

## Creating a Road Network Analysis Layer with Travel Time Estimates using Open-source Data

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Data available at: [http://www.geohealth.canterbury.ac.nz/data/nzogps\\_240215\\_nal1.gdb.zip](http://www.geohealth.canterbury.ac.nz/data/nzogps_240215_nal1.gdb.zip)

Report available at: <http://www.geohealth.canterbury.ac.nz/working/beere2016.pdf>

A main focus of health geography research is assessing the impacts of environmental exposures on health. Exposures, in this instance, are anything in the environment that has the potential to negatively affect or positively contribute to health outcomes. Access to fast food outlets and obesity (Pearce *et al.* 2009), gambling opportunities and gambling behaviours (Pearce *et al.* 2008), alcohol availability and crime (Day *et al.* 2012), greenspace access and mental health (Nutsford *et al.* 2013), and traffic pollution exposure by mode of transport (Kingham *et al.* 2013) are examples of the type of research conducted by health geographers. Exposures are often modelled by determining proximity via a road network, such as measuring access to health services (Beere and Brabyn 2006; Brabyn and Beere 2006).

Distance alone is not always the most appropriate measure as the time required to travel two equal distances may vary. Travel time arguably provides a more consistent basis for comparing exposures, however, the creation and maintenance of a GIS road network with travel time attributes is resource-intensive. Proprietary New Zealand road network data with associated travel time estimates exist, but these are relatively expensive, which puts them beyond the means of many researchers and organisations. Building on the work of Brabyn and Skelly (2002), this paper discusses the methods used to produce an open-source road network analysis dataset with travel time as a resistance attribute. The intention is to produce a publicly accessible network analysis dataset suitable for modelling relationships relevant to health geography, and that can be updated relatively efficiently.

## Data

Open-source national road network datasets are available from three sources in New Zealand: Land Information New Zealand (LINZ), Open Street Maps (OSM), and the New Zealand Open GPS project (NZOGPS). When Brabyn and Skelly (2002) developed their method, the LINZ dataset was the only freely available road data. The LINZ data are primarily for display purposes for the New Zealand Topographic Map series. This data have a number of connectivity issues (highway on-ramps and off-ramps in particular), which make its use for analysis impracticable. The LINZ data also do not contain bridge/tunnel data, which is necessary in order to avoid erroneous intersection connectivity being created where an overpass or underpass occurs. For example, where a bridge feature intersects with a non-connected road passing underneath it, Brabyn and Skelly's (2002) method produces an intersection where none exists.

Length, surface type (sealed/unsealed), highway status, number of lanes ( $<2/\geq 2$ ), one-way roads, sinuosity (bendiness), and urban/rural were required to replicate Brabyn and Skelly's (2002) approach. Table 1 outlines the variables within each of the three available datasets.<sup>1</sup>

**Table 1: Variables required for determining estimated speed**

| Attribute       | LINZ | OSM | NZOGPS |
|-----------------|------|-----|--------|
| Length          | Yes  | Yes | Yes    |
| Surface Type    | Yes  | No  | Yes    |
| Highway         | Yes  | Yes | Yes    |
| Number of lanes | Yes  | No  | No     |
| One-way roads   | Yes  | Yes | Yes    |
| Sinuosity       | No   | No  | No     |
| Urban/Rural     | No   | No  | No     |

The absence of information about surface type ruled out the use of the OSM data. While the NZOGPS did not have information on the number of lanes, it was possible to derive a proxy using its "type" attribute field and assigning roads with the attribute 3, 4, and 5 (arterial roads) as  $\geq 2$  lanes. As the NZOGPS data does not contain bridge attributes, this was obtained from the OSM data. To incorporate one-way geometries, line features representing one-way roads must be digitised consistently in the direction that traffic is permitted to move. While both the LINZ and OSM data contained one-way attributes, the digitising direction was inconsistent. The NZOGPS data had consistent one-way direction geometries and associated attributes. It is important to note that both the OSM and NZOGPS data contain estimated speed variables, but preliminary tests

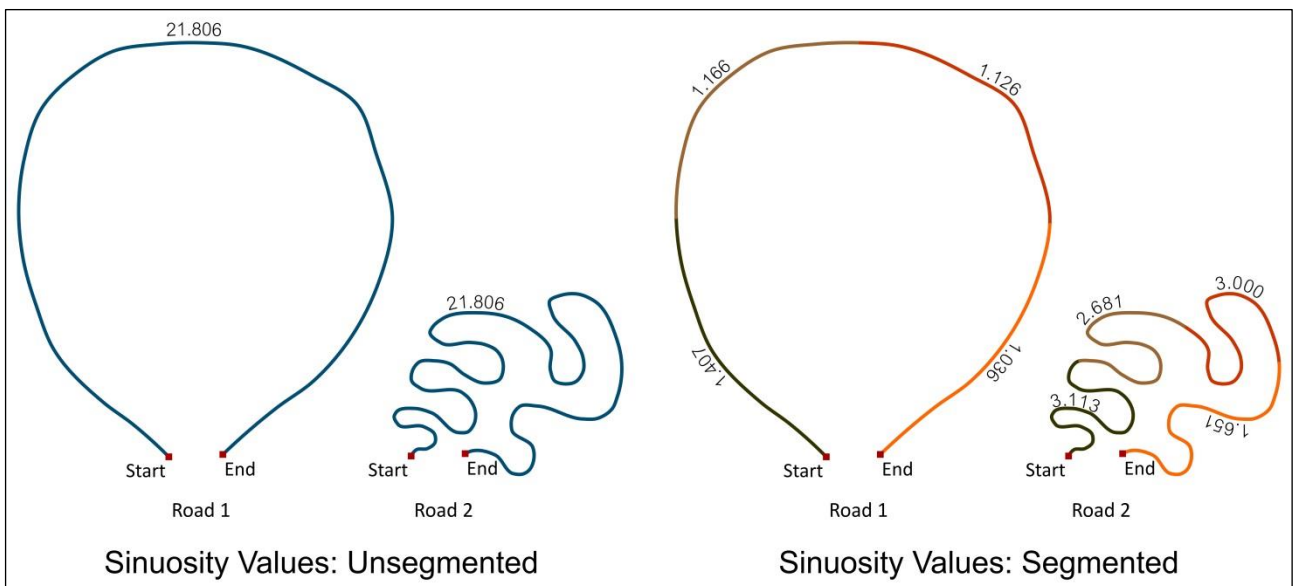
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<sup>1</sup> A full list of relevant attribute table variables, with their data source origin, is listed in the appendix.

were divergent from both ground-truthed data, Google Maps estimates, and from the original Brabyn and Skelly (2002) method. As a result, the existing estimated speed variables were not considered.

## Method

The first step involved removing all data from the NZOGPS road network that were designated as “notforcar”. To derive the sinuosity values, the NZOGPS data was, in its raw form, converted into a network analysis layer in ArcGIS. This was done to take advantage of the Dissolve Network tool, which removes any intersections with a valency of two. The result created a network with a single line feature between intersections (defined as a junction where three or more lines meet). Doing so was necessary as the intention was to improve upon the approach Brabyn and Skelly (2002) used to determine sinuosity. Brabyn and Skelly’s (2002) approach was to divide the road network layer into 500m lengths, then calculate the sinuosity on these lengths. Sinuosity, in this instance, is defined as the ratio between the total length of each 500m segment of road relative to the distance between the start and end point of each segment. Dividing the entire network in this way is necessary as longer line segments tend to distort sinuosity values (Figure 1). Further, calculating sinuosity on lines with highly variable lengths means the resulting values are not comparable.



**Figure 1: As their start/end distance is the same, both ‘Road 1’ and ‘Road 2’ are 2,000m and have the same sinuosity over their total length. By dividing roads into smaller segments, a more nuanced sinuosity index is created**

Unless the length of a line feature is exactly divisible by 500, however, the method used by Brabyn and Skelly (2002) results in short ‘artefact’ line segments. In these cases, short lengths are more likely to be ‘straight’ and receive a low sinuosity score. This is an issue when that length may have been part of a curve in a road. To avoid creating artefact lengths, each ‘intersection to intersection’ feature was divided into ‘as close to’ 500m lengths as possible.

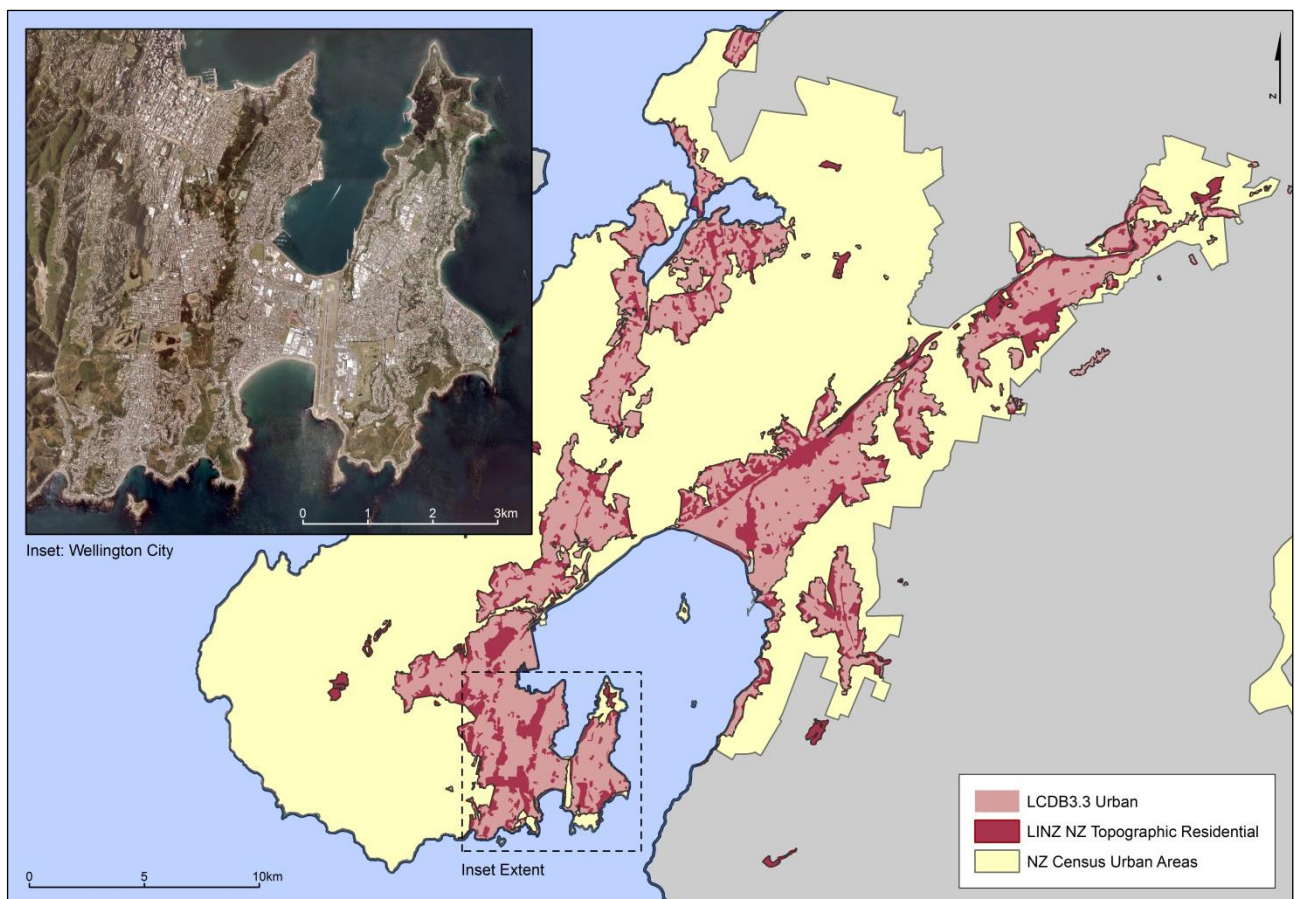
First, the closest divisible value to 500 was calculated for each line feature. Second, a point layer was created to split each feature in the road network based on the values outputted in the previous step. This point layer was generated via the Query Table functionality of ArcGIS. To generate the Query Table, a macro was used in Microsoft Excel to generate extra rows based on the number of divisions each line was going to be split. Based on the line features unique ID, the cumulative distance each point was to be plotted along each line was calculated (Table 2).

**Table 2: Example of Query Table used to plot points for splitting road network line features**

| Feature ID | Split Length | Cumulative Point Location |
|------------|--------------|---------------------------|
| 58         | 478.02       | 478.02                    |
| 58         | 478.02       | 956.05                    |
| 58         | 478.02       | 1434.07                   |
| 58         | 478.02       | 1912.10                   |
| 58         | 478.02       | 2390.12                   |
| 59         | 475.03       | 475.03                    |
| 59         | 475.03       | 950.06                    |
| 103        | 340.52       | 340.52                    |
| 121        | 401.16       | 401.16                    |
| 121        | 401.16       | 802.33                    |
| 127        | 443.45       | 443.45                    |
| 131        | 485.44       | 485.44                    |
| 131        | 485.44       | 970.88                    |
| 131        | 485.44       | 1456.32                   |
| 131        | 485.44       | 1941.76                   |
| 131        | 485.44       | 2427.20                   |
| 138        | 409.00       | 409.00                    |
| 143        | 336.87       | 336.87                    |
| 147        | 404.53       | 404.53                    |
| 152        | 554.13       | 554.13                    |
| 152        | 554.13       | 1108.25                   |
| 154        | 437.04       | 437.04                    |
| 154        | 437.04       | 874.08                    |

Using both the unique ID and cumulative distance variable, a point layer was created via the Query Table, and this was used to split the road network. Third, sinuosity was calculated for each road segment. Fourth, using a Spatial Join in ArcGIS, the original NZOGPS attributes were joined to the sinuosity layer. While this created variability in the lengths of road being assigned sinuosity values, it was deemed a better approach as it avoided the production of extra <500m line features.<sup>2</sup>

LINZ topographic data were used to determine which roads were urban or rural. Defining 'urban', is highly problematic (Taloci, 1998), as illustrated by the three different datasets in Figure 2. Brabyn and Skelly (2002) used the Land Cover Database (LCDB) to define urban and rural roads. The level of detail in the LCDB data, however, means that internal polygon holes (donuts) result in some urban roads being classified as rural. These internal holes can be filled, but the LCDB also tended to exclude some areas that had 'urban' characteristics that could potentially affect travel speeds, such as tourist attractions or resorts.



**Figure 2: Comparison of three urban extent datasets: Wellington region**

<sup>2</sup> Existing 'intersection to intersection' features in the original NZOGPS data were <500m, and these features tended to be in urban areas and have a sinuosity value of 1. Sinuosity was calculated for both the <500m features, and the features that were split.

The geometry and connectivity of the resulting output was then ‘cleaned’ using the model developed by Glennon (2011). Unconnected lines remained after this process, mainly due to roads that were under construction and yet to be connected to the road network. As the status of these roads could not be confirmed, these unconnected lines were removed.

The “type” field in the NZOGPS data provided variables to define highways, number of lanes, and surface type. Roads of “type” 1 and 2 were assigned a value of 1 in the binary “highway” field. To generate a proxy for the number of lanes variable employed by Brabyn and Skelly (2002), roads of “type” 3, 4, and 5 were assigned a value of 1 in a binary field “arterial”. A “surface” field was created and roads of “type” 10 were assigned a value of 1 to denote unsealed/metalled roads, and 0 for sealed.<sup>3</sup> Using the parameters in (Table 3), each road segment was assigned an estimated speed value, and from this estimated travel time in decimal minutes was calculated.

**Table 3: Parameters for assigning travel speed estimates (from Brabyn and Skelly 2002)**

| Road Type   | Estimated Average Speed |
|---|-------------------------|
| Urban highway   | 80km/hr                 |
| Non-urban, >=two lanes, sealed, straight roads (<1.2 ratio) | 80km/hr                 |
| Non-urban, one lane, sealed, straight roads (<1.2 ratio)    | 70km/hr                 |
| Non-urban, >=two lanes, sealed, bendy roads (>=1.2 ratio)   | 60km/hr                 |
| Metalled straight roads                                     | 50km/hr                 |
| Non-urban, one lane, sealed, bendy roads (>=1.2 ratio)      | 40km/hr                 |
| Sealed urban roads  | 30km/hr                 |
| Metalled bendy roads (>=1.2 ratio)                          | 30km/hr                 |

In order to allow end-users/researchers to incorporate the population of offshore islands in their analysis, ferry routes were digitised and added to the road network layer. Ferry travel times were manually added as the time resistance. Connecting offshore islands to the mainland also serves to avoid issues that arise when network analysis search tolerances allow ‘island hopping’ to occur (Figure 3). Using the Create Network Analysis tool in ArcGIS, a new analysis layer was created, with estimated time, length, and one-way variables used to defined analysis attributes.

<sup>3</sup> A full list of existent and derived variables in the NZOGPS network analysis layer are included in the appendix.

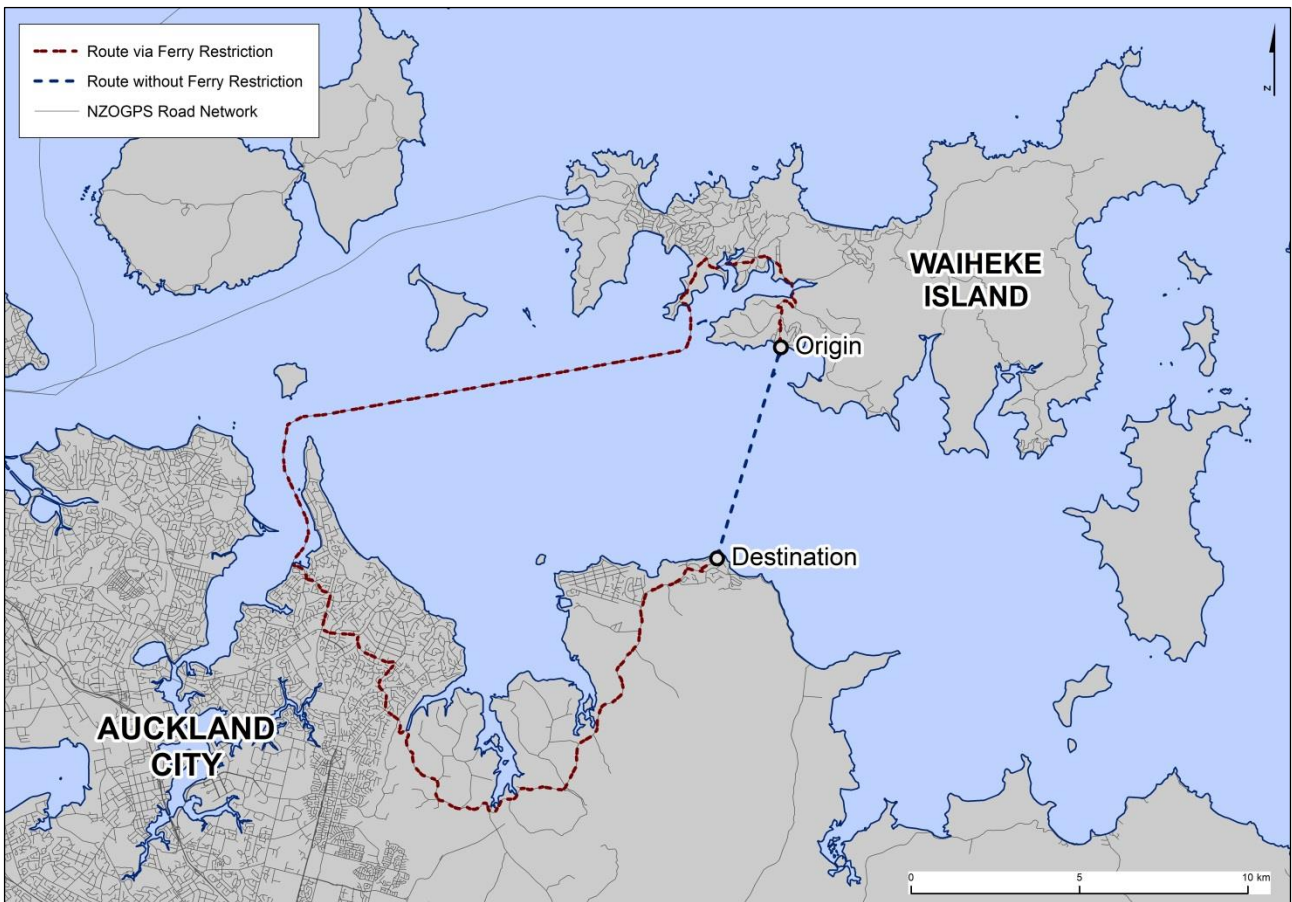
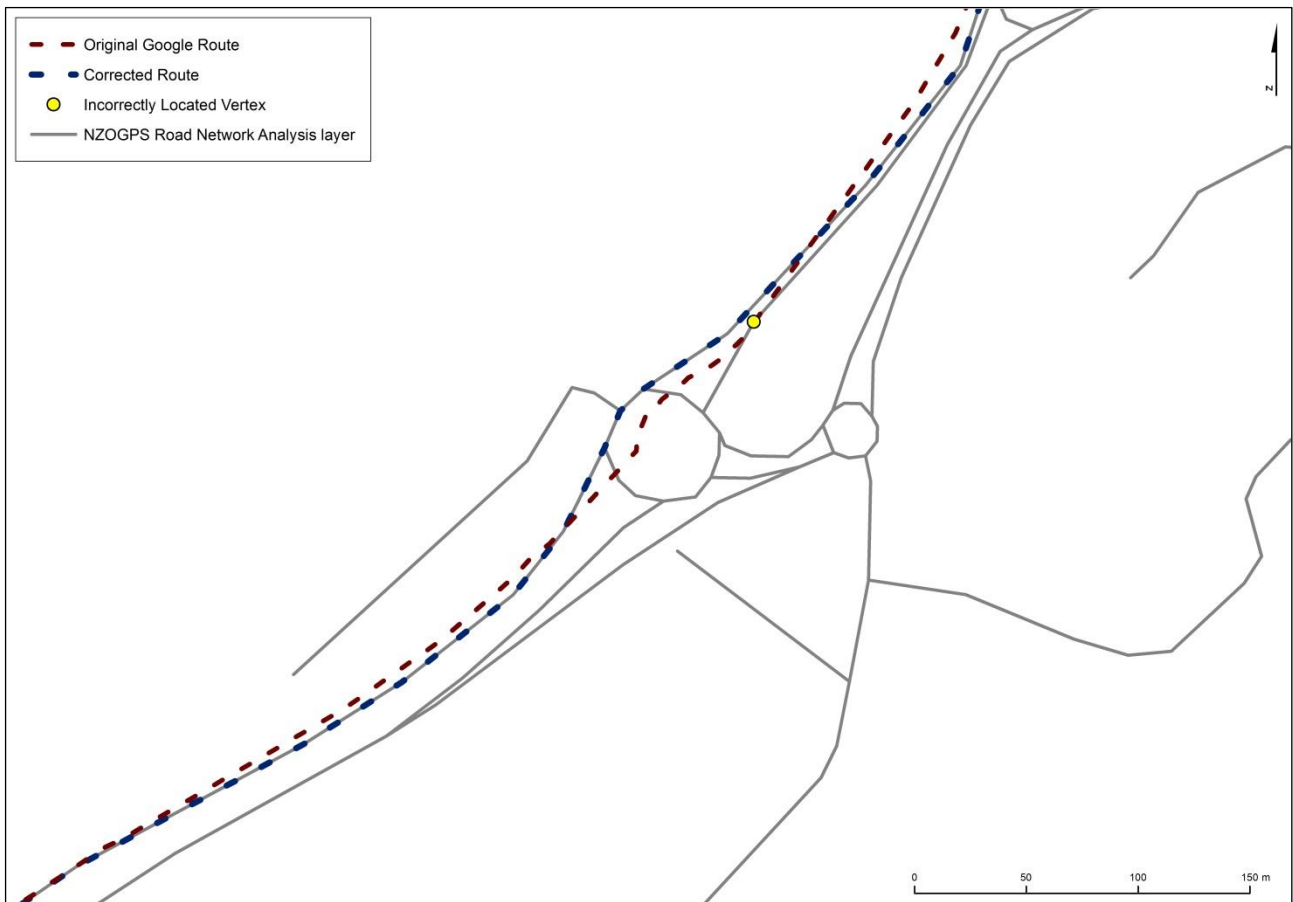


Figure 3: Example of network analysis layer origin/destination result with and without ferry route restrictions

## Validation

As a means to check the estimates produced by the model, 67 routes were created using Google Maps, the geometries of which were exported as kml files. The 67 Google Maps routes were then replicated in the road network analysis layer. As the Google Maps routes did not align with the NZOGPS layer, the kml files were first converted to points using the Vertices to Points tool in ArcGIS. Second, the ArcGIS Near function was then used to determine the closest network analysis layer junctions that the Google Maps route points corresponded to. Third, new point versions of the 67 Google Maps routes were generated using the xy coordinate variables outputted from the Near tool. Due to some of the original Google Maps route vertices being in closer proximity to side road junctions and opposing lanes in the network analysis layer, each had to be manually checked for accuracy (see Figure 4). Fourth, the Make Route Layer tool in ArcGIS was used to calculate travel time estimates to compare against the Google Maps estimates.



**Figure 4: Example of misaligned routes, and incorrectly located vertices**

The 67 Google Maps routes were selected at random, but were weighted to ensure <10, <20, <30, and <60 minute time brackets were well-represented (n=34). Health service provision or environmental exposure research conducted in the GeoHealth Laboratory often has a focus on travel times <60, so it was important to ensure estimates were representative at this scale. In part, this reflects the metrics used to determine what constitutes ‘accessible’ in relation to health services (see Beere and Brabyn, 2006; Brabyn and Beere 2006). For the purposes of consistency across the entire network, >60 minute routes were also analysed. As the NZOGPS network analysis layer did not incorporate intersections, time of day, or congestion as resistances, the ‘without traffic’ Google Maps travel time estimates were used. Pearson correlation and paired t-test analysis were conducted in R to compare the two estimate datasets.

## Results

The estimates from both Google Maps, and the road network analysis layer, are shown in Table 4. Paired t-test analysis for all modelled routes (n=67) returned a mean of the differences of -6.41 (p-value <0.001) and a coefficient of 0.998. For the routes <60 minutes, the coefficient was 0.986, and the mean of the differences was -0.364 but this was not significant.



**Table 4: Travel time estimates from Google Maps and the NZOGPS-based road network analysis layer**

| Route  | Google Minutes | Model Minutes | Google km | Model km | Time Difference | Time Difference as Percentage of Google Estimate |
|--|----------------|---------------|-----------|----------|-----------------|--|
| Dominion Road to Ward Street, Kaitia                 | 3.00           | 2.50          | 1.20      | 1.25     | -0.50           | -16.82   |
| 24 Bidwill Street to 1 Daniell Street, Wellington    | 4.00           | 3.36          | 1.60      | 1.68     | -0.64           | -15.88   |
| Duncan Street to Toko Street, Rotorua                | 4.00           | 4.68          | 2.30      | 2.34     | 0.68            | 17.01  |
| Galaxy Drive to Brighton Terrace, Auckland           | 4.00           | 3.56          | 1.90      | 1.78     | -0.44           | -11.02   |
| Selwyn Street to Buckley Road, Auckland              | 5.00           | 5.83          | 2.90      | 2.92     | 0.83            | 16.68  |
| 15 Bryndwr Road to 4 Grassmere Street, Christchurch  | 7.00           | 7.34          | 3.90      | 3.67     | 0.34            | 4.91   |
| Lovatt Crescent to Russell Road, Whangarei           | 7.00           | 5.47          | 3.10      | 3.06     | -1.53           | -21.84   |
| Waimea Road to Weka Street, Nelson                   | 7.00           | 9.05          | 4.50      | 4.53     | 2.05            | 29.32  |
| Balloch Street to Cook Street, Hamilton              | 8.00           | 7.31          | 3.70      | 3.66     | -0.69           | -8.58  |
| Boyce Avenue to Benteigh Avenue, Auckland            | 8.00           | 6.64          | 3.80      | 3.32     | -1.36           | -16.98   |
| Wills Street to Kinsman Street, Dunedin              | 10.00          | 9.56          | 4.80      | 4.78     | -0.44           | -4.37  |
| 3 Treasure Grove to 12 Aitken Street, Wellington     | 12.00          | 9.30          | 6.40      | 6.56     | -2.70           | -22.54   |
| Christchurch to Belfast, Canterbury                  | 15.00          | 14.56         | 10.30     | 10.26    | -0.44           | -2.95  |
| 5 Stafford Street to 5 Wrights Hill Road, Wellington | 16.00          | 15.74         | 7.80      | 7.87     | -0.26           | -1.64  |
| Derwent Crescent to Arundel Street, Auckland         | 16.00          | 22.31         | 11.00     | 11.15    | 6.31            | 39.44  |
| 3 Rex Street to 25 Fleete Street, Christchurch       | 17.00          | 19.82         | 9.90      | 9.91     | 2.82            | 16.57  |
| Kennington to Wallacetown, Southland                 | 17.00          | 14.74         | 19.20     | 19.33    | -2.26           | -13.30   |
| Baffles Crescent to Baverstock, Hamilton             | 18.00          | 18.26         | 13.60     | 13.72    | 0.26            | 1.42   |
| Wellington to Porirua, Wellington                    | 19.00          | 20.07         | 20.40     | 20.57    | 1.07            | 5.65   |
| Victoria Road to Port Chalmers, Otago                | 21.00          | 18.81         | 16.90     | 17.11    | -2.19           | -10.41   |
| Cliffs Road to Braeview Crescent, Dunedin            | 22.00          | 23.09         | 11.50     | 11.54    | 1.09            | 4.95   |
| Cornfoot Street, Whanganui to Whangaehu              | 22.00          | 26.26         | 24.20     | 24.18    | 4.26            | 19.37  |
| 1 Dinton Street to 10 Marine Parade, Christchurch    | 25.00          | 27.13         | 18.80     | 18.83    | 2.13            | 8.50   |
| Grieve Road, Te Teko to Wairaka Road, Whakatane      | 25.00          | 26.50         | 28.60     | 28.86    | 1.50            | 5.99   |
| Vanguard St, Nelson to Aranui Road, Mapua            | 28.00          | 30.01         | 30.70     | 30.82    | 2.01            | 7.18   |
| Splitt Avenue, Hamilton to Huntly                    | 32.00          | 30.07         | 36.80     | 36.87    | -1.93           | -6.03  |
| Etherton Drive to Glover Road, Auckland              | 35.00          | 42.50         | 28.90     | 29.32    | 7.50            | 21.44  |
| Martinborough to Masterton                           | 36.00          | 35.25         | 43.00     | 43.04    | -0.75           | -2.09  |
| Winton to Edendale                                   | 40.00          | 40.41         | 53.40     | 53.62    | 0.41            | 1.03   |
| Thames to Tairua                                     | 41.00          | 39.33         | 49.00     | 49.44    | -1.67           | -4.06  |
| Martinborough to Upper Hutt                          | 46.00          | 41.24         | 48.20     | 48.65    | -4.76           | -10.34   |
| Tauranga to Lichfield                                | 51.00          | 54.81         | 70.10     | 70.12    | 3.81            | 7.47   |
| Hamilton to Lichfield                                | 56.00          | 58.14         | 73.00     | 73.17    | 2.14            | 3.83   |
| Wanaka to Queenstown                                 | 58.00          | 53.73         | 67.20     | 67.36    | -4.27           | -7.37  |
| Christchurch to Ashburton                            | 66.00          | 73.00         | 88.70     | 88.87    | 7.00            | 10.61  |
| Tuturumuri to Masterton                              | 67.00          | 63.65         | 74.20     | 74.20    | -3.35           | -5.01  |
| Piha to Tui Vale Road, Auckland                      | 69.00          | 76.31         | 61.70     | 61.97    | 7.31            | 10.60  |
| Hokitika to Arthur's Pass                            | 73.00          | 75.14         | 99.60     | 99.84    | 2.14            | 2.94   |
| Gore to Milton                                       | 77.00          | 73.07         | 96.70     | 96.96    | -3.93           | -5.10  |
| Matamata to Otakiri                                  | 92.00          | 96.84         | 127.00    | 127.55   | 4.84            | 5.26   |
| Christchurch to Hanmer Springs                       | 99.00          | 107.15        | 133.00    | 133.57   | 8.15            | 8.23   |
| Palmerston North to Herbertville                     | 100.00         | 98.22         | 119.00    | 121.28   | -1.78           | -1.78  |
| Wellington to Palmerston North                       | 110.00         | 113.61        | 141.00    | 140.75   | 3.61            | 3.28   |
| Auckland to Whangarei                                | 116.00         | 123.03        | 158.00    | 157.96   | 7.03            | 6.06   |
| Tuturumuri to Paraparaumu                            | 117.00         | 109.25        | 129.00    | 129.76   | -7.75           | -6.63  |
| Christchurch to Timaru                               | 121.00         | 130.37        | 165.00    | 164.95   | 9.37            | 7.75   |
| Kumeu to Dargaville                                  | 130.00         | 130.12        | 171.00    | 170.75   | 0.12            | 0.09   |
| Stratford to Tihiroa                                 | 152.00         | 165.95        | 218.00    | 218.76   | 13.95           | 9.18   |
| Gisborne to Potaka                                   | 166.00         | 152.06        | 198.00    | 198.21   | -13.94          | -8.40  |
| Christchurch to Oamaru                               | 179.00         | 195.51        | 250.00    | 250.18   | 16.51           | 9.22   |
| Picton to Takaka                                     | 192.00         | 184.27        | 237.00    | 237.80   | -7.73           | -4.03  |
| Christchurch to Twizel                               | 195.00         | 222.32        | 285.00    | 285.90   | 27.32           | 14.01  |
| Charleston to Takaka                                 | 227.00         | 227.65        | 292.00    | 292.57   | 0.65            | 0.28   |
| Wellington to Napier                                 | 231.00         | 245.65        | 315.00    | 315.23   | 14.65           | 6.34   |
| Christchurch to Westport                             | 241.00         | 257.58        | 332.00    | 332.26   | 16.58           | 6.88   |
| Paparoa to Cape Reinga                               | 242.00         | 241.92        | 318.00    | 318.50   | -0.08           | -0.03  |
| Christchurch to Picton                               | 243.00         | 262.13        | 337.00    | 337.12   | 19.13           | 7.87   |

| Route                        | Google Minutes | Model Minutes | Google km | Model km | Time Difference | Time Difference as Percentage of Google Estimate |
|------------------------------|----------------|---------------|-----------|----------|-----------------|--|
| Christchurch to Dunedin      | 255.00         | 277.28        | 361.00    | 361.60   | 22.28           | 8.74   |
| Christchurch to Nelson       | 294.00         | 325.97        | 415.00    | 415.79   | 31.97           | 10.87  |
| Coromandel to Opononi        | 328.00         | 324.84        | 427.00    | 427.82   | -3.16           | -0.96  |
| Christchurch to Queenstown   | 329.00         | 371.47        | 484.00    | 484.71   | 42.47           | 12.91  |
| Karamea to Haast             | 391.00         | 394.77        | 513.00    | 514.41   | 3.77            | 0.97   |
| Christchurch to Invercargill | 397.00         | 432.48        | 566.00    | 566.73   | 35.48           | 8.94   |
| Opunake to Gisborne          | 439.00         | 459.98        | 591.00    | 592.87   | 20.98           | 4.78   |
| Wellington to Auckland       | 446.00         | 494.80        | 643.00    | 644.00   | 48.80           | 10.94  |
| Whangarei to Gisborne        | 463.00         | 504.93        | 640.00    | 641.10   | 41.93           | 9.06   |
| Picton to Invercargill       | 628.00         | 681.08        | 896.00    | 897.21   | 53.08           | 8.45   |

Relative to the Google Maps estimates, the road network analysis layer both overestimated (n=42) and underestimated (n=25) route times. The majority of underestimates occurred below the 20<sup>th</sup> percentile, and were relatively evenly distributed above the 20<sup>th</sup> percentile for the overestimates. Most overestimates occurred above the 80<sup>th</sup> percentile. The average overestimate time was 11.87 minutes, and the average was -2.74 minutes for underestimates. When broken down by quintiles, underestimates were relatively similar, apart from the 61%-80% range, which was over double that of the next highest mean (Table 5). For the overestimates, these were relatively similar below the 60<sup>th</sup> percentile, but showed a large increase above this.

**Table 5: Comparisons of over and underestimates by quintile**

| Time Quintile | Underestimate                 |       | Overestimate                  |       |
|---------------|-------------------------------|-------|-------------------------------|-------|
|               | Average of Difference Minutes | Count | Average of Difference Minutes | Count |
| 1 (Shortest)  | -0.90                         | 10    | 2.04                          | 5     |
| 2             | -2.13                         | 3     | 2.51                          | 9     |
| 3             | -3.12                         | 6     | 3.95                          | 7     |
| 4             | -7.80                         | 4     | 9.63                          | 9     |
| 5 (Longest)   | -1.62                         | 2     | 29.26                         | 12    |

The largest difference in distance, expressed as a percentage of the original distance, was 5.15% over a 1.6km distance (80m), followed by 3.97% over a 1.2km distance (50m). All other differences in distances between Google Maps and NZOGPS routes were less than +/-2% of the original Google Maps distance. More variation was observed in the differences between travel time estimates (Table 4). No distinct linear trend was observed in the time difference percentage relative to the Google Maps travel time estimate. Larger percentage difference discrepancies did tend to occur for the shorter routes, but this was not statistically significant.

## Discussion

The goal of this project was to produce a road network analysis layer suitable for conducting social epidemiology research involving spatial and travel time relationships, such as access to health services. Due to the variability of network travel via private motor vehicles (time of day, unexpected congestion, road works, accident events), without detailed network flow data, producing an accurate representation rarely translates to 'real world' experiences. For the purposes of this project, however, it was important to provide some context in which to benchmark results. The intention was to see how well the network analysis layer based on NZOGPS and OSM attributes and NZOGPS geometries aligned with a commonly used metric such as Google Maps.

While both Google Maps and the NZOGPS network analysis layer estimates are contestable, it was pleasing that equivalent route times were closely aligned. Even with the model both underestimating and overestimating travel times, the range within which the estimates fell (difference of means=-6.41, p-value <0.001; coefficient=0.998) meant that a satisfactory estimate metric had been produced. Satisfactory, in this instance, refers to an 'intuitive' representation of travel time through the New Zealand road network.

Google Maps time estimates were rounded to the nearest minute, so this is likely to have resulted in inflated discrepancies between estimates. This is particularly true for shorter routes. Further, variation in the distances between the two models may have also contributed to some variability. These differences for the most part were within -/+2% of the original Google Maps route, and resulted from simplified or divergent geometries (Figure 4). For this reason, the author is satisfied that the routes were close enough in distance for the purposes of comparison.

Acquiring the latest NZOGPS geometries for network analysis layer is possible via the NZOGPS portal at <https://github.com/NZOGPS/nzopengps>. Instructions on how to download and convert the raw NZOGPS data for ArcGIS can be accessed at <http://gwprojects.org/forum/viewtopic.php?f=3&t=348>.

I would like to acknowledge the generous help of Gary Turner from the New Zealand Open GPS Project for your help in accessing data and advice in converting files.

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## Appendix

### List of Open Street Map road variables

| Field Name | Type    | Description  | Variables  |
|------------|---------|--|--|
| FID        | Integer | Unique numeric system ID                           |  |
| Shape      | String  | Artibrary system variable                          | Polyline   |
| osm_id     | Integer | Unique numeric ID                                  |  |
| name       | String  | Road names   |  |
| ref        | String  | State/regional highway code                        |  |
| type       | String  | Route type   | abandoned, bridle-way, construction, crossing, cycle-way, footway, footwaypath, living_street, motorway, motorway_link, paper, path, path-disabled, path;track, pedestrian, platform, primary, primary_link, proposed, race-way, residential, rest_area, road, secondary, secondary_link, service, steps, subway, tertiary, tertiary_link, tidal_path, track, traffic_signals, trunk, trunk_link, turning_circle, unclassified, unclassified_lin, undefined, unknown, unmarked_route, unsurfaced |
| one-way    | binary  | One-way roads                                      | 0 (no), 1 (Yes)  |
| bridge     | binary  | Bridges  | 0 (no), 1 (Yes)  |
| tunnel     | binary  | Tunnels  | 0 (no), 1 (Yes)  |
| maxspeed   | Integer | Legal speed limits. Not comprehensive/missing data | 0, 3, 5, 8, 10, 15, 20, 25, 30, 40, 50, 56, 60, 70, 72, 80, 90, 93, 100  |

## List of LINZ road data variables

| Field Name | Type    | Description  | Variables                       |
|------------|---------|--|---------------------------------|
| FID        | Integer | Unique numeric system ID   |                                 |
| Shape      | String  | Arbitrary system variable  | Polyline                        |
| name_ascii | String  | Road name (ASCII format)   |                                 |
| macronated | String  | Text data after July 2012 in UTF-8 format. If your system is not UTF-8 compliant, you will need to use this attribute, which has had any macronated vowels removed.  | y, n                            |
| name       | String  | Road name  |                                 |
| hwy_num    | Integer | State highway number   |                                 |
| rna_sufi   | Integer | This is a unique identifying number given to the Electoral/Landonline Road Centreline ID. It replaces the name_ID attribute in earlier Topo Road Centreline layers. This will enable users a direct link via the IDs to the NZ Road Centre Line (Electoral) layer. |                                 |
| lane_count | Integer | Number of road lanes   | 1, 2, 3, 4, 5, 6, 7, 8, {blank} |
| way_count  | String  | One way roads  | one-way, {blank}                |
| status     | String  | Road construction status   | under construction, {blank}     |
| surface    | String  | Road surface type  | sealed, metalled, unmetalled    |

## NZOpenGPS road data variables

| Field Name | Type    | Description  | Variables   |
|------------|---------|--|---|
| type       | Integer | Numeric code for road types. 1-2 Highways, 3-6 vehicle roads, 7 access/service lanes, 8 arterial road access, 9,11 on/off ramps, 10 unsealed roads   | 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 20, 22, 24, 26, 27, 28, 31, 41   |
| label      | String  | Road name, type  |   |
| descr      | String  | State highway description  |   |
| city       | String  | City name  |   |
| region     | String  | Regional council area  |   |
| country    | String  |  | new zealand~[0x1d]nz  |
| one-way    | Binary  | One-way roads  | 0 (no), 1 (yes)   |
| toll       | Binary  | Toll road status   | 1 (no), 1 (yes)   |
| speed      | Integer | The speed limit attribute does not refer to legal speed limits. It may be interpreted as an attempt at capturing the 'actual' speed a car would travel on a given road, but actually relates to the routing systems used by in-car GPS units so that trip-routing is optimised. For example, a road with speed bumps may be classified as having a speed attribute of 1 (20km/h) so that it is distinct from adjacent roads of category 2 or 3 (40km/h and 60km/h, respectively), even if these are not the legal speed limits for these sections of the road network. | 0 = 5km/h<br>1 = 20km/h<br>2 = 40km/h<br>3 = 60km/h<br>4 = 80km/h<br>5 = 100km/h<br>6 = 110km/h<br>7 = no limit |
| class      | Integer | Road type classification   | 0 = Residential<br>1 = Collector<br>2 = Arterial<br>3 = Principal HW<br>4 = Major HW                            |
| roadid     | Integer | Unique road identity number  |   |
| level      | Integer | ?  | 0   |
| endlevel   | Integer | ?  | 0,1   |
| notforemer | Binary  | Road not accessible to emergency service vehicles  | 0 (no), 1 (yes)   |
| notfordeli | Binary  | Road not accessible to delivery vehicles   | 0 (no), 1 (yes)   |
| notforcar  | Binary  | Road not accessible to private motor vehicles  | 0 (no), 1 (yes)   |
| notforbus  | Binary  | Road not accessible to buses   | 0 (no), 1 (yes)   |
| notfortaxi | Binary  | Road not accessible to taxis   | 0 (no), 1 (yes)   |
| notforpede | Binary  | Road not accessible to pedestrians   | 0 (no), 1 (yes)   |
| notforbicy | Binary  | Road not accessible to bicycles  | 0 (no), 1 (yes)   |
| notfortruc | Binary  | Road not accessible to heavy transport vehicles  | 0 (no), 1 (yes)   |

## Road network analysis metadata

| Field Name           | Type      | Description  | Variables   |
|----------------------|-----------|--|---|
| OBJECTID             | Object ID | System-generated   | Unique  |
| Shape*               | Geometry  | System-generated   | Polyline  |
| TARGET_FID           | Long      | Unique ID for features split for sinuosity calculation   | Unique  |
| FID_nzogps_Corrected | Long      | ID for feature outputs from network dissolve   | Non-unique 2-198722   |
| type                 | Integer   | Numeric code for road types. 1-2 Highways, 3-6 vehicle roads, 7 access/service lanes, 8 arterial road access, 9,11 on/off ramps, 10 unsealed roads   | 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 20, 22, 24, 26, 27, 28, 31, 41   |
| label                | String    | Road name, type  |   |
| descr                | String    | State highway description  |   |
| label3               | String    | State highway description  |   |
| city                 | String    | City name  |   |
| region               | String    | Regional council area  |   |
| country              | String    |  | new zealand~[0x1d]nz  |
| one-way              | Binary    | One-way roads  | 0 (no), 1 (yes)   |
| toll                 | Binary    | Toll road status   | 1 (no), 1 (yes)   |
| speed                | Integer   | The speed limit attribute does not refer to legal speed limits. It may be interpreted as an attempt at capturing the 'actual' speed a car would travel on a given road, but actually relates to the routing systems used by in-car GPS units so that trip-routing is optimised. For example, a road with speed bumps may be classified as having a speed attribute of 1 (20km/h) so that it is distinct from adjacent roads of category 2 or 3 (40km/h and 60km/h, respectively), even if these are not the legal speed limits for these sections of the road network. | 0 = 5km/h<br>1 = 20km/h<br>2 = 40km/h<br>3 = 60km/h<br>4 = 80km/h<br>5 = 100km/h<br>6 = 110km/h<br>7 = no limit |
| class                | Integer   | Road type classification   | 0 = Residential<br>1 = Collector<br>2 = Arterial<br>3 = Principal HW<br>4 = Major HW                            |
| roadid               | Integer   | Unique road identity number  |   |
| level                | Integer   | ?  | 0   |
| endlevel             | Integer   | ?  | 0,1   |
| notforemer           | Binary    | Road not accessible to emergency service vehicles  | 0 (no), 1 (yes)   |
| notfordeli           | Binary    | Road not accessible to delivery vehicles   | 0 (no), 1 (yes)   |
| notforcar            | Binary    | Road not accessible to private motor vehicles  | 0 (no), 1 (yes)   |



| Field Name   | Type   | Description  | Variables  |
|--------------|--------|--|--|
| notforbus    | Binary | Road not accessible to buses   | 0 (no), 1 (yes)  |
| notfortaxi   | Binary | Road not accessible to taxis   | 0 (no), 1 (yes)  |
| notforpede   | Binary | Road not accessible to pedestrians   | 0 (no), 1 (yes)  |
| notforbicy   | Binary | Road not accessible to bicycles  | 0 (no), 1 (yes)  |
| notfortruc   | Binary | Road not accessible to heavy transport vehicles  | 0 (no), 1 (yes)  |
| road_class   | String | Text version of NZOGPS "roadclass" field, from the NZOGPS metadata. This field also used to label bridges/underpasses that were identified from OSM. Column 12 characters long | ArterialOT = Arterial Overpass/Tunnel<br>ArterialT = Arterial Tunnel<br>ArterialU = Arterial Underpass<br>Collector = Collector<br>CollectorB = Collector Bridge<br>CollectorOT = Collector Overpass/Tunnel<br>CollectorT = Collector Tunnel<br>CollectorU = Collector Underpass<br>Major HWTU = Major Highway Tunnel/Underpass<br>Major HWU = Major Highway Underpass<br>Major HW = Major Highway<br>Major HWB = Major Highway Bridge<br>Major HWBU = Major Highway Bridge/Underpass<br>Major HWT = Major Highway Tunnel<br>Major HWU = Major Highway Underpass<br>Principal BU = Principal Highway Bridge/Underpass<br>Principal B = Principal Highway Bridge<br>Principal HT = Principal Highway Tunnel<br>Principal HU = Principal Highway Underpass<br>Principal HW = Principal Highway<br>Principal OT = Principal Highway Overpass/Tunnel<br>ResidentialBU = Residential Street Bridge/Underpass<br>Residential = Residential Street<br>ResidentialB = Residential Street Bridge<br>ResidentialT = Residential Street Tunnel<br>ResidentialU = Residential Street Underpass<br>ResidentialOT = Residential Street Overpass/Tunnel |
| one-way_char | String | Text version of NZOGPS "one-way" field. Used for one-way restrictions compatible with ArcGIS   | Null = two-way<br>F = one-way  |
| Urban_Rural  | Binary | Urban/rural definition based on NZTopo "Residential Areas" dataset   | 0 = rural<br>1 = urban   |

| Field Name            | Type    | Description   | Variables   |
|-----------------------|---------|---|---|
| sinuosity             | Double  | Ratio of total length divided by the distance between the start and end vertices.   | 1 = straight<br><1.2 = not 'bendy'<br>>=1.2 = 'bendy'   |
| road_name             | String  | Capitalised and cleaned version of the NZOGPS "label" field, from the NZOGPS  |   |
| highway               | Binary  | Binary variable to identify highways derived from the NZOGPS "type" field   | 0 = not highway<br>1 = highway  |
| surface               | Binary  | Binary variable to identify metalled/unsealed roads derived from the NZOGPS "type" field  | 0 = metalled/unsealed<br>1 = sealed   |
| arterial              | Binary  | Binary variable to identify arterial roads derived from the NZOGPS "type" field. This is a proxy for >=two-lane roads that are not highways | 0 = not arterial<br>1 = arterial  |
| estimated_speed       | Integer | Estimated speed in km/h based on Brabyn and Skelly (2002)   | 30, 40, 50, 60, 70, 80  |
| estimated_travel_time | Double  | Estimated travel time based on "estimated_speed" and "Shape_Length"   | Non Urban Arterial Bendy<br>Non Urban Arterial Straight<br>Non Urban Bendy<br>Non Urban Straight<br>Residential<br>Unsealed Bendy<br>Unsealed Straight<br>Urban Highway   |
| class_types           | String  | Text version of "estimated_speed" field   | 30 = Residential<br>30 = Unsealed Bendy<br>40 = Non Urban Bendy<br>50 = Unsealed Straight<br>60 = Non Urban Arterial Bendy<br>70 = Non Urban Straight<br>80 = Non Urban Arterial Straight<br>80 = Urban Highway |
| Shape_Length          | Double  | System-generated  |   |