1	Giovanni - the Bridge between Data and Science
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9 <u>Capsule: Using satellite remote sensing data sets can be a daunting task. A Web-based tool,</u> 10 <u>Giovanni, has been developed to facilitate access, visualization, and exploration of NASA Earth</u> 11 <u>science data sets</u>

12

Abstract

13 This article describes new features in the Geospatial Interactive Online Visualization 14 ANd aNalysis Infrastructure (Giovanni), a user-friendly online tool that enables visualization, 15 analysis, and assessment of NASA Earth science data sets without downloading data and 16 software. Since the satellite era began, data collected from Earth-observing satellites have been 17 widely used in research and applications; however, using satellite-based data sets can still be a 18 challenge to many. To facilitate data access and evaluation, as well as scientific exploration and 19 discovery, the NASA Goddard Earth Sciences (GES) Data and Information Services Center 20 (DISC) has developed Giovanni for a wide range of users around the world. This article 21 describes the latest capabilities of Giovanni with examples, and discusses future plans for this 22 innovative system.

25 Over Earth's vast oceans and remote continents, traditional large-scale observations of 26 the atmosphere, ocean, and land surface can be difficult and costly to both deploy and maintain, 27 and are therefore impractical to provide adequate long-term observational data for research and 28 applications. This is particularly true as global observations become increasingly important for 29 understanding global change processes. Satellite instruments can overcome surface observation 30 limitations by synoptically acquiring Earth science data. NASA's Earth Observing System (EOS) 31 project [NASA 2016] is a global observation campaign, consisting of a coordinated series of 32 polar-orbiting, low-inclination satellites intended for long-term global observations, potentially 33 enabling improved understanding of Earth's geophysical systems.

34 [Break-up text: Giovanni simplifies satellite data access. Downloading data and software is not35 required.]

36 Accessing and using NASA data is a challenge to many researchers, due to issues such as 37 heterogeneous data formats, complex data structures, large volume data storage, special 38 programming requirements, diverse analytical software options, etc. that often require a 39 significant investment in time and resources, especially for novices. By facilitating data access 40 and evaluation, as well as promoting open access to create a level playing field for non-funded 41 scientists, NASA data can be more readily used for scientific discovery and societal benefits. To 42 advance this goal, the NASA Goddard Earth Sciences (GES) Data and Information Services 43 Center (DISC) developed the Geospatial Interactive Online Visualization ANd aNalysis 44 Infrastructure (Giovanni) [GES DISC 2016]. Giovanni has assisted researchers around the world 45 publish over 1300 peer-reviewed papers [Acker 2016] in a wide range of Earth science 46 disciplines and other areas.

47 A Brief History

48 Giovanni [Liu et al. 2007, Acker and Leptoukh 2007, Berrick et al. 2009] was initiated 49 and developed for faster and easier access to, and evaluation of, data sets at the GES DISC after 50 collecting and analyzing feedback from user support. The first Giovanni instance was the 51 Tropical Rainfall Measuring Mission (TRMM) Online Visualization and Analysis System 52 (TOVAS). TOVAS served TRMM Multi-satellite Precipitation Analysis (TMPA) and other 53 global precipitation data sets. As TOVAS gained popularity, inclusion of more satellite data sets 54 in Giovanni was requested. To address this demand, multiple discipline- or mission-based data 55 portals were created. The current Giovanni has evolved further, featuring a new unified Web 56 interface to support interdisciplinary Earth system research, allowing synergistic use of data sets 57 from different satellite missions.

58 [Break-up text: Giovanni has helped publish over 1300 peer-reviewed papers]

59 Giovanni Data Set Summary

60 Giovanni provides access to numerous satellite data sets archived and distributed by the 61 GES DISC, concentrated primarily in the areas of atmospheric composition, atmospheric 62 dynamics, global precipitation, hydrology, and solar irradiance. The data are from NASA 63 heritage and EOS missions including Terra, Aqua, Aura, Solar Radiation and Climate 64 Experiment (SORCE), TRMM, Global Precipitation Measurement (GPM), UARS (Upper 65 Atmosphere Research Satellite), Earth Probe Total Ozone Mapping Spectrometers (TOMS), 66 AIRS (Atmospheric Infrared Sounder), MISR (Multi-angle Imaging SpectroRadiometer), 67 SeaWiFS (Sea-viewing Wide Field-of-view Sensor), and data assimilation collections (including Modern-Era Retrospective Analysis for Research and Applications (MERRA), Global Land Data
Assimilation System (GLDAS), North American Land Data Assimilation System (NLDAS)).
The Federated Giovanni partnership provides access to data sets archived at other NASA data
centers, thereby broadening data access opportunities.

72 [Break-up text: Giovanni offers over 1300 variables covering a wide range of Earth science73 disciplines]

Over 1300 variables are currently available in Giovanni. The Web interface has both Keyword and Faceted Search capabilities (Fig. 1) for locating variables of interest. For example, a search for 'precipitation' returns over 100 related variables (Fig. 1). By using facets, one can filter for variables based on satellite missions (TRMM, GPM) (Fig. 1), instruments, spatial or temporal resolution, etc.

The operating lifetimes of low Earth orbiting (LEO) satellites are often quite limited (~5 years), far less than the thirty years defined by WMO (the World Meteorological Organization) for developing climatology data sets. Some users, however, may still wish to conduct preliminary studies with these satellite data sets to obtain information on spatial distribution and inter-seasonal variation. Giovanni provides the capability to derive climatological maps and time series based on user-defined time periods.

85 Analytical Features

86 [Break-up text: Commonly used analytical methods are available in Giovanni]

87 Many commonly used analytical and plotting capabilities, for capturing spatial and

88 temporal characteristics of data sets, are available in Giovanni. Mapping options include time-89 averaging, animation, accumulation (precipitation), time-averaged overlay of two data sets, and 90 user-defined climatology. For time series, options include area-averaged, differences, seasonal, 91 and Hovmöller diagrams. Cross-sections, applicable to 3-D data sets from AIRS and MERRA, 92 include latitude-pressure, longitude-pressure, time-pressure, and vertical profile. For data 93 comparison, Giovanni has built-in processing code for data sets that require measurement unit 94 conversion and regridding. Commonly used comparison functions include map and time-series 95 differences, as well as correlation maps and X-Y scatter plots (area-averaged or time-averaged). 96 Zonal means and histogram distributions can also be plotted. Samples of the analytical and 97 plotting features are shown in Fig. 2.

98 Visualization Features

99 Visualization features include interactive map area adjustment; animation; interactive 100 scatter plots; data range adjustment; choice of color palette; contouring; and scaling (linear or 101 log). The on-the-fly area adjustment feature allows an interactive and detailed examination of a 102 result map without re-plotting data. Animations are helpful to track evolution of an event or 103 seasonal changes. Interactive scatter plots allow identification and geolocation of a point of 104 interest in a scatter plot. Adjustments of any of these plots provide customized options to users.

105 **Other Features**

To support increasing socioeconomic and GIS activities in Earth sciences, shapefiles
have been added for countries, states in the United States, and major watersheds around the
world. Available functions for shapefiles are time-averaged and accumulated maps (Fig. 2b),

109 area-averaged time series, and histogram. Land-sea masks have been recently added.

110 [Break-up text: Data in Giovanni can be downloaded for further analysis]

111	All data files involved in Giovanni processing are listed and available in the lineage page.
112	Available image formats are PNG, GEOTIFF, and KMZ (Keyhole Markup Language) that can
113	be used for different applications and software packages; for example, KMZ files are
114	conveniently imported into Google Earth (Fig. 2b) where a rich collection of overlays are
115	available. All input and output data are available in NetCDF, which can be handled by many
116	off-the-shelf software packages. Furthermore, users can bookmark URLs generated by Giovanni
117	processing for reference, documentation, or sharing with other colleagues.

118 **Conclusion and Future Plans**

With the latest features and examples described in this overview article, we have shown how Giovanni simplifies access, evaluation, and exploration of NASA satellite data sets. More examples are available in the Giovanni publication list [Acker 2016]. Despite these achievements, improvements in Giovanni are both in development and under consideration, to accommodate increasing demand for additional analytical and plotting capabilities, more data sets, and advanced information technologies to make data exploration simple and productive.

Potential enhancements to the system, currently being evaluated, include visualization and analysis of satellite orbital data sets (Level 2 data), acquisition of complementary data sets from other NASA data centers, and analysis methods specifically for multi-satellite and multisensor measurements. Currently, data sets in Giovanni consist of variables mapped on uniform space-time grid scales, so non-gridded or satellite orbital data sets (commonly providing higher

130 spatial and temporal resolution) are not currently available in the system. Adding orbital data sets 131 to Giovanni could contribute to research requiring increased data resolution and coverage. Data sets from other data centers, including current and future satellite missions, would further 132 133 enhance Giovanni's capabilities for analysis of the integrated Earth system. Note that barriers 134 still exist in the optimization of Giovanni for interdisciplinary studies and data intercomparison. 135 For example, terminologies in data sets can be significantly different between Earth science 136 communities, requiring coordinated efforts to reach consensus and develop standards for uniform 137 data products.

138 The NASA-wide User Registration System (URS) will be another useful feature in 139 Giovanni. It is expected to enhance the Giovanni user experience; for example, with the URS, 140 users can set frequently-used preferences in their profiles, record and retrieve their personal 141 history of data set exploration, and establish their own data collections. For data product 142 developers, their test data can be uploaded and compared with observations and other well-143 established data sets in Giovanni to identify issues in their products, a useful capability to 144 improve data quality. Giovanni developers will also be able better understand their users 145 through profiles and other statistics collected from the URS, in order to develop more user-146 friendly services.

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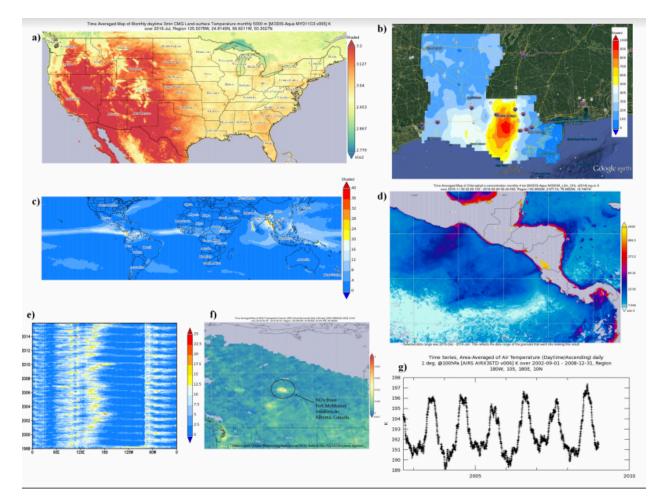
Figure 1. The Giovanni web interface. Over 1300 variables are available for visualization and analysis. Commonly used analytical methods and visualization are available. Keyword and faceted search capabilities allow locating variables of interest with ease. Shapefiles are available for supporting GIS data exploration. Both input and output data can be downloaded for further analysis.

172 Figure 2. Examples of maps and plots generated from Giovanni: a) July 2016, the hottest month 173 ever - MODIS day surface temperatures (in Kelvin); b) Accumulated rainfall (in mm) from IMERG-Late Run, imported in Google Earth as KMZ, showing a record breaking flood event in 174 Louisiana in August 2016; c) The TMPA precipitation climatology (1998-2015, in mm/day) for 175 the boreal summer (June, July, and August); d) El Niño reduces the phytoplankton (mg m⁻³) 176 177 productivity of the Pacific coastal waters off Central America during the 2015-16 winter; e) 178 Hovmöller diagram of TMPA precipitation (in mm/day) in the tropical region (5°S - 5°N) showing 179 ENSO events between 1998 - 2015; f) NASA's Aura satellite views nitrogen dioxide (NO₂, 1/cm) 180 from Fort McMurray wildfires in Alberta, Canada in May 2016; and g) Ouasi-Biennial Oscillation 181 (QBO) seen from AIRS daily tropical temperature (in Kelvin) time series between 2002-08 at 100 182 hPa.

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GPM (20) MERRA Model (5) MERRA-2 Model (13)		Random Error for multi-satellite precipitation with climatological gauge calibration - Early Run (GPM_3IMERGHHE x03)	GPM	Half-Hourly	0.1°	2015-04-01	2016-09-19	mm/hr				
□ NLDAS Model (32) □ TRMM (12)		Surface Convective Precipitation Rate (TRMM_3A12 v7)	TRMM	Monthly	0.5 °	1997-12-01	2015-06-01	mm/hr				
 Spatial Resolutions 		Precipitation Rate (TRMM_3B43 v7)	TRMM	Monthly	0.25 °	1998-01-01	2016-06-30	mm/hr v				
Temporal Resolutions		Merged satellite-gauge precipitation estimate - Final Run (recommended for general use) (GPM_3IMERGM v03)	GPM	Monthly	0.1 *	2014-04-01	2016-01-31	mm/hr ~				
 Portal 		Precipitation Rate (TRMM_3B42_Daily v7)	TRMM	Daily	0.25 °	1998-01-01	2016-06-30	mm/day				
		Near-Real-Time Precipitation Rate (TRMM_3842RT_Daily v7)	TRMM	Daily	0.25 *	2000-03-01	2016-09-19	mm/day ~				
		Precipitation (TRMM_3B42.v7)	TRMM	3-hourly	0.25 °	1997-12-31	2016-06-30	mm/hr				
		Weighting of observed gauge precipitation relative to the multi-satellite precipitation estimate - Final Run (GPM_3IMERGM_v03)	GPM	Monthly	0.1 °	2014-04-01	2016-01-31	%				
		Accumulation-weighted probability of liquid precipitation phase - Final Run (GPM 3IMERGM v03)	GPM	Monthly	0.1 *	2014-04-01	2016-01-31	%				

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