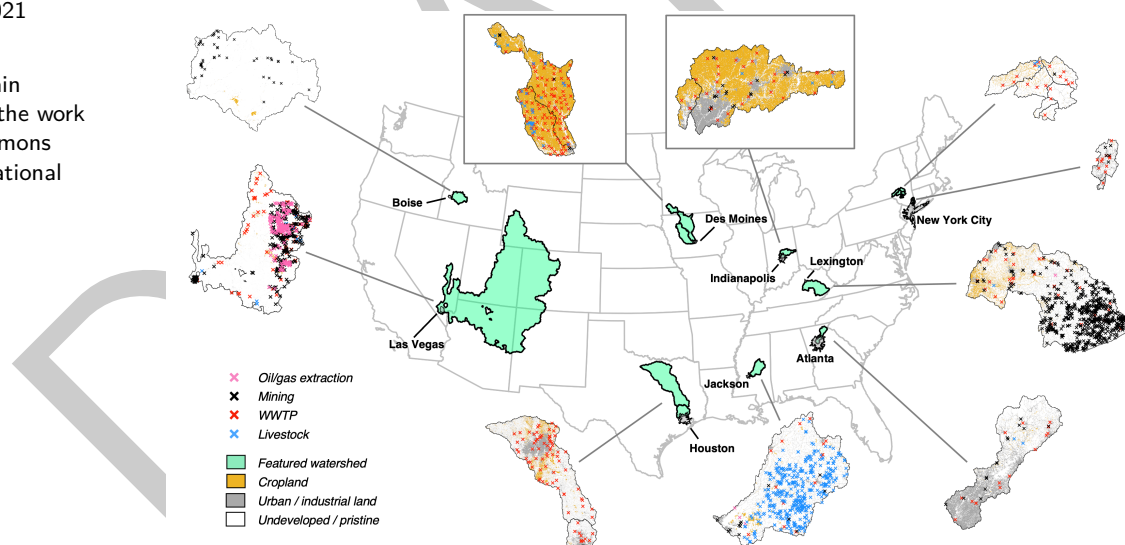
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## Summary

Most cities in the United States withdraw surface water to meet public water supply needs. The lands on which this water is generated are often developed for human activities—such as agriculture, mining, and industry—that may compete for water resources or contaminate water supplies. Cities are thereby connected to other sectors through their water supply catchments. This connection is an example of an multisectoral urban teleconnection. The Geospatial Analytics for Multisectoral Urban Teleconnections (*gamut*) package provides national-scale information on these teleconnections by combining land use data with hydrological analysis to characterize urban source watershed human interactions across the conterminous United States (Figure 1).



**Figure 1:** The *gamut* package analyzes urban cities and their watersheds all across the conterminous U.S. As shown in the figure, it can look at characteristics like land use and facility operations inside watershed boundaries.

The *gamut* package computes dozens of city-level metrics that inform on the geographical nature of surface water supply catchments and the presence, intensity, and impact of human activities in those catchments. Each city's watersheds are based on the Urban Water Blueprint ([McDonald & Shemie, 2014](#)), which is enhanced with source contribution estimates as well as river flow and high-resolution runoff ([Nelson, Turner, Vernon, Rice, & Kao., 2021](#)). Watershed delineations are used to mask several geospatial land use layers relating to electricity generation, agriculture, industry and other economic developments, and water infrastructure

(dams, reservoirs, aqueducts). These geospatial input layers have been combined into an open-source dataset and can be accessed [here](#) (Nelson, Turner, Vernon, & Rice, 2021).

Metrics reported by gamut fall into four main categories: geographical characteristics of watersheds (e.g., climate zones, land area, distance from city, hydrology), potential water contamination concentrations (nonpoint and point), withdrawal/consumption of water from other sectors, and presence/intensity of multisectoral land uses. Table 1 shows all of the metrics that are created by this package, descriptions, and units. An R vignette is provided to help users to get started with gamut and may be accessed [here](#).

Table 1: Metrics reported in gamut

Metric Name	Description	Units
city_population	The population of the city being analyzed	people
n_watersheds	Number of watersheds that city uses to source drinking water	watersheds
n_other_cities	Number of other cities pulling off the same watersheds	cities
dependent_city_pop	Total population of people dependent on that city's watersheds	people
watershed_area_sqkm	Combined area of all the source watersheds of a city	square kilometers
storage_BCM	Combined storage capacity of all the city catchments	billion cubic meters
yield_BCM	Combined yield capacity of all the city catchments	billion cubic meters
irr_cons_BCM	Combined water consumption that is used for irrigation with the watersheds	billion cubic meters
n_climate_zones	Number of climate zones that the source watersheds cover	zones
n_hydro_plants	Number of hydro electric power plants operating within the source watersheds	plants
n_thermal_plants	Number of thermal power plants operating within the source watersheds	plants
n_fac_agcrop	Number of agricultural crop facilities within the source watersheds	facilities
n_fac_aglivestock	Number of agricultural livestock facilities within the source watersheds	facilities
n_fac_cnsmnf	Number of construction and manufacturing facilities within the source watersheds	facilities
n_fac_mining	Number of mining facilities within the source watersheds	facilities
n_fac_oilgas	Number of oil and gas facilities within the source watersheds	facilities
n_fac_total	Total number of facilities operating within the source watersheds	facilities
hydro_gen_MWh	Combined hydro electric generation from all the facilities within the source watersheds	megawatt-hours
thermal_gen_MWh	Combined thermal generation from all the facilities within the source watersheds	megawatt-hours
thermal_cons_BCM	Combined water consumption that is used for thermal generation	billion cubic meters
thermal_with_BCM	Combined water withdrawal for thermal generation	billion cubic meters
n_utilities	Number of electric utilities within the source watersheds	utilities

Metric Name	Description	Units
n_ba	Number of balancing authorities within the source watersheds	balancing authorities
n_crop_classes	Total number of different types of crops within the source watersheds	crops
cropland_fraction	Fraction of land that is used for crops	fraction
developed_fraction	Fraction of land that is developed	fraction
ag_runoff_max	Agricultural runoff as proportion of total runoff (worst-case watershed)	fraction
ag_runoff_av_exgw	Agricultural runoff as proportion of total runoff in supply (exc. groundwater)	fraction
ag_runoff_av	Agricultural runoff as proportion of total runoff in supply (inc. groundwater)	fraction
dev_runoff_max	Urban runoff as proportion of total runoff (worst-case watershed)	fraction
dev_runoff_av_exgw	Urban runoff as proportion of total runoff in supply (exc. groundwater)	fraction
dev_runoff_av	Urban runoff as proportion of total runoff in supply (inc. groundwater)	fraction
np_runoff_max	Max amount of non-point source runoff within the source watersheds	fraction
np_runoff_av_exgw	Nonpoint Proportion of Potentially Contaminated Supply (PPCS) (exc. groundwater)	fraction
np_runoff_av_exgw_unweighted	Nonpoint supply contamination averaged across watersheds	fraction
np_runoff_av	Nonpoint Proportion of Potentially Contaminated Supply (PPCS)	fraction
n_economic_sectors	Total number of different economic sectors within the source watersheds	sectors
max_withdr_dis_km	Maximum distance between a city's intake points	kilometers
avg_withdr_dis_km	Average distance between a city's intake points	kilometers
n_treatment_plants	Total number of waste water treatment plants operating within the source watersheds	plants
watershed_pop	Total number of people living within the source watershed boundaries	people
pop_cons_m3sec	Combined water consumption from the source watersheds that is used for people	m3/sec
av_fl_sur_conc_pct	Point PPCS (surface water only, based on flow)	%
av_fl_sur_conc_pct_unweighted	Point PPCS (surface water only, based on flow, not weighted by source importance)	%
av_ro_sur_conc_pct	Point PPCS (surface water only, based on runoff)	%
av_fl_all_conc_pct	Point PPCS (based on flow)	%
av_ro_all_conc_pct	Point PPCS (based on runoff)	%
av_fl_max_conc_pct	Point PPCS (based on flow, worst-case catchment only)	%
av_ro_max_conc_pct	Point PPCS (based on runoff, worst-case catchment only)	%
surface_contribution_pct	Proportion of total average supply made up from surface water	%
importance_of_worst_watershed_pct	Proportion of total average supply made up from most heavily contaminated watershed	%

## 31 Statement of Need

32 MultiSector Dynamics (MSD) research is the study of the co-evolution of human and natural  
 33 systems. This research requires infrastructure expansion and land use scenarios, resource  
 34 demand projections, and multisectoral modeling to capture the impacts of trends and shocks on  
 35 human systems. The gamut package offers new data that meet a number of MSD needs. The  
 36 package may be used to infer possible water resources expansion strategies for major cities in  
 37 the United States. For example, cities found to be heavily exposed to potential contamination  
 38 may be more likely to seek alternative means of supply (e.g., water transfers) or invest in  
 39 water reuse facilities. gamut also reveals which source watersheds are heavily protected by  
 40 receiving cities. This information can inform land use and energy expansion scenarios applied  
 41 in MSD research, for example by preventing significant expansion of human developments in  
 42 protected source watersheds. gamut may also be used in large-scale hydrological modeling to  
 43 correctly assign urban water demands to specific intakes. gamut also provides a range of new  
 44 data that can inform urban residents on the origins of their water supply.

45 The gamut package is open source and may be downloaded using the [devtools](#) package  
 46 (Wickham et al., 2020).

47 `devtools::install_github("https://github.com/IMMM-SFA/gamut.git")`

## 48 Dependencies

49 gamut relies on functionality from the following R packages: [clisymbols](#) (Csárdi, 2017), [crayon](#)  
 50 (Csárdi, 2017), [dplyr](#) (Henry & Wickham, 2020), [dams](#) (Goteti & Stachelek, 2020), [exactextractr](#)  
 51 (Daniel Baston, 2020), [foreign](#) (R Core Team, 2020), [geosphere](#) (Hijmans, 2019),  
 52 [ggplot2](#) (Wickham, 2016), [lwgeom](#) (Pebesma, 2020), [magrittr](#) (Bache & Wickham, 2014),  
 53 [purrr](#) (Henry & Wickham, 2020), [raster](#) (Hijmans, 2020), [readxl](#) (Wickham, 2019), [reservoir](#)  
 54 (Turner & Galelli, 2016), [rgdal](#) (R. Bivand & Rundel, 2020), [rgeos](#) (R. Bivand & Rundel,  
 55 2020), [sf](#) (Pebesma, 2018), [sp](#) (R. S. Bivand et al., 2013), [spex](#) (Sumner, 2020), [stringr](#)  
 56 (Wickham, 2019), [tibble](#) (Müller & Wickham, 2020), [tidyr](#) (Wickham et al., 2020), [vroom](#)  
 57 (Hester & Wickham, 2021), [testthat](#) (Wickham, 2011), [knitr](#) (Xie, 2014), [rmarkdown](#) (Xie et  
 58 al., 2018), [knitr](#) (Xie, 2014).

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