

Editorial Manager(tm) for Remote Sensing of Environment
Manuscript Draft

Manuscript Number:

Title: Comparison of the new LTDR AVHRR reflectance with the GIMMS AVHRR NDVI dataset

Article Type: Short Communication

Keywords: AVHRR NDVI
Long term data records
GIMMS

Corresponding Author: Dr. Molly Elizabeth Brown, PhD

Corresponding Author's Institution: NASA-Goddard Space Flight Center

First Author: Molly Elizabeth Brown, PhD

Order of Authors: Molly Elizabeth Brown, PhD; Michael T Marshall, M.S.

1 **Comparison of the new LTDR AVHRR reflectance with the GIMMS AVHRR**

2 **NDVI dataset**

3

4 **Short Communication for RSE**

5

6 **Authors:** M.E. Brown, M.T. Marshall

7

8 **Abstract**

9

10 The GIMMS Advanced Very High Resolution Radiometer (AVHRR) NDVI dataset has nearly
11 three decades of observations and is the most widely used vegetation index dataset. In this
12 short communication, we compare AVHRR normalized difference vegetation index (NDVI)
13 data from the GIMMS group with NDVI created from the Long Term Data Record (LTDR)
14 daily reflectance. The two datasets have substantially different processing characteristics,
15 with the LTDR offering daily channel data, higher resolution and more complete
16 atmospheric correction than the reflectance from which the GIMMS data were derived, but
17 the data ends in 1999. Understanding and characterizing the impact of the differences
18 between the GIMMS and LTDR datasets is a first step in being able to exploit the temporal
19 and spatial resolutions offered by the new LTDR AVHRR dataset. We found that although
20 there are significant differences between the datasets, they are broadly comparable during
21 the 1981-1999 period. The LTDR AVHRR dataset will provide a solid foundation for future
22 AVHRR datasets once it has been extended through to the present.

23

24 **1.0 Introduction**

25

26 The AVHRR NDVI is one of the few consistent sources of observations that provide direct,
27 daily and continuous measurements of the ground that can be processed into datasets of
28 sufficient quality for global change analysis [Brown, et al., 2006]. These measurements
29 have increased in importance for a variety of communities as the record has grown in
30 length. The data are now being used in a wide variety of scientific [Neigh, et al., 2008],
31 modeling [Yang, et al., 2006; Zhou, et al., 2003] and operational [Brown and De Beurs, 2008;
32 Tarnavsky, et al., 2008; van Leeuwen, et al., 2006] settings to estimate how ecosystems have
33 changed in the past three decades.

34

35 The AVHRR record requires substantial processing as the observations are contaminated
36 by a wide variety of atmospheric, aerosol and radiometric effects. The dataset most
37 frequently used in the scientific literature is the AVHRR NDVI dataset produced by the
38 Global Inventory Monitoring and Mapping (GIMMS) group, described in Tucker et al.
39 (2003). The dataset consists of 15-day composites that begin in July 1981 and go through
40 the present, incorporating data from AVHRR/2 sensors on satellites NOAA-07, 09, 11, 14
41 and AVHRR/3 sensors on satellites NOAA-16, 17 and 18.

42

43 The version 2 Long Term Data Record (LTDR) data, described in [Nagol, et al., 2008;
44 Pedelty, et al., 2007] is available online at <http://ltdr.nascom.nasa.gov/ltdr/ltdr.html>. This
45 new dataset has a few advantages over the GIMMS data, including a comprehensive
46 atmospheric correction that is applied to daily data and a higher spatial resolution. The

47 LTDR dataset does have a data gap for the six months in 1994 where the GIMMS data uses
48 NOAA-9. In addition, the LTDR dataset only runs until 1999, as it does not include data
49 from NOAA-17 or NOAA-18. This reduces its utility over GIMMS long-term studies until it
50 can be extended. Here we compare the GIMMS NDVI with NDVI calculated from LTDR
51 reflectance for the overlapping period to determine how similar the two datasets are, as
52 well as their compatibility. Although a diversity of data sources are useful for the
53 community, understanding how these two datasets compare is important for future
54 investments.

55

56 **2.0 Data and Methods**

57

58 Two AVHRR NDVI datasets are used in this study: the LTDR and the GIMMS data. Here each
59 dataset will be described along with the processing and analysis approach. The version 2
60 LTDR data used here are a five channel, daily reflectance dataset provided at a global CMG
61 geographic 0.05 degree resolution. Using new methods developed from their experience
62 with MODIS data [*Nagol, et al., 2008*], improved methods were developed and implemented
63 to correct the dataset for Rayleigh scattering, ozone and aerosol contamination [*Nagol, et*
64 *al., 2008*],.

65

66 The LTDR data was aggregated into 15-day maximum value composites (day 1-15 and day
67 16-end of the month) for comparison purposes with the GIMMS dataset. A channel 5
68 temperature ($< 0\text{ }^{\circ}\text{C}$) mask was applied to reduce interference from clouds. Because the
69 LTDR data are mapped daily, all available data is provided, including data at the extremes

70 of view angle (Figure 1). To composite data to match the GIMMS data, only data with a
71 view angle less than 42 degrees off nadir are used in the composite.

72

73 A weighted least squares temporal moving filter described in Swets et al. (1999) was
74 applied to the LTDR dataset and compared to the GIMMS dataset. The smoother calculates
75 the linear least squares regression between points bounded by a default window. Weights
76 are assigned based on magnitude- peaks are weighted more heavily than troughs.

77 Preferential weighting is chosen, because noise generally acts to lower NDVI. The values
78 determined from the lines at a given point are then combined using a simple average.

79 Values that exceed a maximum threshold and fail the chi squared test with two degrees of
80 freedom are considered outliers and subsequently omitted from the process.

81

82 The GIMMS group NDVI data are at 8km resolution and in a global composite of 0.07
83 degrees. Only the NDVI data are corrected, with the reflectance data uncorrected and
84 available only during certain periods and in certain areas. The GIMMS data have had the
85 effects of solar zenith angle removed for the tropics and the AVHRR/2 and AVHRR/3 data
86 have been integrated into one dataset through the use of SPOT Vegetation and the
87 empirical mode decomposition and reconstruction technique [Pinzon, 2002].

88

89 We selected the same sites as were used in the Brown et al (2006) paper to compare the
90 two datasets globally. A time series for each dataset was extracted at 25 km² resolution
91 (Table 1). We present SeaWiFS land [SeaWiFS-Land, 2004], and MODIS climate model grid
92 monthly MOD13 [Huete, et al., 2002] time series for each site for further comparison with

93 the LTDR dataset. The mean and standard deviation over all months for each dataset was
94 used to characterize a site. The global maximum NDVI from 1981-1999 was calculated to
95 compare the two datasets and identify differences spatially.

96

97 **3.0 Results**

98

99 Time series plots show a broad similarity in the LTDR and GIMMS AVHRR datasets (Figure
100 2). Overall, the GIMMS NDVI data has higher values than the LTDR, as can be seen in Table
101 1, and is therefore much closer to the NDVI values of SeaWifs and MODIS. The correlations
102 between the AVHRR GIMMS and LTDR anomaly time series were higher than those
103 between the GIMMS dataset and the other sensors. In some cases, there was essentially no
104 relationship between the GIMMS anomaly and the other sensor anomaly, but a fairly high
105 correlation between the GIMMS and LTDR datasets (the Ji Parana site in Brazil, for
106 example).

107

108 Globally, Figure 3 shows the maximum NDVI from 1981-1999 for the GIMMS (top) and the
109 LTDR (bottom) datasets. Figure 4 provides a histogram of the two images, showing that
110 the highly vegetated pixels have an NDVI value of around 0.9 for the GIMMS and 0.7 for the
111 LTDR. At the lower end, the GIMMS data is slightly lower than the LTDR for sparsely
112 vegetated regions.

113

114 **4.0 Discussion**

115

116 The GIMMS group NDVI has become one of the primary long term data records [*Eklundh*
117 *and Olsson, 2003*] which requires direct observations for scientific studies from multiple
118 disciplines [*Anyamba, et al., 2001; Slayback, et al., 2003; Stow, et al., 2003; Suzuki, et al.,*
119 *2003*] and for modeling and mapping efforts. This has been because it is one of the few
120 sources of global measurements that are available from 1981 to a year or so behind the
121 present day which are consistent, comparable and statistically robust across the whole
122 AVHRR record.

123

124 The AVHRR/2 to AVHRR/3 design change introduced in 2000 with the flying of NOAA-16
125 consisted of several changes that make the incorporation of the data from before 1999 with
126 that after non-trivial. These include

- 127 • embedded timing and global positioning coordinates in each scan, greatly improving
128 the geolocation of the mapped data
- 129 • on-board satellite stabilization which removes the problem of a precessing orbit
130 which afflicts the data from the AVHRR/2 series;
- 131 • changes in the spectral reflectance functions which would, without correction,
132 increase the NDVI over what was seen in the AVHRR/2 data;
- 133 • A dual gain is also introduced in Channels 1 and 2 data that affect the response of
134 the lower reflectance regions in comparison with the upper ranges.

135

136 The GIMMS data uses the empirical mode decomposition (EMD) and reconstruction
137 technique [*Huang, et al., 1998*] to incorporate the AVHRR/2 with the AVHRR/3 data
138 [*Pinzon, 2002*]. Here we compare the GIMMS data from the AVHRR/2 series with that from

139 the LTDR. The LTDR reflectance dataset does not attempt to combine the information from
140 the two series of instruments, but does have a comprehensive atmospheric correction,
141 daily time step and a higher resolution than the GIMMS data. Here we find that although
142 there are significant differences between the two datasets, which can be attributed both to
143 differences in processing as well as the atmospheric correction applied to data, they still
144 remain to be smaller than the differences among NDVI datasets from different sensors.

145

146 The effect of the EMD processing technique is to bring the two AVHRR series of
147 instruments together in the same time series, and to match the resulting AVHRR dataset to
148 the levels seen in other widely-used vegetation datasets such as from MODIS. Here we
149 show that the GIMMS AVHRR NDVI is comparable to the LTDR dataset, despite its lack of a
150 comprehensive atmospheric correction of the reflectance. The post-processing empirical
151 approach used by the GIMMS group results in the removal of spurious noise and not signal,
152 resulting in a similar end product as the more traditional atmospheric correction process
153 used in the LTDR. Although the results show that the contamination of the AVHRR signal
154 by aerosols and clouds is still much higher than the other two sensors, overall the two
155 AVHRR datasets are comparable to other global datasets at similar resolutions.

156

157

158 **5.0 Conclusions**

159

160 The new LTDR dataset poses new opportunities for the remote sensing community, as it
161 provides a daily global reflectance product with a far more comprehensive correction for

162 aerosols and atmospheric effects than what was available with the AVHRR Pathfinder Land
163 (PAL) product [James and Kalluri, 1994]. Although the dataset is currently not available
164 past 1999, it has the potential of being a strong resource for land observations. To
165 understand its impact, we have here compared it to the widely used AVHRR GIMMS 15 day
166 dataset, and to NDVI datasets from MODIS and SeaWiFS.

167

168 We conclude that the LTDR data has a lower range and requires significant post-processing
169 to be used as a vegetation index dataset, specifically creating the NDVI, compositing the
170 daily data and smoothing of the composited files. The data also is missing six months of
171 data in 1994 and does not extend past 1999. It has potential, however, of being a good
172 intermediate step to a new higher resolution, shorter compositing period AVHRR NDVI
173 dataset in the coming years.

174

175 **References**

176

177 Anyamba, A., et al. (2001), NDVI anomaly patterns over Africa during the 1997/1998 ENSO
178 warm event, *International Journal of Remote Sensing*, 22, 1847-1859.

179 Brown, M. E., and K. M. De Beurs (2008), Evaluation of Multi-Sensor Semi-Arid Crop Season
180 Parameters Based on NDVI and Rainfall, *Remote Sensing of Environment*, 112, 2261-2271.

181 Brown, M. E., et al. (2006), Evaluation of the consistency of long-term NDVI time series
182 derived from AVHRR, SPOT-Vegetation, SeaWiFS, MODIS and LandsAT ETM+, *IEEE*

183 *Transactions Geoscience and Remote Sensing*, 44, 1787-1793.

184 Eklundh, L., and L. Olsson (2003), Vegetation index trends for the African Sahel 1982-1999,
185 *Geophysical Research Letters*, 30, 13-11, CiteID 1430, DOI 1410.1029/2002GL016772.

186 Huang, N. E., et al. (1998), The empirical mode decomposition and the Hilbert spectrum for
187 nonlinear and non-stationary time series analysis, *Proceedings of the Royal Society of*
188 *London*, 545, 903-995.

189 Huete, A., et al. (2002), Overview of the radiometric and biophysical performance of the
190 MODIS vegetation indices, *Remote Sensing of Environment*, 83, 195-213.

191 James, M. E., and S. N. V. Kalluri (1994), The Pathfinder AVHRR land data set: An Improved
192 Coarse Resolution Data Set for Terrestrial Monitoring, *International Journal of Remote*
193 *Sensing*, 15, 3347-3363.

194 Nagol, J. R., et al. (2008), Effects of Atmospheric Variation on AVHRR NDVI Data, (*in press*).

195 Neigh, C. S. R., et al. (2008), North American vegetation dynamics observed with multi-
196 resolution satellite data, *Remote Sensing of Environment*, 112, 1749-1772.

197 Pedelty, J., et al. (2007), Generating a Long-term Land Data Record from the AVHRR and
198 MODIS Instruments, paper presented at International Geoscience and Remote Sensing
199 Symposium, Barcelona, Spain, 23-27 July 2007.

200 Pinzon, J. (2002), Using HHT to successfully uncouple seasonal and interannual
201 components in remotely sensed data, paper presented at SCI 2002 Conference Proceedings
202 Jul 14-18, SCI International, Orlando, Florida.

203 SeaWIFS-Land (2004), SeaWIFS land Data organized by Data Product groups, edited, GES
204 Distributed Active Archive Center.

205 Slayback, D. A., et al. (2003), Northern hemisphere photosynthetic trends 1982-99, *Global*
206 *Change Biology*, 9, 1-15.

207 Stow, D., et al. (2003), Variability of the seasonally integrated normalized difference
208 vegetation index across the north slope of Alaska in the 1990s, *International Journal of*
209 *Remote Sensing*, 24, 1111-1117.

210 Suzuki, R., et al. (2003), West-east contrast of phenology and climate in northern Asia
211 revealed using a remotely sensed vegetation index, *International Journal of Biometeorology*,
212 47, 126-138.

213 Swets, D. L., et al. (1999), A weighted least-squares approach to temporal smoothing of
214 NDVI, in *ASPRS Annual Conference, From Image to Information*, edited, American Society for
215 Photogrammetry and Remote Sensing, Portland, Oregon.

216 Tarnavsky, E., et al. (2008), Multiscale Geostatistical Analysis of AVHRR, SPOT-VGT, and
217 MODIS Global NDVI Records, *Remote Sensing of Environment*, 112, 535-549.

218 van Leeuwen, W., et al. (2006), Multi-sensor NDVI data continuity: Uncertainties and
219 implications for vegetation monitoring applications, *Remote Sensing of Environment*, 100,
220 67-81.

221 Yang, F., et al. (2006), Prediction of Continental-Scale Evapotranspiration by Combining
222 MODIS and AmeriFlux Data Through Support Vector Machine, *Geoscience and Remote*
223 *Sensing, IEEE Transactions on*, 44, 3452-3461.

224 Zhou, L., et al. (2003), Relation between interannual variations in satellite measures of
225 northern forest greenness and climate between 1982 and 1999, *Journal of Geophysical*
226 *Research-Atmospheres*, 108.

227

228

229

231 **Captions**

232

233 Table 1. Data comparison from 21 sites around the world, showing the relationship
234 between the monthly NDVI anomalies of the GIMMS AVHRR (G) compared to the LTDR
235 AVHRR NDVI (L), SeaWiFS (SW) and MODIS (MO) anomaly time series at a monthly
236 timestep. Also reported are the mean NDVI for each site and the standard deviation of the
237 anomaly for the period.

238

239 Figure 1. Image of July 1, 1997 reflectance of Channel 2 from the LTDR data web site.
240 Notice the nearly complete coverage at 0.05 degree by using data at the edge of the AVHRR
241 swath and a continuous mapping approach. Regions with very off-nadir data show as
242 lighter diagonal stripes.

243

244 Figure 2. Time series of X site showing the variability of GIMMS, LTDR, SeaWiFS, 10-day
245 SPOT Vegetation and monthly MODIS CMG data. The Landsat NDVI averages are plotted
246 (circles) and were created from atmospherically corrected NDVI subsets around the study
247 sites. All data are the average of a 25 km² window. The top panel shows the entire 1981-
248 2008 record and the bottom shows the overlapping period of 1997-2004.

249

250 Figure 3. Global AVHRR NDVI from LTDR and GIMMS showing a comparison of the
251 maximum NDVI for each pixel throughout the record.

252

253 Figure 4. Histogram of the data from the maximum NDVI images shown in Figure 3.

254

255

256

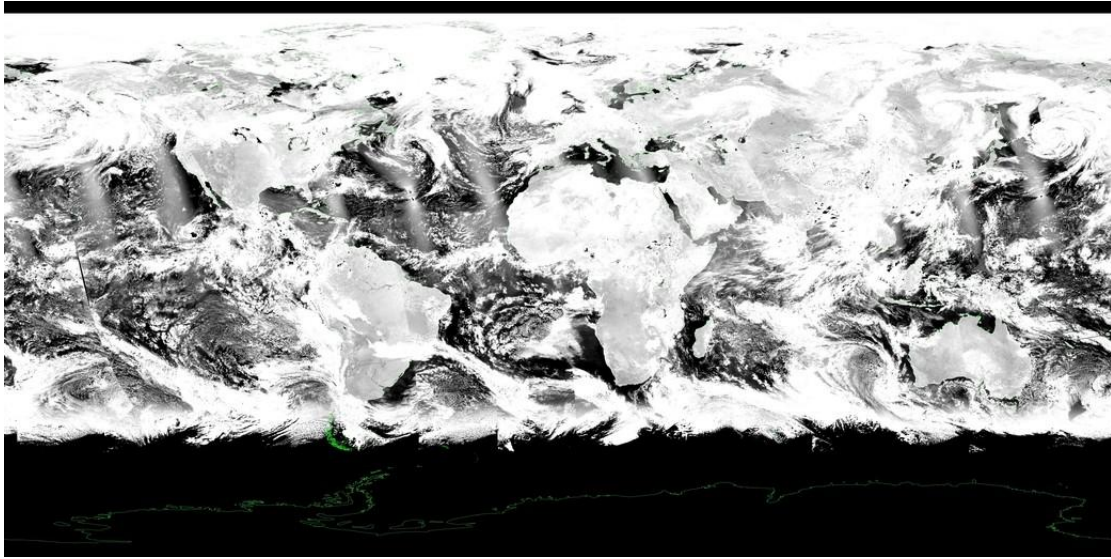
257 Table 1.

258

Site Name	lat	long	Land Cover	Anomaly Correlations			G	Mean NDVI * 1000			Standard Deviation of Anomaly			
				G-L	G-SW	G-MO		L	SW	MO	G	L	SW	MO
				(n=222)	(n=36)	(n=55)								
Australia NW	-31.1	150.7	grasses	0.62	0.63	0.70	534	473	496	477	96	76	79	80
Barrow	71.3	-156.7	closed brushlands/shrubland	N/A	0.03	0.02	184	N/A	293	111	53	N/A	47	67
Bondville	40.1	-88.4	croplands	0.43	0.16	0.13	432	396	399	409	47	49	49	74
Cascades-1	44.2	-122.3	evergreen needleleaf forest	0.31	0.34	0.10	679	662	786	750	52	68	72	96
Crystal_City	28.7	-99.9	wooded grasslands/shrubs	0.34	0.39	0.48	404	368	387	428	57	86	77	89
E.Longreach,AU	-23.0	145.5	closed brushlands/shrubland	0.54	0.39	0.47	346	292	275	277	65	61	54	54
Gujarat	22.0	70.0	open shrublands	0.77	0.60	0.26	265	242	237	296	59	61	48	50
Harvard	42.5	-72.2	mixed forests	0.35	0.10	0.04	652	579	686	652	43	55	50	81
Ji-Parana	-10.8	-62.4	woodlands	0.23	0.01	0.02	647	590	642	736	67	61	53	28
Konza	39.1	-96.6	wooded grasslands/shrubs	0.41	0.57	0.16	466	438	457	479	41	39	46	68
Louga,Senegal	16.0	-16.0	bare	0.69	0.56	0.63	216	196	204	231	50	43	30	30
Lyon,France	46.0	5.0	wooded grasslands/shrubs	0.48	0.09	0.06	553	493	543	620	34	49	30	79
Mongu	-15.3	23.2	wooded grasslands/shrubs	0.24	0.12	0.31	497	437	441	513	44	42	46	32
Parkfall_Wisc-1	45.9	-90.3	mixed forests	0.38	0.20	0.09	522	466	540	538	45	54	64	110
Rajasthan,India	26.0	74.5	wooded grasslands/shrubs	0.73	0.64	0.58	260	262	248	243	50	53	68	61
Saskatchewan	50.0	-110.0	grasses	0.51	0.68	0.43	293	272	249	234	63	58	68	83
Sevilleta	34.4	-106.9	open shrublands	0.31	0.44	0.29	193	185	186	185	23	24	21	19
Skukuza	-25.0	31.6	wooded grasslands/shrubs	0.46	0.53	0.64	495	432	452	510	77	80	67	86
Tapajos	-2.4	-54.8	woodlands	0.16	0.25	0.02	389	423	552	471	66	51	55	33
USDAAARS-BAF	39.0	-76.9	wooded grasslands/shrubs	0.19	0.25	0.00	533	499	551	580	33	34	34	61
Walker	36.0	-84.3	mixed forests	0.14	0.10	0.07	623	574	640	668	35	37	28	20

259

260 Figure 1.



261

262

263

264

265

266

267

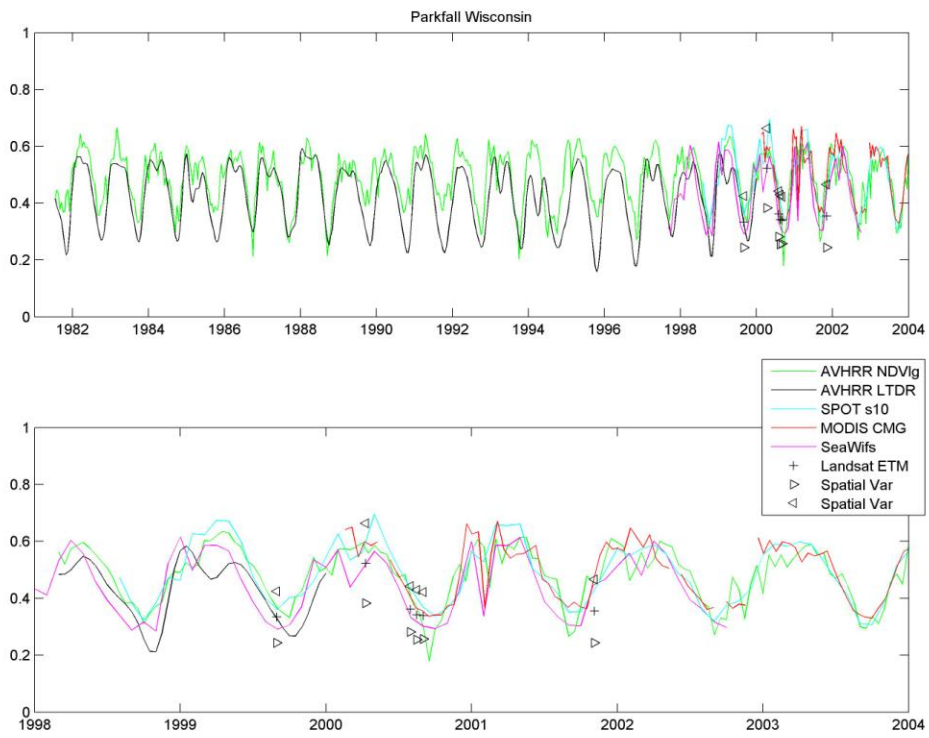
268

269

270

271

272 Figure 2.

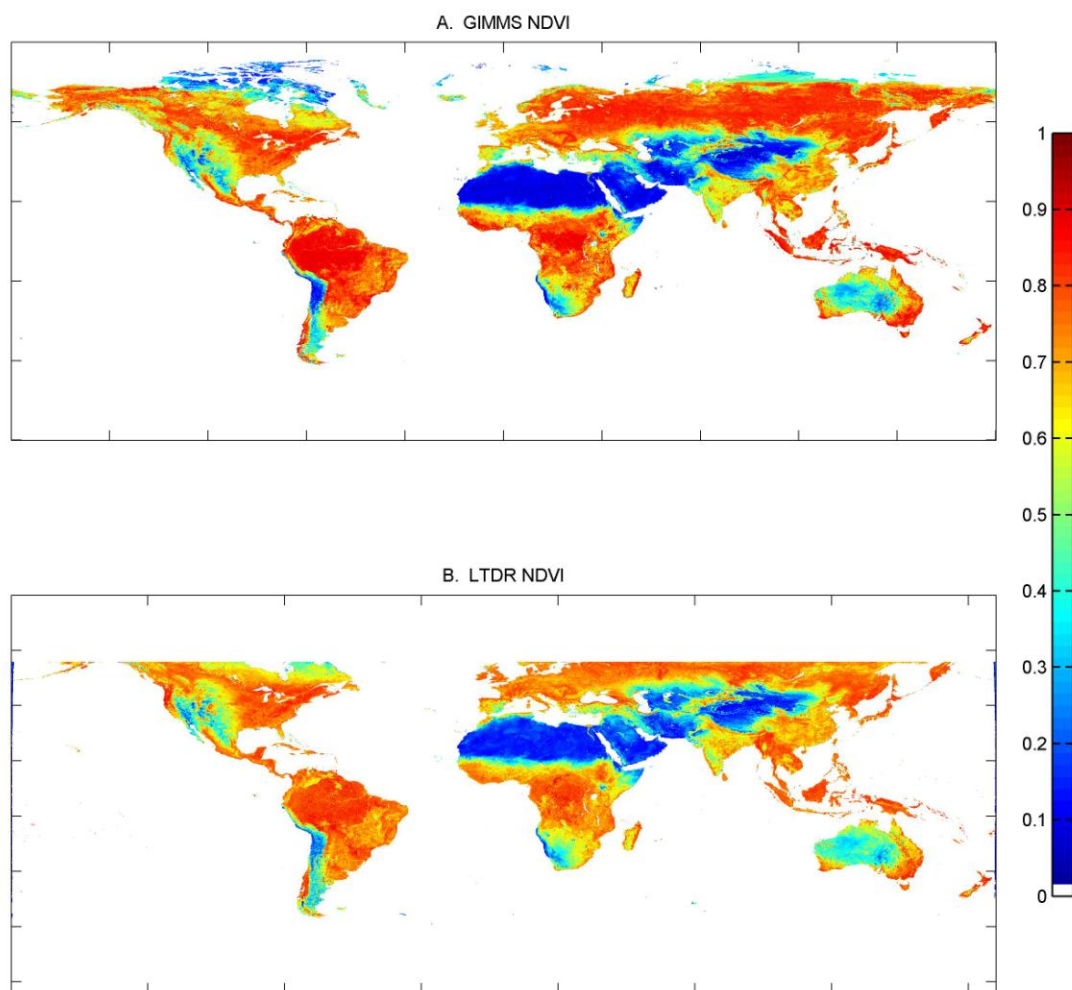


273

274

275

276 Figure 3.

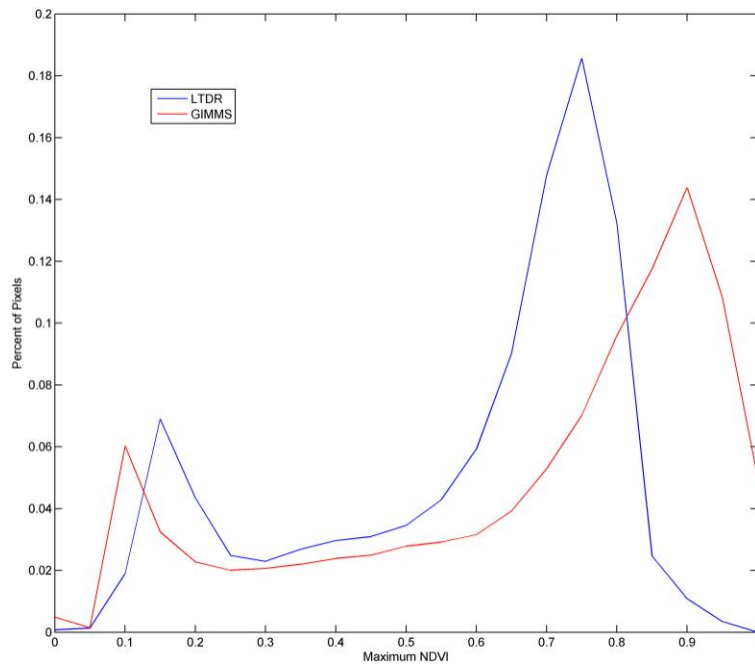


277

278

279 Figure 4.

280



281

282

283