

TRANSPORTATION RESEARCH SYNTHESIS

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Low Cost Aerial and Spatial Data

Prepared by Pro-West & Associates, Inc.

Introduction

MnDOT Office of Transportation System Management (OTSM) desires to reduce the cycle time for collecting road data updates from county sources and, opportunistically, capture additional data about road and ancillary uses, e.g. bicycle access. Specifically, this project researched free or low-cost aerial or spatial data from government and other sources to determine if the imagery and spatial data would provide a source of sufficient resolution, accuracy and low cost to maintain MnDOT's various mapping needs.

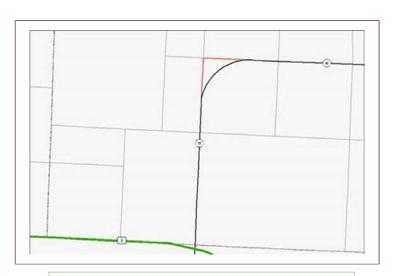


Figure 1. Example change detection characteristic

Additionally, a process of comparing imagery (satellite or aerial imagery) to identify change detection (as shown in Figure 1 to illustrate how change detection may provide information on road realignment) was requested as a method of approaching the issue of maintaining geospatial road features and associated attributes.

Currently, response for a request for updated road information from Minnesota counties can take six to nine months, and the information may contain errors or deficiencies. The lag in receiving information is compounded by the need to freeze data for reporting processes annually. In the best case, these data issues produce a 1.5 to 2-year lag between official MnDOT data products and local authoritative data. In the worst case, local responses are incomplete and inaccuracies persist over long periods.

MnDOT requests a minimal amount of information from local governments to lessen the extensive labor impact of such requests, and requires a data maintenance source and process that allows accurate, repeatable, automated and timely updates of road data. The agency highly values the ability to automatically extract data from external data sources.

Technical Advisory Panel

Panel Member	Role	Organization
Arturo Botello	Geographical Information & Mapping (GIM) Unit, Research Specialist	MnDOT Office of Transportation System Management
Lindsey Danielson	GIM Unit – State Bicycle Map	MnDOT Office of Transportation System Management
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Jacqueline Amor	Imagery Research	Pro-West & Associates, Inc.
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Summary of Project Findings

Many types of low-cost aerial and spatial data are available from local and commercial sources that satisfy aspects of MnDOT's data needs. However, no single source or software platform provides the desired combination of low-cost, frequent updates, high resolution and spectral range necessary to apply out-of-the-box analysis tools that can simply detect the presence of roads, let alone extract surface type and other attribute information.

For annual data collection, the most promising source of data is the geospatial road data developed and maintained by Minnesota counties in support of the NG9-1-1 effort and local emergency response. As mandated by state law, counties provide up-to-date geospatial data to the Minnesota Geospatial Information Office (MnGeo) four times per year¹. While no tools currently exist to return the specific road-change report parameterized in this scope, the fact that the authoritative source maintains and periodically updates the NG9-1-1 datasets implies that it would be practical to develop comparison workflows (geospatial features and attributes) using out-of-the-box GIS tools, which could significantly reduce the amount of manual effort currently required.

The remainder of this document catalogs and details the wide range of data, imagery, software and technology evaluated for the project.

¹ Minnesota State Statute §403.025, Subdivision 1

¹Minnesota State Statute §16E.30 Subd.11 (b)

Data

This section details the non-imagery, spatial data sources identified during the research phase of this project, including cost, availability and suitability to support the needs of MnDOT.

Data already being collected

The datasets below are being collected actively and are relevant to the project requirements.

NG9-1-1 Road Centerline Data

This data is being developed by Minnesota counties and aggregated by MnGeo into a single, state-wide centerline dataset. Counties are mandated by state law² to provide the data to MnGeo four times per year. The data is the most current, most well-maintained and most accurate source of road data identified in this project.

Costs

This data is available from MnGeo at no cost for use by state government agencies.

Technical Specifications

No metadata is available, at this time. The acquisition and aggregation process is not defined fully. The data are available to all state agencies.

Standards, which are nearly complete, drive the creation of the "All Roads Network". The Minnesota Geospatial Advisory Council (GAC), Standards Committee met in November 2017 to approve the Minnesota Address Point Data Standard for NG9-1-1 data as the statewide standard. The standard is expected to be approved by the GAC in March 2018.

MnGeo plans to write an Extract/Transform/Load (ETL) tool to transform the local government data from the NG9-1-1 format to MnDOT's Linear Referencing System (LRS) standard, and transform state centerline data from the LRS format to the NG9-1-1 standard. The best practice for providing consistent and timely data to MnDOT will be by utilizing a repeatable process facilitated by an ETL tool.

Suitability

The consistent, periodic road updates allow tracking new roads early in a process, possibly before construction takes place and any imagery changes are visible. With frequent updates to ensure timely reports of change, while also containing road data supporting the issuance of addresses for new construction, this dataset is extremely applicable to addressing MnDOT's needs.

OpenStreetMap (OSM) Data

Costs

The data are available free of charge.

Technical Specifications

No metadata is available.

Suitability

As the OSM data depends on public contributions to update the underlying dataset, it is most accurate in urban areas. Accuracy in rural areas depends on the engagement of local OSM volunteers and no objective measure of completeness exists. If there were a reference dataset to compare to, MnDOT should simply use the reference data directly.

OSM does have the advantage of being able to integrate into the most software packages for tool development and analysis.

² Minnesota State Statute §16E.30 Subd.11 (b)

NavMart

NavMart is a reseller of HERE Map Data.

Costs

\$4,000

Technical Specifications

Layers include major highways, major highway shields, secondary highways, secondary highway shields, railroads, zones, administrative area boundaries, oceans, islands, waterway polygons & segments, land use features, and streets.

Suitability

Unless MnDOT executes a custom engagement, the data are only available in Esri Shapefile format. There is no declaration on how often the data are updated and no information on the ability to retrieve historical datasets.

Tele Mart

Acquired by TomTom in 2007, Tele Mart is a vendor of the Tele Atlas dataset.

Costs

Contact Tele Mart for quote.

Technical Specifications

Data contains coverage of the U.S., Canada, Mexico and Europe and is purchased at the state and county level. Data are updated quarterly.

http://www.tele-mart.com/documents/MultiNetInfoSheettm.pdf

Suitability

The Tele Atlas data is no longer a premier source of data for large sites due to agreements to provide data to Google expired in 2009 and loss of MapQuest in 2009.

Data currently extracted from Imagery

No automatically derived road datasets, derived from imagery, were identified for the State of Minnesota. Pilot projects exist in other states and counties using satellite data for automated road detection. Notably, Digital Globe Corporation is performing the process on a commercial scale in Australia using data from the WorldView-3 satellite and generating updated rooftop and swimming pool extraction on an ongoing update basis. Following automation model training, the process can take hours for the extraction to complete. More details of this technique can be found here: (http://gbdxstories.digitalglobe.com/swimming-pools/).

Imagery

Imagery is a ubiquitous data product, but the specific characteristics of the various image acquisitions satellites and techniques can vary considerably. All the datasets found during this project's research are satellite data products. No low-altitude (airplane or drone) imagery appears to be available generally, except for scheduled flights performed by Eagle View, but those flights typically occur on a multi-year schedule. In addition, imagery research identified no commercial sources of LIDAR data.

Free

The following satellite imagery data sources that provide data free of charge were identified.

USGS Earth Explorer

The USGS Earth Explorer is an interactive web viewer that provides a single point of access to numerous satellite image data sets.

Costs

Free

Technical Specifications

See the section of the technical specification of the individual satellite instruments and their suitability to the project in Appendix A.

Suitability

As this is not a primary source of data, it is not directly applicable to this project.

Google Earth Pro

Google Earth Pro is a software product from Google, Inc. that provides access to the imagery used by Google in its popular Google Maps product.

Costs

Free

Technical Specifications

Compiles multiple aerial imagery sources (30-meter resolution to <15-meter resolution) and uses the best available source for the area you are viewing.

Suitability

The Google Earth Imagery is not suitable as a primary data source as it is a composite image that produces "cloud-free" images useful as a general backdrop for mapping applications. Google utilizes Landsat-7 and Landsat-8 instruments, which have a maximum resolution of 15 meters; insufficient to resolve roads with high accuracy.

NOAA Data Access Viewer

NOAA Data Access Viewer is a web-based viewer utilizing a shopping cart model to view various NOAA datasets.

Costs

Free

Technical Specifications

Only available around coastlines.

Suitability

NOAA data sources are unsuitable due to a lack of annual updates and low spatial and spectral resolution of the data products, which preclude applying automated road extraction methods to the imagery. The primary data sets target land cover changes on a decadal time scale.

JAXA's Global

Costs

Free

Technical Specifications

ALOS World 3D (30 meter)

Suitability

JAXA's Global is unsuitable due to lack of high resolution needed for analysis.

ESA Earth Observer Catalog

Costs

Free

Technical Specifications

Capability to download imagery such as Envisat, ERS, Landsat, IKONOS, DMC, ALOS, SPOT, Kompsat, Proba, IRS, SCISAT. The data ranges from 3-meter to 30-meter resolution. See the technical specification section for individual satellite instruments and their suitability to the project in Appendix A.

Suitability

As this is not a primary source of data, it is not directly applicable to this project.

Paid

The following satellite image data source were identified that provide their data for a fee. Various limitations and restrictions for each data source are detailed.

Digital Globe

Costs

\$7,500

The cost includes an annual update for a web streaming service. MnDOT would not be able to conduct analysis utilizing data from a web streaming service. If interested, MnDOT could inquire further regarding downloadable data.

\$500,000 (per year)

Includes downloadable, analyzable data for the state of Minnesota.

Technical Specifications

The web streaming service provides WorldView-1, -2, and -3 (0.31-meter), GeoEye-1 (0.46-meter satellite imagery. Annual updates for Minnesota are possible but not guaranteed.

Suitability

Based on the publicly available technical specifications this data is not suitable due to the update ability of the imagery. In order to acquire data, the data is purchased through DigitalGlobe or Satellite Imagery Corporation (SIC). Contacts provided, if requested.

Satellite Imagery Corporation (SIC)

Costs

\$6,800

The cost includes an annual update for a web streaming service. MnDOT would not be able to conduct analysis utilizing data from a web streaming service. If interested, MnDOT could inquire further regarding downloadable data.

Technical Specifications

The web streaming service provides WorldView-1, -2, and -3 (0.31-meter), GeoEye-1 (0.46-meter) satellite imagery. Annual updates for Minnesota are possible but not guaranteed.

Suitability

Based on the publicly available technical specifications this data is not suitable due to the update ability of the imagery. The data is purchased through DigitalGlobe or SIC. Pro-West will provide contacts from both companies upon request.

Planet Labs

Costs

Detailed cost information from Planet Labs was unavailable without a signed Non-Disclosure Agreement. Pro-West received a ballpark estimate over \$500,000.

Technical Specifications

SkySat1 & 2 (0.9-meter)

Suitability

Based on the publicly available technical specifications this data is not suitable due to lack of guarantee for annual update of imagery.

NearMap

Costs

Cost to purchase a statewide imagery product is approximately \$100,000. Smaller defined areas can be purchased for \$5,000 per GB.

Technical Specifications

Three-inch resolution for the NearMap PhotoMaps™ orthophoto product are only available around the Minneapolis metropolitan area, Duluth and Moorhead; all other locations for satellite imagery within the State are at lower resolution.

Suitability

Based on the publicly available technical specifications this data is not suitable because it is only available within three areas of Minnesota at a suitable high resolution.

Airbus Defence & Space

Costs

Detailed cost information from Airbus Defence & Space is unavailable. Airbus Defence & Space will provide a detailed quote upon receipt of imagery specifics.

Technical specifications

1.5 -meter multispectral resolution (uses SPOT and Pleiades satellites).

Suitability

Based on the publicly available technical specifications this data is not suitable due to lack of guarantee for annual update of imagery. Airbus, Defence & Space is not a low-cost solution.

Polar Geospatial Center (PGC) – University of Minnesota

Costs

The PGC acquires data on an ongoing basis that may be useful as a source of imagery for digitizing new roads, or creating an automated change detection process, however, the PGC imagery is limited to organizations connected to federal projects, and cannot be used in any manner that would compete with commercial imagery sources.

Suitability

Based on the restrictions for federal projects and non-compete agreements with commercial imagery sources, this imagery is not suitable.

SatShot.com

Costs

The cost of acquiring imagery through SatShot is similar to other imagery sources. Currently, the business is using imagery for agriculture related projects by acquiring imagery for the agriculture areas of the state (Red River Valley and South of I-94). MnDOT would need to supplement the currently available imagery to cover the entire state. An estimate of \$1-2 million would be required to acquire satellite imagery at one-meter resolution for the entire state.

Technical Specifications

SPOT 6 and 7 satellite imagery. Urban areas would require the .5-meter resolution imagery product, and rural areas would require a one-meter resolution imagery product. 3-8 satellite imagery shots are acquired within the agricultural region from April through September.

Suitability

Lanny Faleide, owner of SatShot, could develop a \$200,000 more economic model for purchasing satellite imagery for change detection. The proposed solution would not provide automatic change detection, which requires higher resolution imagery, but instead utilizes a manual vector trace process for MnDOT change detection needs. The cost of the manual vector trace solution requires discussion with MnDOT to determine requirements.

The automated changed detection solution proposed by Lanny would be like those discovered during the literature research for general suitability below. An automated process requires set up, testing, quality control, and an auto-trace process by SatShot.

General Suitability

To perform effective feature extraction and automated comparison over multiple years, a literature review of research and methods was conducted. Listed below are the literature review summary results related to MnDOT's data priority needs reported during the project kick-off meeting.

- Mapping performed on at least an annual basis
- Automate from aerial photos and change detection
- Compare current data to a new data source to extract data changes
- Process that creates a redline to incorporate into existing data for the entire state
- Spatial accuracy better than 40 feet +-

Based on the literature reviewed, Pro-West found no work that addresses all MnDOT's data priority needs. The literature review is detailed by application domain and a review of the strengths and weaknesses of the authors' approaches as related to the MnDOT needs.

Impervious Surfaces

Pro-West reviewed several works on impervious surfaces (Deng 2012, Li 2016, Sherba 2014, Karila 2017) to establish a baseline for the feasibility of extracting road information from satellite imagery, specifically, the review examined the ability to detect pavement vs non-pavement and considered the feasibility of multi-surface classification (dirt, gravel, concrete, etc.).

Based on our review, impervious surface detection is difficult due to either insufficient spatial resolution of the source imagery, which makes accurate road detection infeasible in urban environments, or occluding phenomena, such as building shadows or cloud cover (Yeng 2016). Cloud cover is especially problematic for MnDOT, since obtaining a cloud-free image mosaic could require many image acquisition passes. It is common for cloud cover to persist for several days at a time over greater Minnesota.

In addition to the general image acquisition characteristics, it has been shown (Deng 2012, Akay 2016) that separating bodies of water from impervious surfaces is difficult since they have similar spectral characteristics as low-albedo impervious surfaces. The use of Normalized Difference Water Index (NDWI) can be an effective means of masking out surface water, but requires the satellite data to contain Near-Infrared (NIR) and Short-Wave Infrared (SWIR) channels thus rendering this technique unsuitable for some imagery, specifically high-resolution monochromatic channels from satellites, low-spectral imagery (Momeni 2016), and regular Red/Green/Blue (RGB) imagery from low-altitude aircraft or drones.

Even with appropriate image sources, impervious surface detection techniques discussed in literature require significant human-directed pre-processing and fine-tuning of the general technical approach. This heavily discounts the possibility of adapting such methods in a fully automated process.

Land Cover Change

Land cover and change detection techniques (Akay 2016, Li 2016) were found to be lacking in key MnDOT data priorities as well. A primary weakness was a focus on either urban change or rural change, but no research of the applicability of change detection over all land use types (Akay 2016, Li 2016, Momeni 2016, Yang 2016). The urban focus is especially acute when discussing surface classification. Since an urban environment is a heterogeneous mixture of surface types at the typical satellite resolution, much effort is required to separate mixtures of surface types prior to performing any classification (Momeni 2016, Yang 2016). MnDOT's needs do not include detailed surface classification and, as such, the general methods discussed by the literature are not directly applicable. Nearly all the literature reviewed, used either a decision tree classifier or clustering method to produce a single surface classification per image pixel and further analysis was then performed on the segmented images, even when a pixel-based approach is suboptimal when used in conjunction with Very High Resolution (VHR) imagery

(Momeni 2016).

This issue of specialized rural vs urban methodologies extends to the specific research of road detection where the authors assume the use of satellite data for road detection only for remote, rural areas. Research in this area also showed the same issues with data acquisition schedules (Akay 2016, Li 2016) and use of data from old or decommissioned satellites (Akay 2016; SPOT 5).

In some cases, the goal of the research was not to directly estimate change detection on a localized basis, but only to validate the statistical land use characteristics over large areas against ground-truth land use maps (Akay 2016, Momeni 2016). Such research did not yield appropriate methodologies to meet MnDOT's needs.

One technique discussed with partial applicability to MnDOT, is the use of auxiliary data to guide the classification and segmentation of images (Akay 2016). This technique is feasible using the Minnesota county NG9-1-1 road data to extract more accurate spectral profiles of the road corridors from the satellite imagery. However, since the NG9-1-1 data already contains attribute data of interest to MnDOT and would be acting as the primary source of data for MnDOT's needs, this approach is likely to be useful only for future data extraction and estimation projects.

LiDAR Approaches

The works of Sherba (2014) and Karila (2017) provide an alternative approach to road detection that utilizes LiDAR data rather than imagery. This application is quite specialized, as they attempt to detect abandoned logging roads (deeply rural data) with heavy canopy cover. While this is not an analogous situation for most roads in rural or urban settings, it does have some applicability to detecting minimum maintenance roads or older city and county roads with encroaching canopy cover to create better estimates of road width.

Like aerial imagery, LiDAR-based road detection suffers from false positives where water surfaces and water features, such as streams, were incorrectly classified as roads. However, since LiDAR only presents ranging data, the use of techniques like NDWI are not applicable unless MnDOT utilizes a data fusion approach by combining LiDAR data with aerial imagery. Lighting changes and shadows present analysis challenges, as well.

Even with extensive hand-tuning of the segmentation and path-growing techniques used, the LiDAR-derived roads network only achieves approximately 86% accuracy (Sherba 2014). Sherba (2014) dealt with a challenging environment due to very sparse detections points of the roads and a high false-positive detections rate. However, other image segmentation and classification techniques achieved better, but not completely accurate, detection rates (Yang 2016) than on well-imaged roads, not obscured completely by canopy cover. The most recent progress in this area by Karila (2017), utilized a multispectral laser ranging system. This technology has the potential to combine the spectral advantages of satellite imaging with the resolution and depth detection of LiDAR, albeit over a much smaller area of interest. In fact, the limited field of cover for LiDAR makes this infeasible as an annual data gathering process for an area as large as Minnesota.

The two-class results (Road vs Other) achieved an accuracy of greater than 94% and some success was made in the detection of single lane vs two lane roads (approximately 85%). These modest overall accuracy scores, even for such high resolution (eight samples per square meter) data demonstrates the overall difficulty of the road classification problem and strongly implies analysis methods based on satellite imagery would only be able to achieve comparable performance.

Satellite Sources

ASTER

Specifications

The satellite imagery is 15-meter multispectral resolution. The satellite was launched in 1999.

Suitability

The resolution quality is not suitable for change detection analysis.

CARTOSAT

Specifications

The satellite imagery is two-meter Panchromatic resolution only. The satellite was launched in 2005.

Suitability

The resolution quality is not suitable for change detection analysis.

CBERS-2

Specifications

The satellite imagery is two-meter multispectral resolution only panchromatic. The satellite was launched in 2005.

Suitability

The satellite only receives panchromatic band data, and is not suitable for change detection analysis.

Dove

Specifications

The satellite imagery is 3-meter multispectral resolution with a 1- to3-year orbital life. The satellite is part of an 88-fleet of nanosatellites, launched most recently in February 2017.

Suitability

The resolution quality is not suitable for change detection analysis.

FORMOSAT-2

Specifications

The satellite imagery is eight-meter multispectral resolution.

Suitability

The satellite was decommissioned in 2004.

Gaofen-2

Specifications

The satellite imagery is 3.2-meter multispectral resolution. The satellite was launched in 2014.

Suitability

The resolution quality is not suitable for change detection analysis.

GeoEeye-1

Specifications

The satellite imagery is 1.84-meter multispectral resolution. The satellite, launched in 2008, has an orbital life that will end in 2023.

Suitability

The resolution quality is not suitable for change detection analysis.

IKONOS

Specifications

The satellite imagery is 3.2-meter multispectral resolution.

Suitability

The satellite was decommissioned in 2015.

KOMPSAT-3

Specifications

The satellite imagery is 2.8-meter multispectral resolution.

Suitability

The resolution quality is not suitable for change detection analysis.

KOMPSAT-3A

Specifications

The satellite imagery is 2.2-meter multispectral resolution. The satellite was launched 2015.

Suitability

The resolution quality is not suitable for change detection analysis.

LANDSAT 7 ETM+

Specifications

The satellite imagery is 15-meter multispectral resolution. The satellite was launched in 1999.

Suitability

The resolution quality is not suitable for change detection analysis.

LANDSAT 8

Specifications

The satellite imagery is 15-meter multispectral resolution launched in 2013 with an orbital life until 2023.

Suitability

The resolution quality is not suitable for change detection analysis.

Pleiades-1A

Specifications

The satellite imagery is two-meter multispectral resolution.

Suitability

The resolution quality is not suitable for change detection analysis.

Pleiades-1B

Specifications

The satellite imagery is two-meter multispectral resolution.

Suitability

The resolution quality is not suitable for change detection analysis.

QuickBird

Specifications

The satellite imagery is 0.65-meter resolution.

Suitability

The satellite was decommissioned in 2014.

RapidEye

Specifications

The satellite imagery is 6.5-meter multispectral resolution. The satellite was launched in 2008.

Suitability

The resolution quality is not suitable for change detection analysis.

Sentinel-2A

Specifications

The satellite imagery is 10-meter multispectral resolution. The satellite was launched 2015.

Suitability

The resolution quality is not suitable for change detection analysis.

Sentinel-2B

Specifications

The satellite imagery is 10-meter multispectral resolution. The satellite was launched in 2016.

Suitability

The resolution quality is not suitable for change detection analysis.

SkySat-1

Specifications

The satellite imagery is two-meter multispectral resolution. The satellite was launched in 2013.

Suitability

The resolution quality is not suitable for change detection analysis.

SkySat-2

Specifications

The satellite imagery is two-meter multispectral resolution.

Suitability

The resolution quality is not suitable for change detection analysis.

SPOT-5

Specifications

The satellite imagery is 10-meter multispectral resolution.

Suitability

The satellite was decommissioned in 2015.

SPOT-6

Specifications

The satellite imagery is six-meter multispectral resolution. The satellite was launched in 2012.

Suitability

The resolution quality is not suitable for change detection analysis.

SPOT-7

Specifications

The satellite imagery is six-meter multispectral resolution. The satellite was launched in 2014.

Suitability

The resolution quality is not suitable for change detection analysis.

TerraSAR-X

Specifications

The satellite produces X- band and 2-D SAR data. The satellite was launched in 2007.

Suitability

The data is not suitable for change detection analysis.

TH-01

Specifications

The satellite imagery is 10-meter multispectral resolution.

Suitability

The satellite was decommissioned in 2015.

TripleSat

Specifications

The satellite imagery is 3.2-meter multispectral resolution.

Suitability

The resolution quality is not suitable for change detection analysis.

WorldView-1

Specifications

The satellite imagery is 0.5-meter Panchromatic only.

Suitability

This type of data is not suitable for change detection analysis.

WorldView-2

Specifications

The satellite imagery is 1.84-meter multispectral resolution. The satellite was launched 2009.

Suitability

The resolution quality is not suitable for change detection analysis.

WorldView-3

Specifications

The satellite imagery is 1.24-meter multispectral resolution. The satellite was launched in 2014 with an orbital life of 10-12 years.

Suitability

The resolution quality is not suitable for change detection analysis.

WorldView-4

Specifications

The satellite imagery is 0.34-meter multispectral resolution. The satellite was launched in 2016 with an expected orbital life of 10-12 years.

Suitability

The resolution quality is suitable for change detection analysis. The satellite is a new satellite but not a low-cost option.

Software

A wide variety of GIS tools and specialized image analysis tools exist for free or low-cost. However, in the context of this project's needs, no software tool provided the specific ability to perform change detection comparison or automatically extract roads from image data of the quality available from the low-cost sources identified above. Software, such as ENVI, provide general capabilities that allow experts to develop specialized and research-level tools that can perform the road detection task with varying levels of accuracy and specificity.

The general conclusion is that it would not be cost-effective to employ a general software tool to the problem as MnDOT would be required to hire or train staff with the requisite skills in image analysis, machine vision and machine learning, which would allow the development of a tool in-house, the application, or other research to the specific problem at hand.

Free

There are several free software's and toolboxes available for extraction and object-based analysis. Information about these tool boxes is not published, and accuracy and efficiency is unknown. See Appendix A for specifications on each software. Below is a list of researched free software and toolboxes.

- QGIS Semi-Automatic Classification Plugin: The Sentinel Toolbox
- GRASS: Geographic Resources Analysis Support System
- SAGA GIS: System for Automated Geoscientific Analyses
- ORFEO Toolbox (OTB): Optical and Radar Federated Earth Observation
- PolSARPro: Polarimetric SAR Data Processing and Educational Tool aims to facilitate the accessibility and exploitation of multi-polarized SAR datasets.
- Opticks: Opticks is an expandable remote sensing and imagery analysis software platform that is free and open source. Opticks was developed by Ball Aerospace & Technologies Corp. and other organizations for the United States Intelligence Community.
- OSSIM: Open Source Software Image Map
- InterImage: Open source remote sensing software for automatic image interpretation
- ILWIS: Integrated Land and Water Information System
- gvSIG: Open source GIS (Spanish) with remote sensing analysis capabilities.
- Whitebox GAT: Whitebox Geospatial Analysis Tools is an open-source desktop GIS and remote sensing software package for general applications of geospatial analysis and data visualization.
- E-foto: The goal of the Project E-foto photogrammetric kit is to provide the full implementation of a digital photogrammetric workstation as free, open sourced software.

Paid

These software tools, utilized in the publication of emerging research, are heavily documented to be efficient and accurate; however, none contains out-of-the-box tools that can perform a classification or extraction of road features from imagery directly. Expert-level specialists are required to build custom tools that utilize the foundational capabilities of these software components for each specific task. It is not feasible for MnDOT to build such tools in-house assuming a general GIS technician or analyst skills set.

ESRI Spatial Analyst: Segment Mean Shift tool

Software cost is \$2,500 per single user.

ERDAS IMAGINE

Software cost is \$7,500 per single license user.

Trimble eCOGNITION

Software cost to a Trimble developer is \$20,880.

Software cost is \$8,370 per single license user.

Technologies

A deep history of extracting surface features and road features, specifically, is available from the image research community spanning back several decades. However, to date, there is no canonical imagery source that can produce data at high enough spectral and spatial resolutions to unambiguously detect roads with sufficient accuracy so that an automated process can be developed. For example, it is very difficult to discriminate between gravel roads, compacted soils or ruts in agricultural land.

Since there is no canonical source of imagery, there is also no single, agreed best practice or technique for extracting road networks from the underlying imagery other than basic data processing methods. These include using the normalized differences between spectral bands, rather than raw spectral values to reduce the influence of detection bias and transient artifacts in the data (Momeni 2016). No tool exists in an out-of-the-box form that can be used by non-specialists. Rather, each individual or institution has tended to develop their own best practices and techniques by applying different machine vision and machine learning techniques to one or more data sets that are readily available. Replicating each published result would require specialist resources that MnDOT neither has nor has likely interest in acquiring since there is no guarantee that a bespoke system meets MnDOT's business needs.

The most notable and applicable technology that was uncovered during this project's research phase, is the existence of a Digital Globe partner, Public Sector Mapping Agencies (PSMA), that are automatically extracting a country-wide road network with automated width determination from high-resolution Digital Globe data on an annual basis with greater than one meter accuracy. However, the scope of that project was in the millions of dollars and a project of comparable cost requires MnDOT to be interested in dedicating sufficient resources toward a new effort, and certain desired MnDOT attributes, such as pavement type, were not within the scope of the Australia project.

Appendix A: Low Cost Aerial and Spatial Data Specifications Spreadsheet

Attached pdf of the Low Cost Aerial and Spatial Data Specifications Spreadsheet

Specification Color	Specification Description
Light red/pink	Decommissioned Satellites
Light yellow	Satellites with operational lifetime expiring within 5 years
Blue	Various imagery companies
Green	Road data
Grey	Miscellaneous categories

References

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Acquisitio

Data source	Satellite	Resolution	Bands	n Schedule	Price	Data Format	Operational Life	Comment	PDF
					\$7,500 for web service of				https://content.satimagingcorp.com.s3.
					_	» MyDigitalGlobe » OGC Standards			amazonaws.com/static/satellite-sensor-
Digital Cloba	WorldView-4	E0 90cm				» Esri - ImageConnect » Google Earth - EarthService			specification/WorldView-3-PDF-
Digital Globe	worldview-4	50-800111		Annual	of annual imagery	Earth - EarthService			<u>Download.pdf</u>
	WorldView-3	50-80cm			_	» MyDigitalGlobe » OGC Standards» Esri - ImageConnect » GoogleEarth - EarthService			http://content.satimagingcorp.com.s3.a mazonaws.com/media/pdf/WorldView- 3-PDF-Download.pdf
	WorldView-2	50-80cm			_	» MyDigitalGlobe » OGC Standards» Esri - ImageConnect » GoogleEarth - EarthService			https://dg-cms-uploads- production.s3.amazonaws.com/uploads /document/file/21/Standard_Imagery_D S_10-7-16.pdf
	WorldView-1	50-80cm			_	» MyDigitalGlobe » OGC Standards» Esri - ImageConnect » GoogleEarth - EarthService			https://content.satimagingcorp.com.s3. amazonaws.com/static/satellite-sensor- specification/WorldView-1-PDF- Download.pdf
	GeoEye-1	50-80cm			_	» MyDigitalGlobe » OGC Standards» Esri - ImageConnect » GoogleEarth - EarthService			https://dg-cms-uploads- production.s3.amazonaws.com/uploads /document/file/21/Standard_Imagery_D S_10-7-16.pdf
Satellite Imagery Cooperation	WorldView-4	0.31 m P, M 0.34-1.0 m	near-IR1	>4.5 access/day	\$6,800		2016; 10-12 years	SIC reseller of	https://content.satimagingcorp.com.s3. amazonaws.com/static/satellite-sensor- specification/WorldView-4-Satellite- Specifications
	WorldView-3	0.31-0.34 m P, M 1.24- 1.38	P, B, R, G,NIR, Red edge, coastal, yellow, near-IR1	4.5 days	\$6,800		2014; 10-12 years		http://content.satimagingcorp.com.s3.a mazonaws.com/media/pdf/WorldView- 3-PDF-Download.pdf
	WorldView-2	1.84 m	P, B, R, G,NIR, Red edge, coastal, yellow, near-IR1	1-4 days	\$6,800		Launched 2009; 7.25 year mission life		https://content.satimagingcorp.com.s3. amazonaws.com/static/satellite-sensor- specification/WorldView-2-PDF- Download.pdf

WorldView-1	0.5 meters	Panchrom atic	2 days	Call for quote	Launched 2007;	i	https://content.satimagingcorp.com.s3. amazonaws.com/static/satellite-sensor- specification/WorldView-1-PDF- Download.pdf
GeoEye-1	0.46 m B&W 1.84 m multi		10 days	Call for quote	Launched 2008; Fully redundant 7+ year design life; fuel for 15 years	Agriculture, forests, land-use change, land-cover change. Mapping biophysical variables such as leaf chlorophyll content, leaf water content, leaf area index; monitoring coastal and inland waters; risk and disaster mapping	https://content.satimagingcorp.com.s3. amazonaws.com/static/satellite-sensor- specification/GeoEye-1-PDF- Download.pdf
Pleiades-1A	50 cm B&W 2 m multispectra I			Call for quote			http://www.intelligence- airbusds.com/files/pmedia/public/r61_9 _geo_011_pleiades_en_low.pdf
Pleiades-1B	51 cm B&W 2 m multispectra	P, B, G, R,	daily	Call for quote	Launched 2012	1	http://www.intelligence- airbusds.com/files/pmedia/public/r61_9 _geo_011_pleiades_en_low.pdf
KOMPSAT- 3A	Multi 2.2 m ,	P, Ms1 (Blue), MS2 (Green), MS3 (Red), MS4 (NIR),		Call for quote	Launched 2015;	The major goal of the KOMPSAT-3A program is to develop an earth observation satellite to obtain IR (Infrared) and high resolution EO (Electro-Optical) images for a variety of applications such as Geographical Information Systems (GIS), and environmental, agricultural and oceanographic monitoring as well as urban planning, resource management and disaster relief. KOMPSAT-3A will provide panchromatic resolution of 0.55m and multispectral resolution of 2.20m and also has an infrared sensor at 5.5m	N/A
KOMPSAT-3	0.7 m P, 2.8	P, Ms1 (Blue), MS2 (Green), MS3 (Red), MS4 (NIR), MWIR		Call for quote			N/A
QuickBird	0.65 m			Call for quote	decommisioned; 2014		http://content.satimagingcorp.com.s3.a mazonaws.com/media/pdf/QuickBird- PDF-Download.pdf

	<u></u>		T		_	I	1		
			P, Ms1						
			(Blue),						
			MS2						
			(Green),						
			MS3						
			(Red),						
			MS4						
		0.8 m P, 3.2	(NIR),						
	Gaofen-2	m MS	MWIR	5 days	Call for quote		launched 2014		N/A
				,	·		Launched 2015;		,
							Expected Mission		
							Life: at least 7		
							years for each of		
		0.8 m P, 3.2					three identical		
	TripleSat	m MS	NIR		Call for quote		satellites		N/A
			DECOMISS	DECOMISSI					https://content.satimagingcorp.com.s3.
		DECOMISSI	IONED	ONED			decommisioned		amazonaws.com/static/satellite-sensor-
	IKONOS	ONED 2015	2015	2015	Call for quote		:1999		specification/IKONOS-PDF-Download.pdf
					Carrier quie ce			SkySat-1 is a high performance satellite producing sub-meter	https://www.planet.com/products/satel
								resolution imagery and high-definition video and is the smallest	lite-
		0.0 0. 2						<i>,</i> , , , , , , , , , , , , , , , , , ,	
-1		0.9 m P, 2 m						satellite ever flown that is capable of capturing imagery at better	imagery/files/Planet Imagery Product
PlanetScope	SkySat-1	MS	NIR		Call for quote		launchd; 2013	than 1 meter resolution.	<u>Specs.pdf</u>
									https://www.planet.com/products/satel
									lite-
		0.8 m P, 1.1	P, B, G, R,						imagery/files/Planet_Imagery_Product_
PlanetScope	SkySat-2	m MS	NIR		Call for quote				Specs.pdf
					·			TerraSAR-X Staring Spotlight mode provides the highest spatial	
								resolution presently available on a commercial spaceborne SAR	
								system. The TerraSAR-X Staring Spotlight mode provides a means	
			V Dond						
			X-Band					to assess man-made objects more precisely. Image measurements	
			and 2-D					of size, shape and positions are more accurate, target	
	TerraSAR -X		SAR	11 days	Call for quote		,	interpretation is more reliable.	N/A
								SPOT-6 is an optical imaging satellite capable of imaging the Earth	
								with a resolution of 1.5 meter panchromatic and 6 meter	
								multispectral (blue, green, red, near-IR) and will offer imaging	
								products to customers in defense, agriculture, deforestation,	http://www.intelligence-
		1.5 m P, 6 m	PRGR				launched 2012;	environmental monitoring, coastal surveillance, engineering, oil,	airbusds.com/files/pmedia/public/r2928
	SPOT-6	MS	NIR	daily	Call for quote		10 years	gas and mining industries.	9 int 012 spot6-7 en low-2.pdf
	31 01-0	1413	IVIII	daliy	call for quote		TO years	Bas and mining maustries.	http://www.intelligence-
		1 5 0 6							•
	SDOT -	1.5 m P, 6 m		[0.11.6				airbusds.com/files/pmedia/public/r2928
	SPOT-7	MS	NIR		Call for quote		launched 2014;		_9_int_012_spot6-7_en_low-2.pdf
Other Satellites					Call for quote				
									http://www.intelligence-
	FORMOSAT-	DECOMISSI	DECOMISS	DECOMISSI			DECOMISSIONED		airbusds.com/files/pmedia/public/r2929
	2	ONED 2004	IONED	ONED	Call for quote		2004		_9_formosat2_product_sheet_en.pdf
					·				

							supports applications for 3D terrain mapping and production of	
1		DECOMISSI	DECOMISS	DECOMISSI		DECOMISSIONED	10m DSM/DEM and DTM elevation models and contours to	
!	TH-01	ONED		ONED	Call for quote			N/A
	111 01			DECOMISSI	cui for quote	DECOMISSIONED	support engineering, surveying and mapping projects.	http://global.jaxa.jp/activity/pr/brochur
!	ALOS		IONED	ONED	Call for quote	2011		e/files/sat01.pdf
					·		The data from CARTOSAT-1 is expected to provide enhanced inputs	
							for large scale mapping applications and stimulate newer	
							applications in the urban and rural development, land and water	
							resources management, disaster assessment, land cover change	
							detection, relief planning and management, environmental impact	
			Black and			Launched 2005;	assessment and various other Geographical Information Systems	
	CARTOSAT	2.m P	white	5 days	Call for quote	n/a	(GIS) applications	N/A
					•			http://www.intelligence-
1		DECOMISSI	DECOMISS	DECOMISSI				airbusds.com/files/pmedia/public/r233_
	SPOT-5	ONED 2015	IONED	ONED	Call for quote	DECOMISSIONED		9_geo_0013_spot_en_low.pdf
							SPOT-6 is an optical imaging satellite capable of imaging the Earth	
							with a resolution of 1.5 meter panchromatic and 6 meter	
							multispectral (blue, green, red, near-IR) and will offer imaging	
							products to customers in defense, agriculture, deforestation,	http://www.intelligence-
		1.5m P,	P, B, G, R,			launched 2012;	environmental monitoring, coastal surveillance, engineering, oil,	airbusds.com/files/pmedia/public/r2928
1	SPOT-6	6.0m MS	NIR	daily	Call for quote	10 years	gas and mining industries.	_9_int_012_spot6-7_en_low-2.pdf
							SPOT-6 and SPOT-7 are the de facto solution to cover wide areas in	http://www.intelligence-
1		1.5m P,	P, B, G, R,			lanched 2014; 10	record time, making national maps regular updating as well as	airbusds.com/files/pmedia/public/r2928
	SPOT-7	6.0m MS	NIR	daily	Call for quote	years	thematic map creation possible.	_9_int_012_spot6-7_en_low-2.pdf
							Dove satellite constellation holds the world record of the most	
							satellites launched at once from one rocket and will collect imagery	
							up to 2 million km² per day. The Dove satellite constellation is a	
							fleet of nanosatellites deployed from the International Space	
							Station to take images of Earth. The satellite constellation is	
							operated by Planet Labs Inc., 88 nanosatellites called Doves	
							weighing only 11 pounds each, provides 3 meter multispectral	
							image resolution for a variety of mapping applications including	
							several humanitarian and environmental applications, from	
							monitoring deforestation and urbanization to improving natural	
1							disaster relief and agricultural yields around the world. The	
			P, B, G, R,				constellation revisits more frequently than any existing	
	Dove	3 m MS	NIR		Call for quote	1-3 years	government or commercial satellites.	N/A
1		6.5 m						https://www.planet.com/products/satel
'			B, G, R,				providers of satellite based geospatial information in their unique	lite-
		Orthorectifi				launched 2008; 7	ability to acquire high resolution, large-area image data on a daily	imagery/files/Planet_Imagery_Product_
	RapidEye	ed 5 m	NIR	5.5 days	Call for quote	years	basis.	Specs.pdf
,						launched 2015;		
,							Agriculture, forests, land-use change, land-cover change. Mapping	
'			13			7+ year design	biophysical variables such as leaf chlorophyll content, leaf water	https://sentinels.copernicus.eu/docume
,			spectral			life; fuel for 15	content, leaf area index; monitoring coastal and inland waters; risk	nts/247904/685211/Sentinel-2-Product-
	Sentinel-2A		bands	5 days	Call for quote	years	and disaster mapping	Specifications-Document

	T				1	1	T	T	
							launched 2016;		
							Fully redundant		
			13				7+ year design		https://sentinels.copernicus.eu/docume
			spectral				life; fuel for 15		nts/247904/685211/Sentinel-2-Product-
	Sentinel-2B	10 m	bands	5 days	Call for quote		years		Specifications-Document
			Coastal,						
			Blue,					The images can be used to map anthropogenic and natural changes	
			Green,					on the Earth over periods of several months to two decades. The	
			Red, NIR,					types of changes that can be identified include agricultural	
			SWIR 1,					development, deforestation, desertification, natural disasters,	
	LANDSAT 7		SWIR 2,					mineral exploration and classification, urbanization, and the	http://www.pancroma.com/downloads/
	ETM+	15 m	Pan	16 days	Call for quote		launched 1999;	development and degradation of water resources.	Landsat7_Handbook.pdf
			Coastal,		·				_ '
			Blue,						
			Green,						
			Red, NIR,						
			SWIR 1,						
			SWIR 2,			GeoTIFF data format			
			Pan,				launched 2013;		
							Fully redundant 5		
			Cirrus,				year design life;		https://pubs.usgs.gov/fs/2012/2060/pdf
	LANDCATO	15 m	TIRS 1,		Call for gueto				https://pubs.usgs.gov/fs/2013/3060/pdf
	LANDSAT 8	15 M	TIRS 2		Call for quote		fuel for 10 years		/fs2013-3060.pdf
			1-3 bands	·					
			VNIR, 4-9						
			bands						
			SWIR, 10-						https://asterweb.jpl.nasa.gov/content/0
			14 bands						3_data/04_Documents/aster_user_guid
	ASTER	15 m	TIR	16 days	Call for quote		launched 1999;		e_v2.pdf
								Large scale mosaics, Vegetation indexes and land cover and change	
								detection for monitoring purposes, Monitoring	
								of agricultural harvests, canopy assessment, tree grading,	
							launched 2001; 2	deforestation, forestry, wildfires/forest fires, and infestation, Joint	https://calval.cr.usgs.gov/documents/CB
	CBERS-2	20 m			Call for quote		years	operation with other world data	ERS2.pdf
									https://go.nearmap.com/hubfs/pdf/dat
									a_sheets/Product-
									Datasheet_Vertical.pdf?hsCtaTracking=6
			RGB						61fa67c-c76c-4783-82da-
	NearMap		Natural						5890ddd530fd%7C195fa621-2bb7-4092-
Nearmap	Vertical	75cm	Color		Call for quote				b07b-12a647e3223a
									http://www.intelligence-
			RGB						airbusds.com/files/pmedia/public/r4160
Airbus Defence &			Natural	Less than 2	2				7 9 oneatlas 6pp a5 fold brochure u
Space	ONE View	1.5 m MS	Color	years	Call for quote				k v1.pdf
•		1	-	1	4		1		http://www.intelligence-
			RGB						airbusds.com/files/pmedia/public/r4160
			Natural	Less than					7 9 oneatlas 6pp a5 fold brochure u
	ONE Live	1.5 m MS	Color	one year	Call for quote				k v1.pdf
	TOTAL LIVE	11.5 111 1015	100101	Torre year	Tour quote		1	<u> </u>	<u></u>

							The Polar Geospatial Center receives multiple satellite imagery	
							from Digital Globe, but is not allowed to use the imagery in a	
Polar Geospatial							manner that would compete with other commercial imagery	
Center - University	Multiple						providers. The imagery can only be used in connection with federal	
of Minnesota	satellites						contracted work.	
			Multii-					
			spectral			» MyDigitalGlobe » OGC Standards		
	Relationship		and			» Esri - ImageConnect » Google	Currently, the agricultural areas of Minnesota have been acquired.	
SatShot.com	with AirBus	1 m	infrared	Annual	\$1-2 MM for entire state	_	Additional acquisition would be needed.	
							·	
Data Download								
Sites								
USGS Earth								
Explorer	NAIP	0.6 m	CNIR	9/11/2016	Free			
		1m P, 4 m						
	Orbview-3	MS		3 days	Free			
				2015 in				
Google Earth	Multiple	Multiple		Minnesota	Free			
NOAA Data access		Coastal						
Viewer	NAIP	areas only			Free			
	ALOS World							
JAXA's Global	3D	30m			Free			
Earth Observation								
Link ESA's EO								
Catalogue					Free			
						_		
Road Data								
						Esri Shapefile, MapInfo TAB,		
						Oracle ODF and can dicuss		
NavMart					\$4,000	format type		
				you can				
TeleMart				specify	Called for quote	You can specify		

Software/toolboxes	Price	Comments	Esri Compatible	Pdf
		Sentinel-2 has become the gold standard for open satellite data. In order to process		
		the vast amounts of data collected by Sentinel-2A/2B, users can use the Sentinel		
		Toolbox. One of the highlights of the Sen2cor plugin which allows users to correct	\/FC	
		for atmospheric effects and classify images. If you download Sentinel-1 synthetic	YES	
The Sentinel		aperture radar data, you can process your data with the Sentinel-1 toolbox. For		https://sentinel.esa.int/web/sentinel/toolboxe
Toolbox	Free	example, you can perform interferometry, speckle filtering and coregistration.		s
		In terms of remote sensing plugins, the semi-automatic classification plugin offers		
QGIS Semi-		the most practical solution for optical images. Because you can download Sentinel,		
automatic		Landsat, ASTER and MODIS imagery directly using the plugin, this feature makes the	NO	
Classification Plugin		plugin most convenient for is supervised image classification. Furthermore, it also	INO	
Classification Plugifi		provides tools to its pre- and post-processing of imagery. No wonder why it's in the		https://plugins.qgis.org/plugins/SemiAutomati
	Free	top 5 downloaded plugins for QGIS.		cClassificationPlugin/
		It offers image classification, PCA, edge detection, radiometric corrections, 3D,		
GRASS: Geographic		geostatistics analysis and filtering options. Another key feature of GRASS is the	NO	
Resources Analysis		LiDAR processing and analysis. You can filter LiDAR points, create contours and	INO	
Support System	Free	generate DEMs. Next time you see a LAS file, see what GRASS can do with it.		http://grass.osgeo.org/
		SAGA GIS is ideal for most remote sensing needs because of its rich library grid,		
		imagery and terrain processing modules. In terms of classification, it has your basic		
		supervised but it's not as intuitive and user-friendly as other remote sensing		
SAGA GIS: System		software. For analyses and manipulation, it flourishes with terrain tools like TPI, TWI	NO	
for Automated		and soil classification. It also has some rudimentary tools for photogrammetry and		
Geoscientific		support vector machine (SVM). Although it has a vast library of raster-based tools,		
Analyses	Free	the only downfall of SAGA GIS is the lack of documentation for some of them.		http://www.saga-gis.org/en/index.html
		The ORFEO toolbox was a cooperative project developed by France and Italy		
		primarily built on the shoulders of the open source community. This image		
		processing library specifically aims at high spatial resolution data. ORFEO provides a		
		wide range of remote sensing functions including radiometry, PCA, change	NO	
ORFEO Toolbox		detection, pan sharpening, image segmentation, classification and filtering. One		
(OTB): Optical and		really interesting aspect of this software is the capability to do Large-Scale Mean-		
Radar Federated		Shift segmentation (LSMC). This type of object based image analysis is a rare feature		
Earth Observation	Free	seen in software nowadays.		https://www.orfeo-toolbox.org/
		For synthetic aperture radar, you may want to look into PolSARPro. This software		
		can handle dual and full polarization SAR from ENVISAT-ASAR, ALOS-PALSAR,		
		RADARSAT-2 and TerraSAR-X. There's a wide range of tools like importing,		
		conversion, filtering, decompositions, inSAR processing and calibration. Another		
		neat part of this software is the graph processing framework where users can	NO	
		automate workflow. This functionality is similar to ArcGIS model builder and easy to		
		set up. Overall, PolSARPro is a very sophisticated piece of open source remote		
		sensing software. You need to take a look at PolSARPro if you're working with full or		
PolSARPro	Free	dual polarization SAR data.		https://earth.esa.int/web/polsarpro
		The neat part about Opticks software is the long list of extensions you can add.		
		There are plugins for raster math, radar processing and hyper/multispectral. Before		
		downloading an extension, make sure to check the compatibility. Actually, you		
		might have to scale back your Opticks version in order for the extension to work		
Opticks	Free	properly	YES	http://opticks.org/

			T	
		Not only has it been actively developed for almost two decades but interesting		
İ		enough, it's being funded through US departments such as in intelligence and		
		defense. OSSIM is a high performance open source remote sensing software		
		application. Some of the key features is compatibility with more than 100 raster and	NO	
		vector formats and over 4000 different projections and datums. It supports a long	INO	
		list of sensors but some may require additional plug-ins. If you need some remote		
OSSIM: Open Source		sensing direction for high spatial resolution imagery, OSSIM might be the answer		
Software Image Map	Free	you have been searching for.		http://trac.osgeo.org/ossim/
		InterImage is a bit different from the other open source remote sensing software on		
		this list. It specializes in automatic image interpretation, which is pretty neat. The		
		core theme of automatic image interpretation is object-based image analysis (OBIA).		
		This involves segmentation, exploring their spectral, geometric and spatial	NO	
		properties and then classification. Although InterImage was developed in Brazil,		http://www.lvc.ele.puc-
InterImage	Free	documentation is available in English.		rio.br/projects/interimage/
		For more than 25 years, ILWIS has been used from GIS enthusiasts. Actually, since its		
		first release it has over 27,000 downloads. But it wasn't until recently that it has		
		become available for public use. It is equipped with stereoscopy and anaglyph tools		
		to create stereo pairs from two aerial photographs. Alternatively, if you have	NO	
ILWIS: Integrated		satellite data, ILWIS has image classification techniques to create land cover classes.		
Land and Water		ILWIS was originally built for researchers and students. For this reason, effort was		
Information System	Free	concentrated on developing a user-friendly environment.		http://52north.org/communities/ilwis
,		gvSIG is known for its wide variety of rich features. And this applies to its remote		3, ,
		sensing capabilities too. For example, users can perform supervised classification,		
		band algebra and decision trees. On top of that, gvSIG software delivers a more		
		diverse range of tools like Tassled Cap which is ideal for monitoring vegetation	NO	
		health/vigor and urban growth. Further to this, the vegetation indices toolbar		
gvSIG	Free	analyzes chlorophyll and plant health, if you have multispectral data.		http://www.gvsig.com/en
5.0.0		There's a hydrology theme that surrounds Whitebox GAT because it actually		integrif www.grosig.com/ en
		replaced Terrain Analysis System (TAS) – an Esri tool for hydro-geomorphic		
		applications. Where it shines is LIDAR! It's like the swiss-army knife of LiDAR data	YES	
		with even a tool that can convert it to shape file. Although the cartographic tools are		http://www.uoguelph.ca/~hydrogeo/Whitebo
Whitebox GAT	Free	bare, overall Whitebox GAT has a solid 410 tools for all your GIS needs.		y/
WIIICOOX GAT	Tree	E-foto is the digital photogrammetry specialist in the group of open source remote		<u>~</u>
		sensing software. The core functionality is photo triangulation, stereoscopic		
		modeling, digital elevation model extraction and terrain correction. This software		
		provides a fully functional photogrammetry tool set to use at no cost. E-foto has	NO	
Í		loads of tutorials and examples to get you well on your way to being a		
E-foto	Free	photogrammetry expert.		http://www.efoto.eng.uerj.br/en
ESRI Spatial Analyst:		риотовланинен у схрете.		incep.//www.croto.crig.derj.bi/eii
Segment Mean Shift				
•	\$2500 per single license		YES	
	\$7500 single license user, \$1380 renewal		112	
Trimble	Suppositing incerise riser \$1290 terremail			
eCOGNITION	င်သ ၁၀၀			
ECOGINITION	\$20,880			

_				
		Commerical price: \$8370 single license		
		user perpetual use, annual updates not		
		included, \$1260 for maintnance renewal		
	ENVI	(annual) . GSA price: \$7379		

Methodology		
https://www.ncbi.nlm.nih.gov/pmc/articles/PMC3304143/pdf/sensors-12-01846.pdf	Deng et al 2012	ENVI
https://www.int-arch-photogramm-remote-sens-spatial-inf-sci.net/XLI-B8/789/2016/isprs-archives-XLI-B8-789-2016.pdf	Akay and Sertel 2016	eCognition
http://www.ugpti.org/smartse/research/citations/downloads/Sugumaran-Remote_Sensing_of_Impervious_Surfaces-2007.pdf	Sugumaran-Remote_Sensing_of_Impervious_Surfaces-2007	N/A
http://www.mdpi.com/2072-4292/8/2/88/htm	Momeni et al 2016	eCognition
http://www.sciencedirect.com.ezproxy.library.und.edu/science/article/pii/S0303243416301635	Yang and He 2017	ENVI
http://www.sciencedirect.com.ezproxy.library.und.edu/science/article/pii/S0169204616000426	Zhang et al. 2016	N/A
http://www.mdpi.com/2072-4292/8/3/265/html	Li et al 2016	N/A
http://mdpi.com/1424-8220/8/3/1613/htm	Zhou et al. 2008	eCognition
http://www.mdpi.com/2072-4292/6/5/4043	Sherba et al. 2014	ArcGIS and eCognition
http://ieeexplore.ieee.org/abstract/document/7829363/?reload=true	Karila et al. 2017	eCognition and MATLAB

	2014	<u> </u>
County Data	Roads	http://www.dot.state.mn.us/maps/gdma/gis-data.html
Aitkin	Yes	https://www.co.aitkin.mn.us/departments/GIS/GIS-home.html
Anoka	Yes	https://www.anokacounty.us/1990/Data-Downloads
Becker	Yes	
Beltrami	Yes	http://www.co.becker.mn.us/online_services/GIS_data.aspx
Benton		http://www.co.beltrami.mn.us/Departments/GIS/GIS.html
	Yes	https://www.co.benton.mn.us/E-Services.php
Big Stone Blue Earth	Yes	http://www.bigstonecounty.org/gis/gis.vbhtml
	Yes	http://www.blueearthcountymn.gov/413/Maps
Brown	Yes	https://www.co.brown.mn.us/gis-a-property-info
Carlton	Yes	http://www.co.carlton.mn.us/gis_mapping
Carver	Yes	http://data-carver.opendata.arcgis.com/datasets?t=Infrastructure
Cass	Yes	http://www.co.cass.mn.us/services/land/maps/
Chippewa	Yes	http://www.co.chippewa.mn.us/maps.htm
Chisago	Yes	http://www.co.chisago.mn.us/428/Maps-Data
Clay	Yes	http://claycountymn.gov/658/GIS-Data
Clearwater	Yes	http://www.co.clearwater.mn.us/index.asp?Type=B_LIST&SEC=%7BC3EA334C-2D16-4252-B563-7908C6E147D2%7D
Cook	Yes	http://cookcountymn.maps.arcgis.com/home/index.html
Cottonwood	Yes	http://www.co.cottonwood.mn.us/county-departments/information-systems/
Crow Wing	Yes	http://crowwing.us/186/GISCounty-Maps
Dakota	Yes	https://gis.co.dakota.mn.us/dcgis/
Dodge	Yes	http://www.co.dodge.mn.us/departments/land_records/gis.php
Douglas	Yes	http://www.co.douglas.mn.us/dc/gis.aspx
Faribault	Yes	https://beacon.schneidercorp.com/Application.aspx?AppID=373&LayerID=8056&PageTypeID=1&PageID=0
Fillmore	Yes	http://www.co.fillmore.mn.us/gis
Freeborn	Yes	https://beacon.schneidercorp.com/Application.aspx?AppID=333&LayerID=3791&PageTypeID=1&PageID=2405
Goodhue	Yes	http://www.co.goodhue.mn.us/342/GIS
Grant	Yes	http://www.co.grant.mn.us/630/GIS-Interative-County-Map
Hennepin	Yes	http://www.hennepin.us/gisopendata
Houston	Yes	http://www.co.houston.mn.us/E911.aspx
Hubbard	Yes	https://getdata-hubbardcounty.opendata.arcgis.com/
Isanti	Yes	https://beacon.schneidercorp.com/Application.aspx?ApplD=511&LayerID=7920&PageTypeID=2&PageID=3860
Itasca	Yes	http://www.co.itasca.mn.us/625/Maps
Jackson	Yes	http://www.co.jackson.mn.us/index.asp?SEC=82513334-8565-41DD-9985-4EB7515E607E&Type=B_BASIC
Kanabec	Yes	http://www.kanabeccounty.org/departments/gis.php
Kandiyohi	Yes	http://gis.co.kandiyohi.mn.us/
Kittson	Yes	http://136.234.13.165/link/jsfe/index.aspx
Koochiching	Yes	http://www.co.koochiching.mn.us/289/Disclaimer
Lac qui Parle	Yes	https://lqpco.com/index.php/gis-mapping/
Lake	Yes	http://www.co.lake.mn.us/departments/information_systems/gis.php
Lake of the woods	Yes	http://oak.co.lake-of-the-woods.mn.us/link/jsfe/index.aspx
Le Seueur	Yes	http://www.co.le-sueur.mn.us/departments/gis/index.php
Lincoln	Yes	http://www.lincolncounty-mn.us/Departments/gis_maps.htm
	_	
Lyon	Yes	http://www.lyonco.org/gis
McLeod	Yes	http://www.co.mcleod.mn.us/gis_(mapping_and_surveying)/gis_data.php
Mahnomen	Yes	http://www.co.mahnomen.mn.us/highway_department.html
Marshall	Yes	http://gismap.co.marshall.mn.us/link/jsfe/index.aspx

Martin	Yes	http://www.co.martin.mn.us/index.php/directions-maps
Meeker	Yes	http://www.co.meeker.mn.us/index.pnp/directions-maps http://www.co.meeker.mn.us/documentcenter/view/2378
Mille Lacs	Yes	
	_	http://www.co.mille-lacs.mn.us/mapping
Morrison Mower	Yes	http://www.co.morrison.mn.us/index.asp?SEC=AD579630-799E-4B92-BA3F-E8412EBD146F&Type=B_BASIC
	Yes	http://www.co.mower.mn.us/GIS.html
Murray	Yes	http://murraycountymn.com/maps/
Nicollet	Yes	http://www.co.nicollet.mn.us/465/County-Maps
Nobles	Yes	http://www.co.nobles.mn.us/departments/it/gis/
Norman	Yes	http://www.co.norman.mn.us/index.asp?SEC=44C7CAA6-A4DC-4F09-B24E-0DE2487B16DD&Type=B_BASIC
Olmsted	Yes	https://webapp.co.olmsted.mn.us/shoppingcart/site/Planning/GIS/DataCatalog/categories.aspx?CTypeid=4
Otter Tail	Yes	http://www.co.otter-tail.mn.us/616/Maps
Pennington	Yes	http://gismap.co.pennington.mn.us/link/jsfe/index.aspx
Pine	Yes	http://www.co.pine.mn.us/index.asp?Type=B_BASIC&SEC=%7BEC1BB4C9-6E8F-4CCA-8C94-37A90DB3EF7F%7D
Pipestone	Yes	http://www.pipestone-county.com/maps.php
Polk	Yes	http://www.co.polk.mn.us/index.asp?SEC=9B803F78-A3E2-4A5E-BF2C-D8A544C4449C
Pope	Yes	http://www.co.pope.mn.us/gis.php
Ramsey	Yes	http://openramsey-ramseygis.opendata.arcgis.com/
Red Lake	Yes	https://www.arcgis.com/home/item.html?id=99beedd681964704b664b41ccc711da0
Redwood	Yes	https://beacon.schneidercorp.com/Application.aspx?AppID=800&LayerID=12803&PageTypeID=1&PageID=0
Renville	Yes	http://www.renvillecountymn.com/about_us/county_maps/gis.php
Rice	Yes	http://www.co.rice.mn.us/152/Geographic-Information-Systems
Rock	Yes	http://rock.houstoneng.com/
Roseau	Yes	http://gis.co.roseau.mn.us/link/jsfe/index.aspx
Scott	Yes	https://www.scottcountymn.gov/1183/GIS-Data-and-Maps
Sherburne	Yes	https://www.co.sherburne.mn.us/publicworks/mapping/gis.php
Sibley	Yes	http://www.co.sibley.mn.us/gis_(geographic_information_system)/index.php
St.louis	Yes	http://www.stlouiscountymn.gov/maps
Stearns	Yes	https://co.stearns.mn.us/PropertyRoads/GISDataforDownload
Steele	Yes	http://www.co.steele.mn.us/divisions/land_use_and_records/gis/index.php
Stevens	Yes	http://www.co.stevens.mn.us/index.aspx?nid=956
Swift	Yes	http://www.swiftcounty.com/records
Todd	Yes	http://www.co.todd.mn.us/departments/gis_mapping_services/gis_mapping
Traverse	Yes	no GIS contact, county website : https://www.co.traverse.mn.us/
Wabasha	Yes	http://www.co.wabasha.mn.us/index.php/departments/gis-department
Wadena	Yes	http://www.co.wadena.mn.us/194/GIS
Waseca	Yes	http://gis.co.waseca.mn.us/jsfe/index.aspx
Washington	Yes	https://www.co.washington.mn.us/92/County-Maps
Watonwan	Yes	https://beacon.schneidercorp.com/Application.aspx?ApplD=216&LayerID=2931&PageTypeID=1&PageID=0
Wilkin	Yes	https://www.arcgis.com/home/item.html?id=0c60ea3af27d4508bf34480fc61fca9a
Winona	Yes	http://www.co.winona.mn.us/page/2696
	Yes	
Wright Yellow Medicine	_	http://www.co.winona.mn.us/page/2696 https://www.co.wright.mn.us/215/GIS-Mapping http://gis.co.ym.mn.gov/Link/jsfe/index.aspx