

Development of Variable Speed Limits System Reflecting Pavement and Rainfall Conditions for Real-Time Urban Road in Seoul

(Paper Number of SIRWEC 16-011)

Section of Integrating Road Weather Information and Operations

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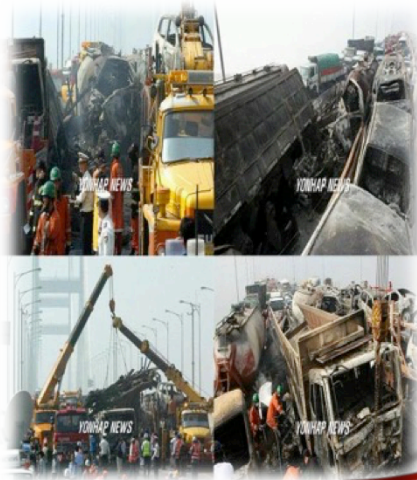
1. Background and Purpose
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6. Summary



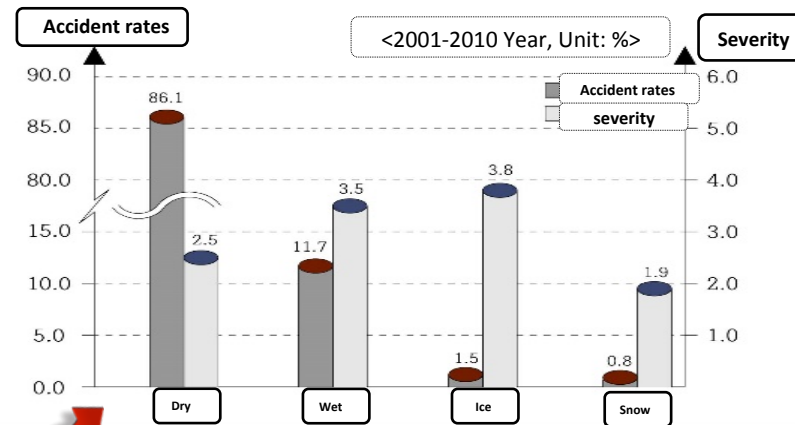
1. Background and Purpose

- **Negative effect of driver's behavior under the rainfall condition.**
- **Probability of high risk crashes during rainfall or after rainfall.**

Traffic Accidents During Heavy Rain



Second Highest Severity Rates in Korea



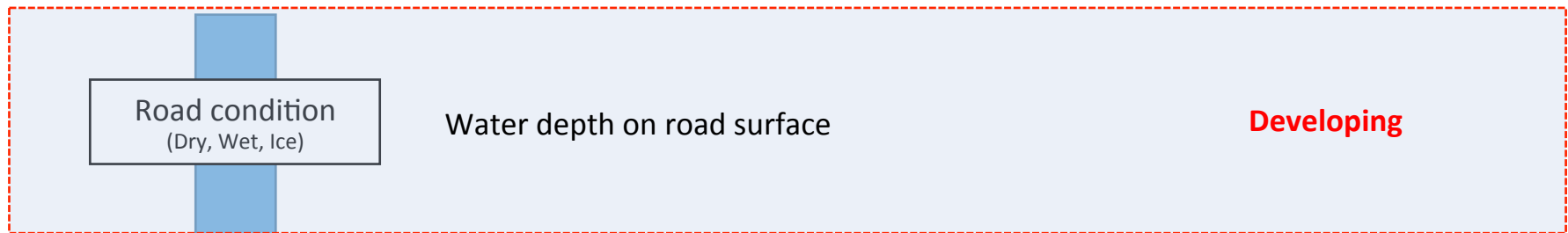
Reference: Koroad / <http://www.koroad.or.kr/>

- **Importance of precise rainfall information for traffic safety.**
- **Not directly being measured of rainfall on roads.**

- **Development of the methodology for the variable speed limits in real time by rainfall intensity in Seoul City.**
 - **Development of variable speed limit algorithm.**
 - **Application of Interpolation technique (IDW) for Seoul roads and 190 weather stations.**
* Inverse Distance Weight
 - **Evaluation of road weather prediction accuracy according to representative rainfall days from 190 weather stations in Seoul.**
 - **Development of Variable Speed Limit System.**



✓ Process for development of VSL



Road condition
(Dry, Wet, Ice)

Water depth on road surface

Developing

Stopping Sight distance (d)

$$d = 0.694V + \sqrt{V^2 / 254 f}$$

Korea Institute Of Construction Technology (2009)

Friction coefficient (f)

$$f = af(W) + b$$

Juga, I., Nurmi, P., & Hippi, M. (2013).
Statistical modelling of wintertime road surface friction.
Meteorological Applications, 20(3), 318-329.

Visibility distance (s)

$$S_v = \frac{354030,6}{I^{0,68} \cdot V}$$

where, S_v = visibility sight [m];
I = rainfall intensity [mm/h]; and
V = speed [km/h].

F. I. Kabbach Junior, C. Y. Suzuki, L. C. Trentin.(2011), Case-Studies of Influence in Rainfall Intensity on Safety Conditions, 12th International Conference on Urban Drainage, Porto Alegre/Brazil.

Variable Speed Limit (VSL)

Speed (V) is set to **free flow speed** at each road link.
Real time driving speed can be applied using **OPEN API**.

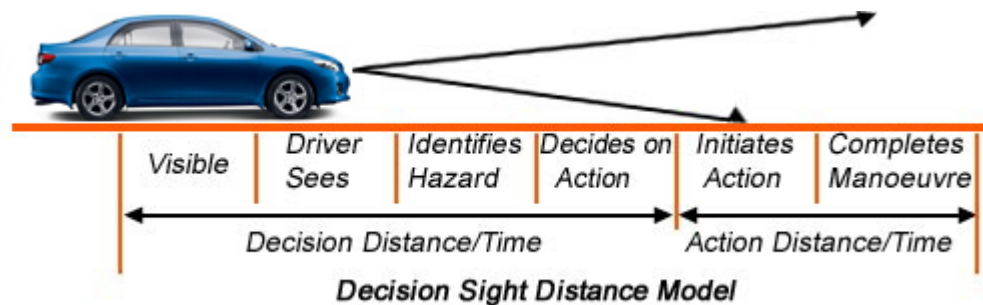


2. Literature Reviews

✓ Stopping Sight Distance

Distance traveled during the two phases of stopping a vehicle: **perception-reaction time** (PRT), and **maneuver time** (MT).

- Perception-reaction time
- Driver eye height
- Object height
- Vehicle operating speed
- Pavement coefficient of friction
- Deceleration rates
- Roadway grade



$$d = d_1 + d_2 = V/3.6 t + V^2 / 254 f = 0.694V + V^2 / 254 f,$$

D: Stopping Sight Distance (m)

d_1 : Reaction time Distance (m)

d_2 : Braking Distance (m)

V: Speed (km/hr)

t: Reaction Time (2.5 sec)

f: Frictional coefficient (wet)

✓ Visibility Distance

To determine the distance of visibility during rain, the main method is exposed, where the empirical equation shows that the visibility distance is calculated in terms of speed and storm.

$$S_v = \frac{354030,6}{I^{0,68} \cdot V}$$

where, S_v = visibility sight [m];
 I = rainfall intensity [mm/h]; and
 V = speed [km/h].

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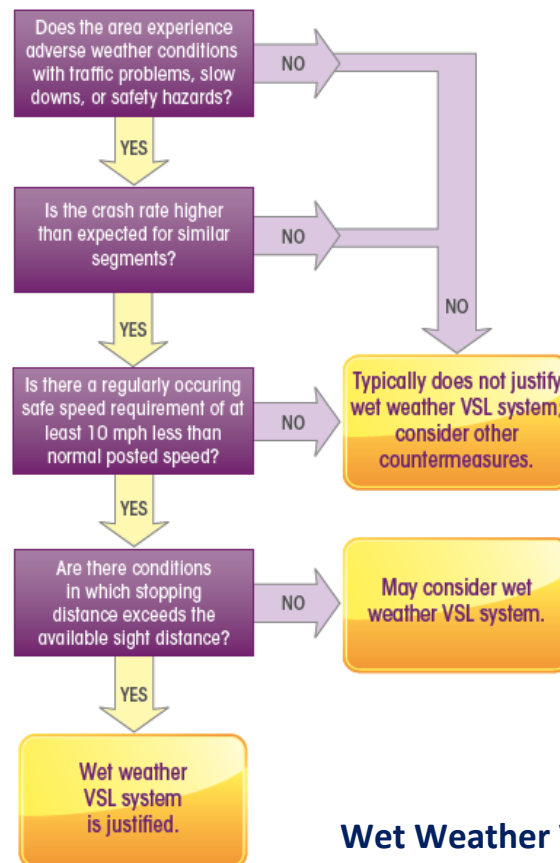
- When the visible distance is reduced to under 100m because of torrential rain, heavy snow or fog, 50% of the maximum speed is applied



✓ Variable Speed Limit

Variable speed limits are speed limits that change based on **road, traffic, and weather conditions**.

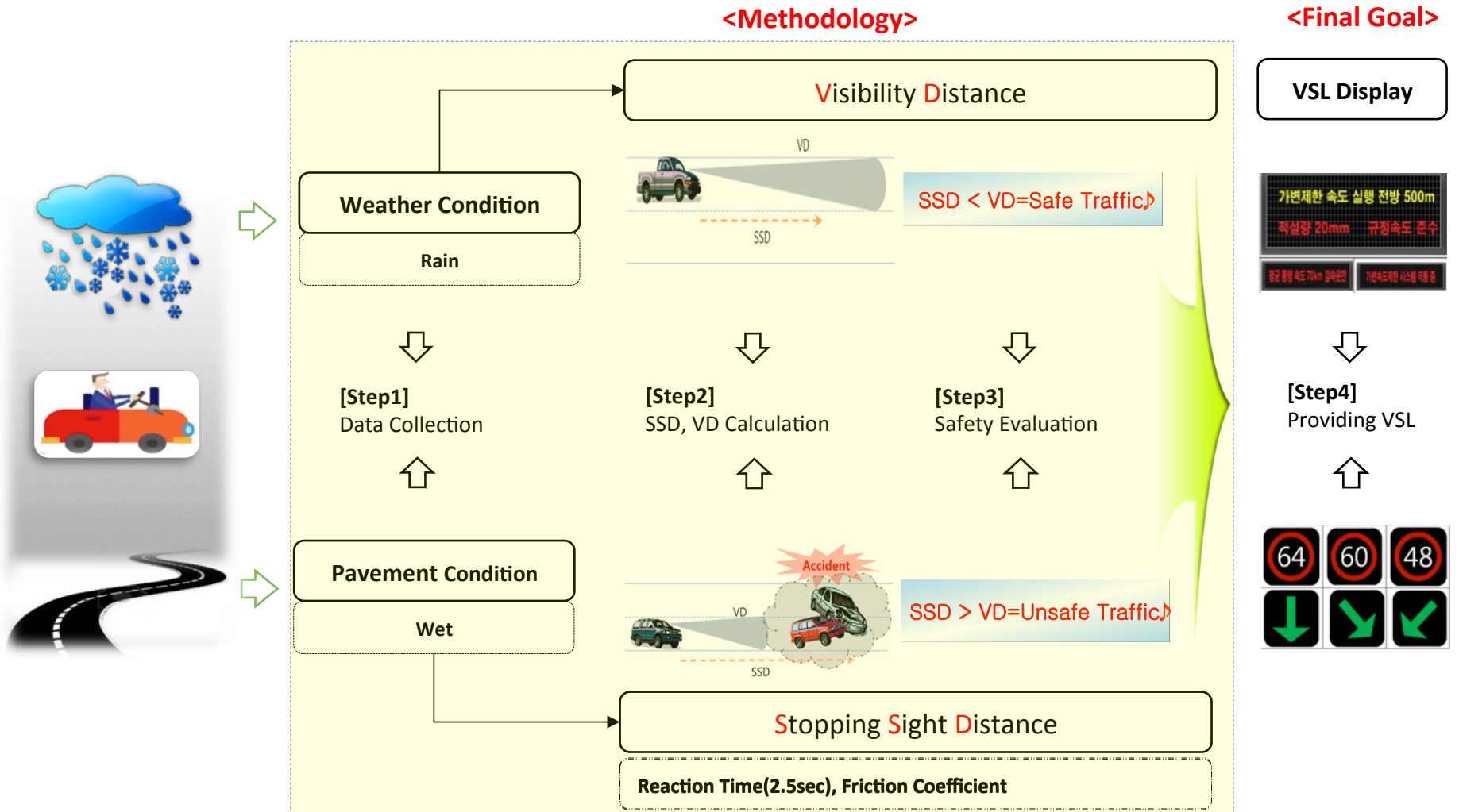
Variable speed limits offer considerable promise in **restoring the credibility of speed limits** and **improving safety by restricting speeds** during adverse conditions. (US. Federal Highway Administration).



Wet Weather Variable Speed Limit Flowchart

3. Development of VSL Algorithm

✓ Definition of Research



✓ Flowchart of Algorithm

$$HSI = SSD - VD$$

Traffic Condition(X_1)=

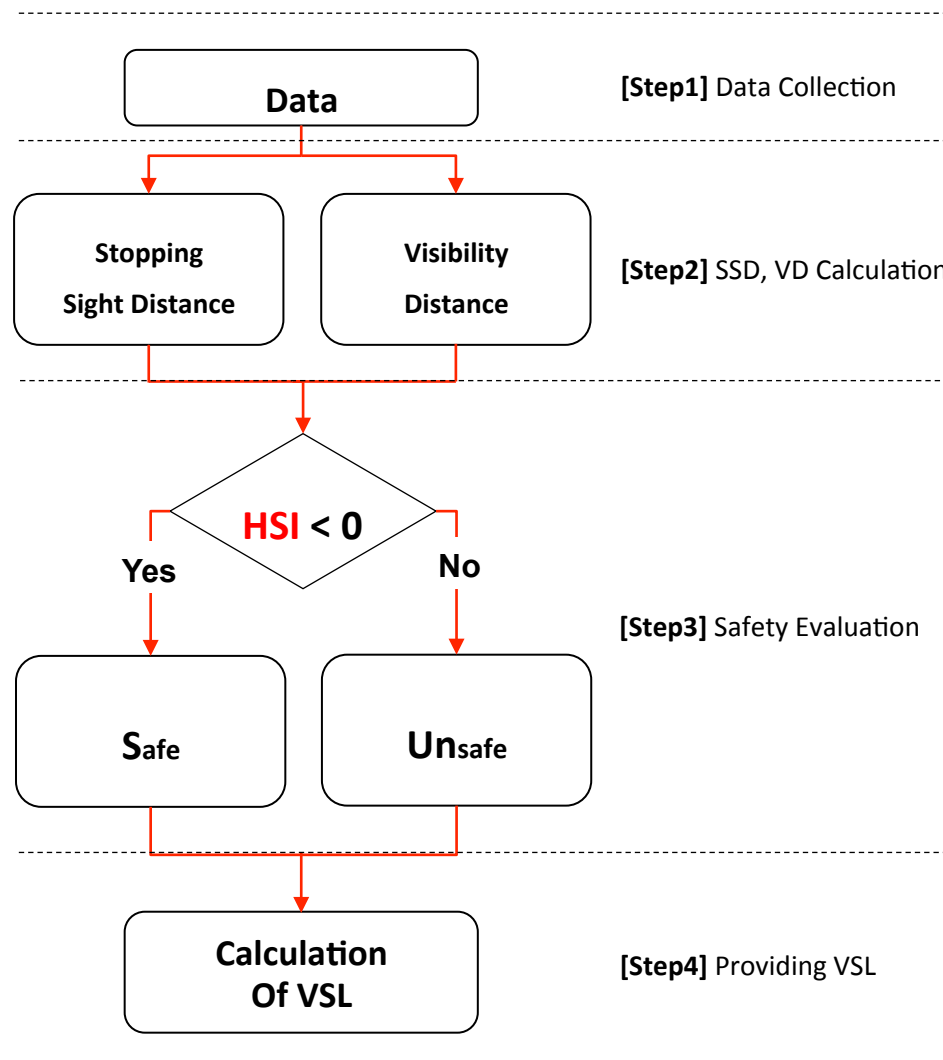
- Safe, $HSI < 0$
- Unsafe, $HSI > 0$

Where,

HSI: Hazardous Spacing Index

SSD: Stopping Sight Distance(m)

VD: Visibility Distance(m)



✓ Analysis

- **Visibility Distance**

- Analysis Conditions

: Road (Tangent), Weather (Rainfall)

- Formula

$$S_v = \frac{354030,6}{I^{0,68} \cdot V}$$

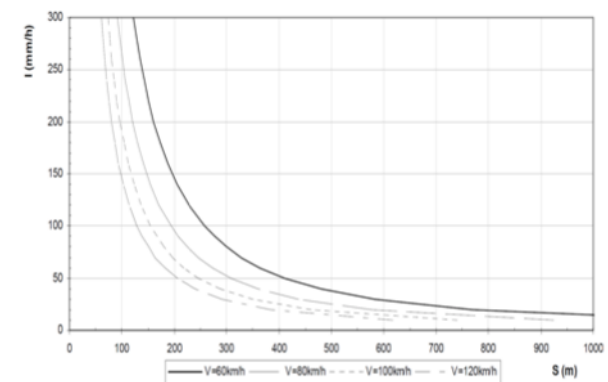
where, S_v = visibility sight [m];
 I = rainfall intensity [mm/h]; and
 V = speed [km/h].

Reference:

- F. I. Kabbach Junior(2011), Case-Studies of Influence in Rainfall Intensity on Safety Conditions, 12th International Conference on Urban Drainage

- Result

Speed (km/h)	Rainfall intensity (mm/h)							
	5	10	15	20	25	30	35	40
120	988	616	468	385	331	292	263	240
110	1,077	672	510	420	361	319	287	262
100	1,185	740	561	462	397	350	316	288
90	1,317	822	624	513	441	389	351	320
80	1,481	925	702	577	496	438	394	360
70	1,693	1,057	802	660	567	501	451	412
60	1,975	1,233	936	769	661	584	526	480



- Stopping Sight Distance

- Analysis Conditions

: Road (Tangent), Pavement (Wet)

- Formula [AASHTO(2010)]

$$D = d_1 + d_2 = \frac{V}{3.6} t + \frac{V^2}{254f} = 0.694V + \frac{V^2}{254f}$$

D: Stopping Sight Distance (m)

d_1 : Reaction time Distance (m)

d_2 : Braking Distance (m)

V: Speed (km/hr)

t: Reaction Time (2.5 sec)

f: Frictional coefficient (wet)

- Result

Speed (km/h)	Frictional Coefficient (f)							[unit: m]
	0.2	0.25	0.3	0.35	0.4	0.45	0.5	
120	367	310	272	245	225	209	197	
110	315	267	235	212	195	182	172	
100	266	227	201	182	168	157	148	
90	222	190	169	154	142	133	126	
80	182	156	140	128	119	112	106	
70	145	126	113	104	97	91	87	
60	113	98	89	82	77	73	70	
50	84	74	68	63	59	57	54	
40	59	53	49	46	44	42	40	
30	39	35	33	31	30	29	28	
20	22	20	19	18	18	17	17	



Example

*** SSD**

Speed (km/h)	Frictional Coefficient (f)						
	0.2	0.25	0.3	0.35	0.4	0.45	0.5
120	367	310	272	245	225	209	197
110	315	267	235	212	195	182	172
100	266	227	201	182	168	157	148
90	222	190	169	154	142	133	126
80	182	156	140	128	119	112	106
70	145	126	113	104	97	91	87
60	113	98	89	82	77	73	70
50	84	74	68	63	59	57	54
40	59	53	49	46	44	42	40
30	39	35	33	31	30	29	28
20	22	20	19	18	18	17	17

[단위: m]

*** VD when rainfall 30(mm/h)**

Speed (km/h)	VD
120	292
110	319
100	350
90	389
80	438
70	501
60	584
50	701
40	876
30	1,168
20	1,752

[단위: m]

*** Matching work**

Speed (km/h)	Frictional Coefficient (f)						
	0.2	0.25	0.3	0.35	0.4	0.45	0.5
120	367	310	272	245	225	209	197
110	315	267	235	212	195	182	172
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80	182	156	140	128	119	112	106
70	145	126	113	104	97	91	87
60	113	98	89	82	77	73	70
50	84	74	68	63	59	57	54
40	59	53	49	46	44	42	40
30	39	35	33	31	30	29	28
20	22	20	19	18	18	17	17

[단위: m]

* Calculation

$$HSI = SSD - VD$$

Traffic Condition(X1)=

- Safe, $HSI < 0$

- Unsafe, $HSI > 0$

where,

HSI: Hazardous Spacing Index

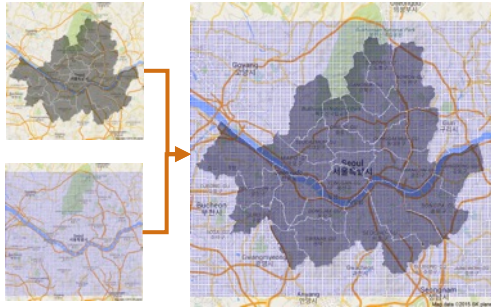
SSD: Stopping Sight Distance(m)

VD: Visibility Distance(m)

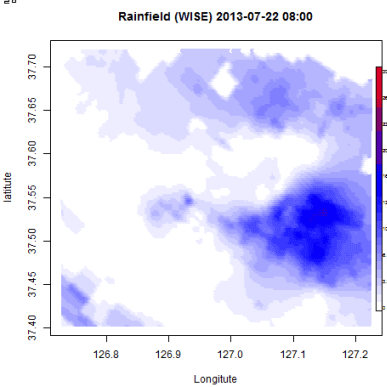


4. Application of Road and Weather Information

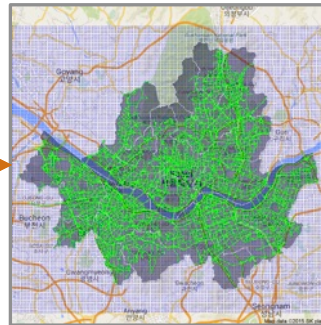
Map (Seoul, 250m resolution)



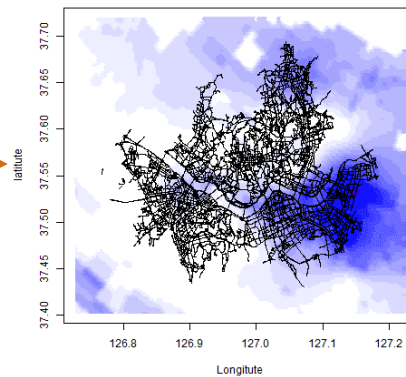
Node Link (Seoul)
Number : 22,184
Point : 177,599



Road Information

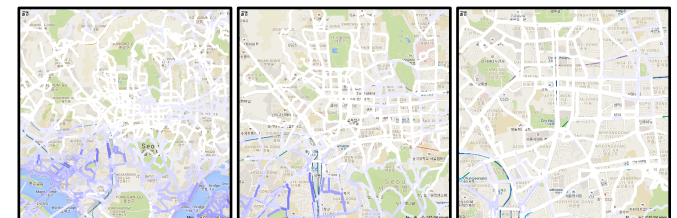
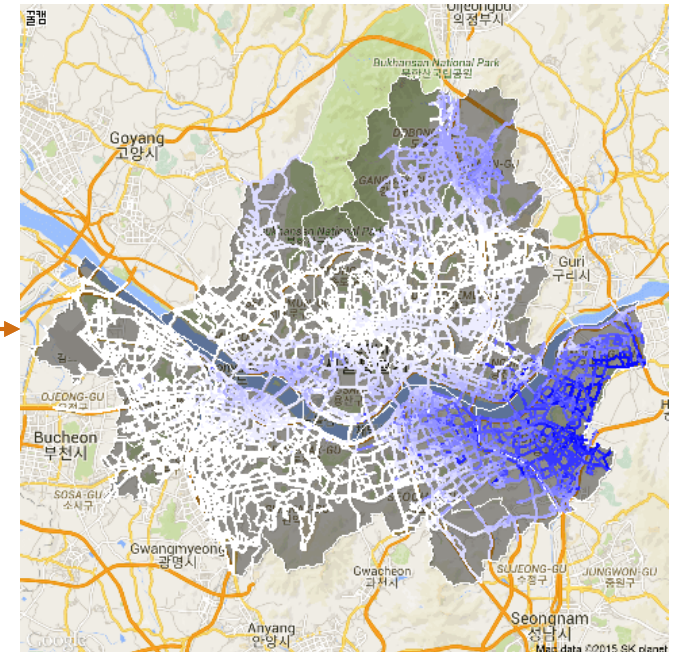


Rainfield (WISE) 2013-07-22 08:00



Weather Information

Road Weather Monitoring System

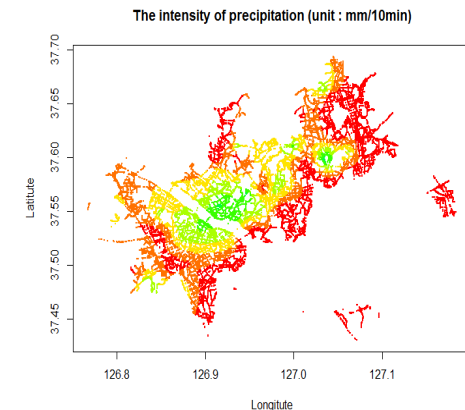
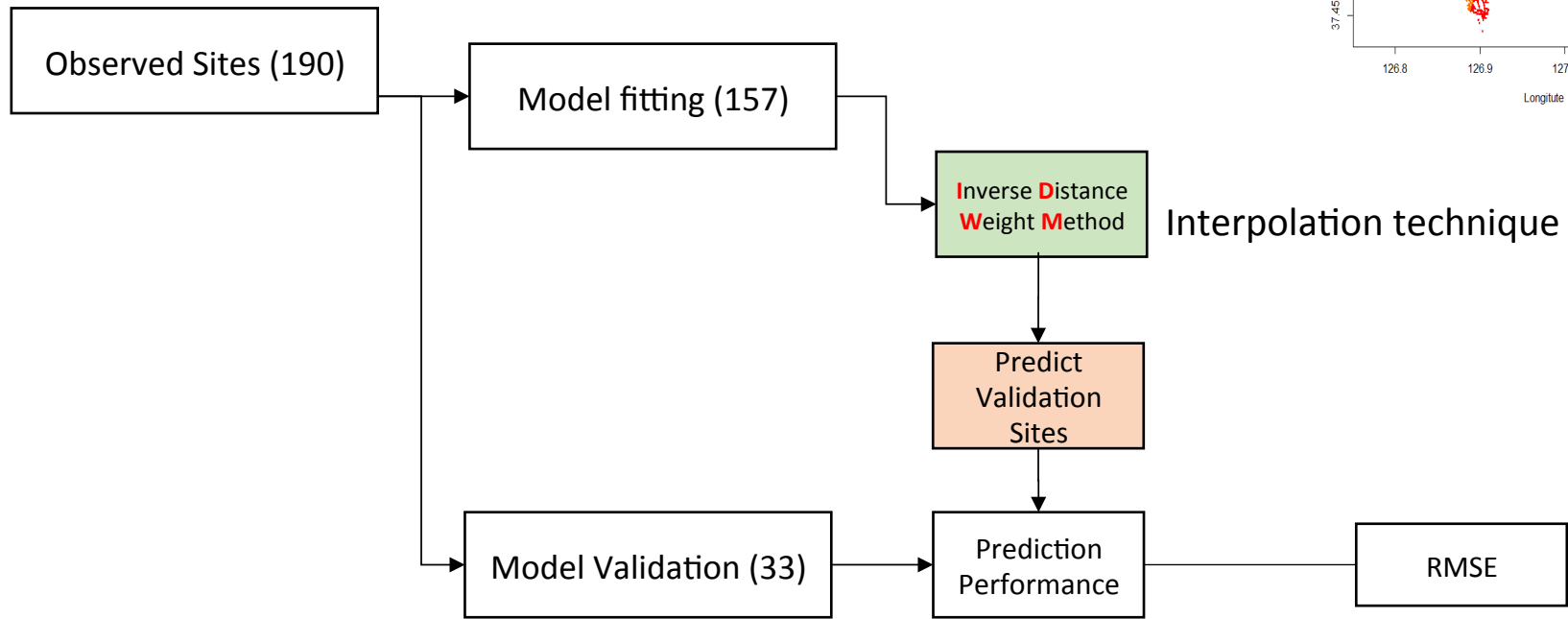


Information of Rain in Real Time (250m resolution)



✓ Process of Verification

**Generation of the map of road weather
By using Auto Weather Station**



Criteria for road weather prediction



✓ Inverse Distance Weight method (IDW)

- Inverse distance-based weight interpolation computes a **weighted average**,

$$Z(s_0) = \frac{\sum_{i=1}^n w(s_i) Z(s_i)}{\sum_{i=1}^n w(s_i)}$$

where $Z(s_0)$ is a value of a prediction location (s_0) and $Z(s_i)$ is a value of

observational location (s_i).

The weights $w(s_i)$ for observations are computed according to their distance to the interpolation location, where are consisted by **Euclidean distance** and

a The predicted values never **outside the range of observed values**.



$$w(s_i) = \frac{1}{\|s_i - s_0\|^p}$$

✓ Model validation criteria

- Two measures are used for evaluating the prediction performance.

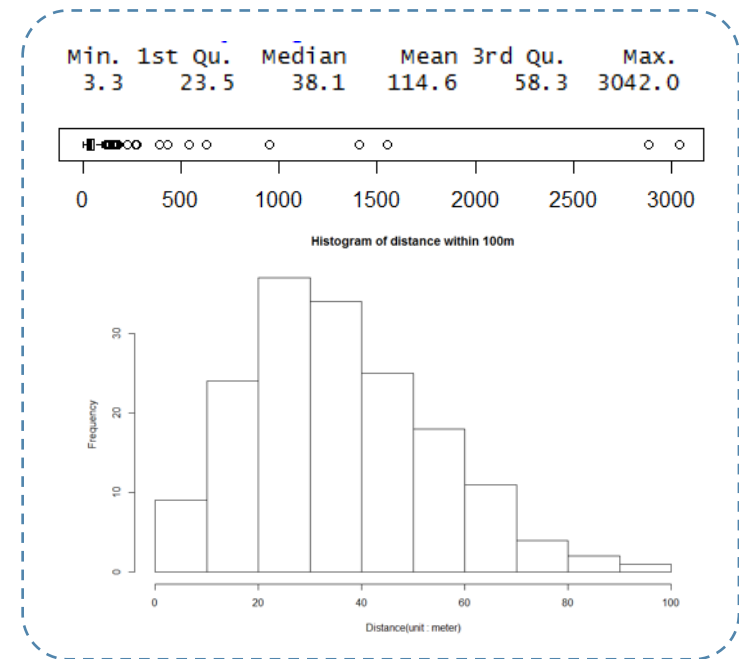
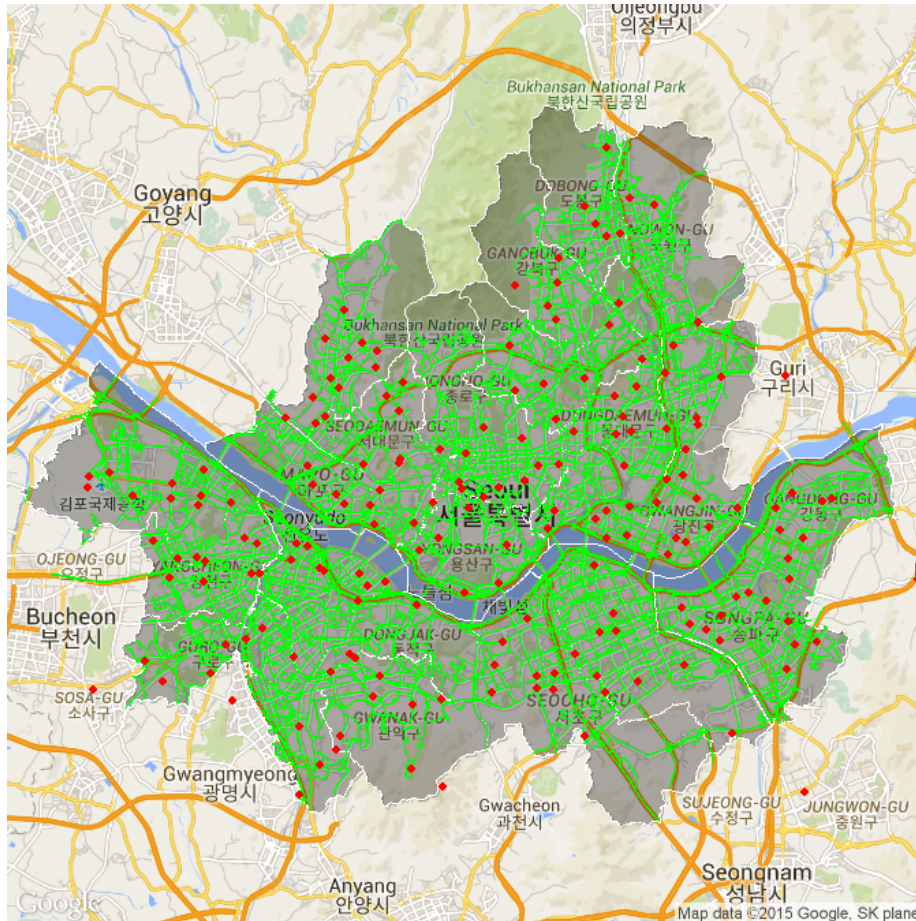
$$\text{RMSE} = \sqrt{\frac{1}{N} \sum_{i=1}^N (y_i - \hat{y}_i)^2}$$

where y_i is the observed values, \hat{y}_i is the predicted value.

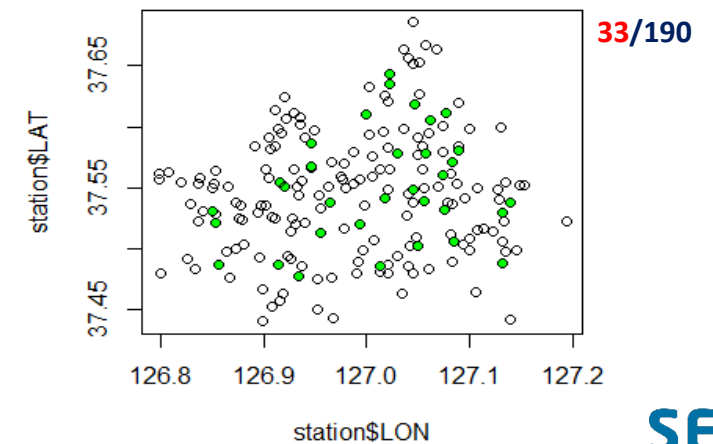


- Basic statistics for verification

Site Information of Weather Observation and Road Position in Seoul

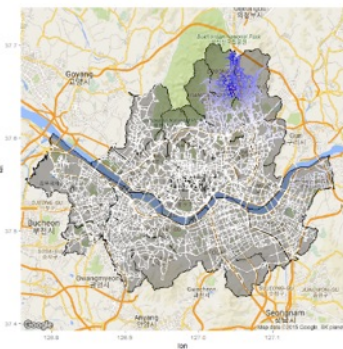


33 weather observations within 20m away from roads (17.3%)
Others are 157 observations 20m away from roads (82.7%)

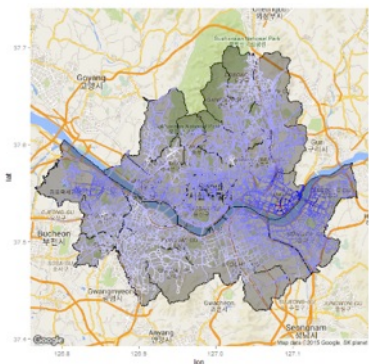
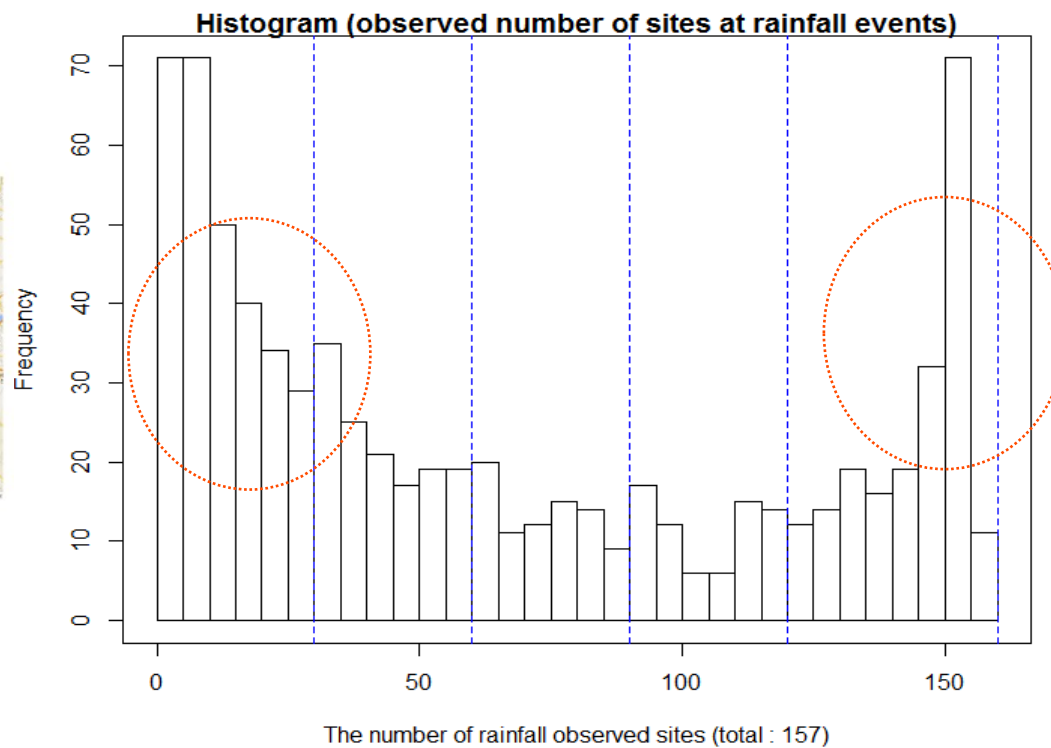


✓ Result

- Rainfall events would be affected by the ratio of rainfall observed sites.
 - Sites : 190 (SKP+KMA)
 - Time : 2013 (8 days/ 10min)
 - $8 \times 24 \times 6 = 1,152$
 - No rain : 403 (34.98%)
 - Rain : 749(65.02%)




Locality rainfall events



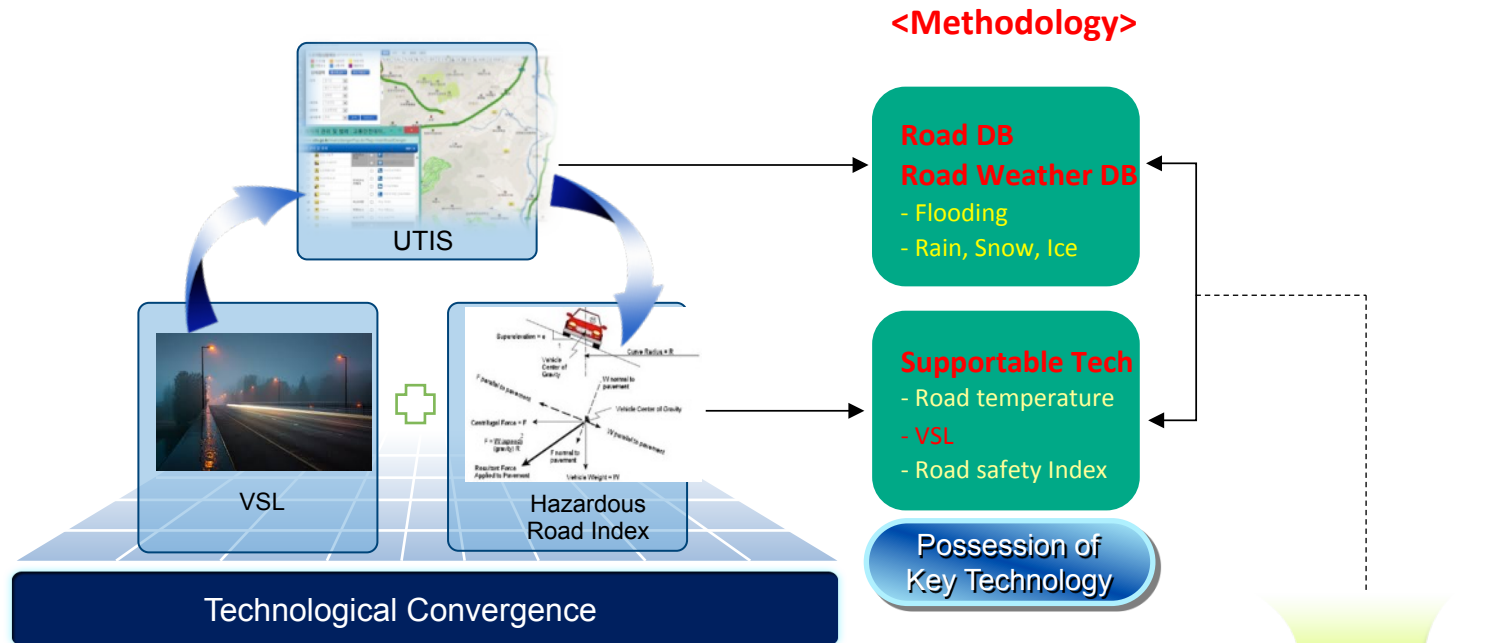
Globality rainfall events

- Model validation results (RMSE)

			RMSE
Observed sites (model fitting)			IDW
<p>Local</p>  <p>Global</p>	1~30	mean	0.041
	19.1%	sd	(0.064)
	31~60	mean	0.155
	38.2%	sd	(0.176)
	61~90	mean	0.307
	57.3%	sd	(0.465)
	91~120	mean	0.343
	76.4%	sd	(0.503)
	121~157	mean	0.848
	100.0%	sd	(0.675)
total		mean	0.318
		sd	(0.519)

5. Technology Application with UTIS

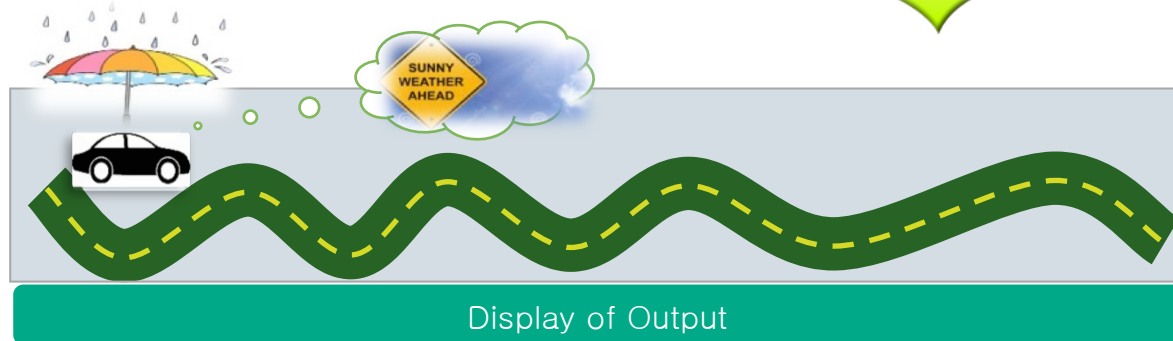
- UTIS (Urban Transit Information System) operated by Korean Police Agency
 - This system Provides all road information such as traffic, unexpected accidents and **road weather**.



<Final Goal>

Example of Contents

- Current Weather
- Forecast Weather



✓ Development of VSL System

- Example of tested-operation system

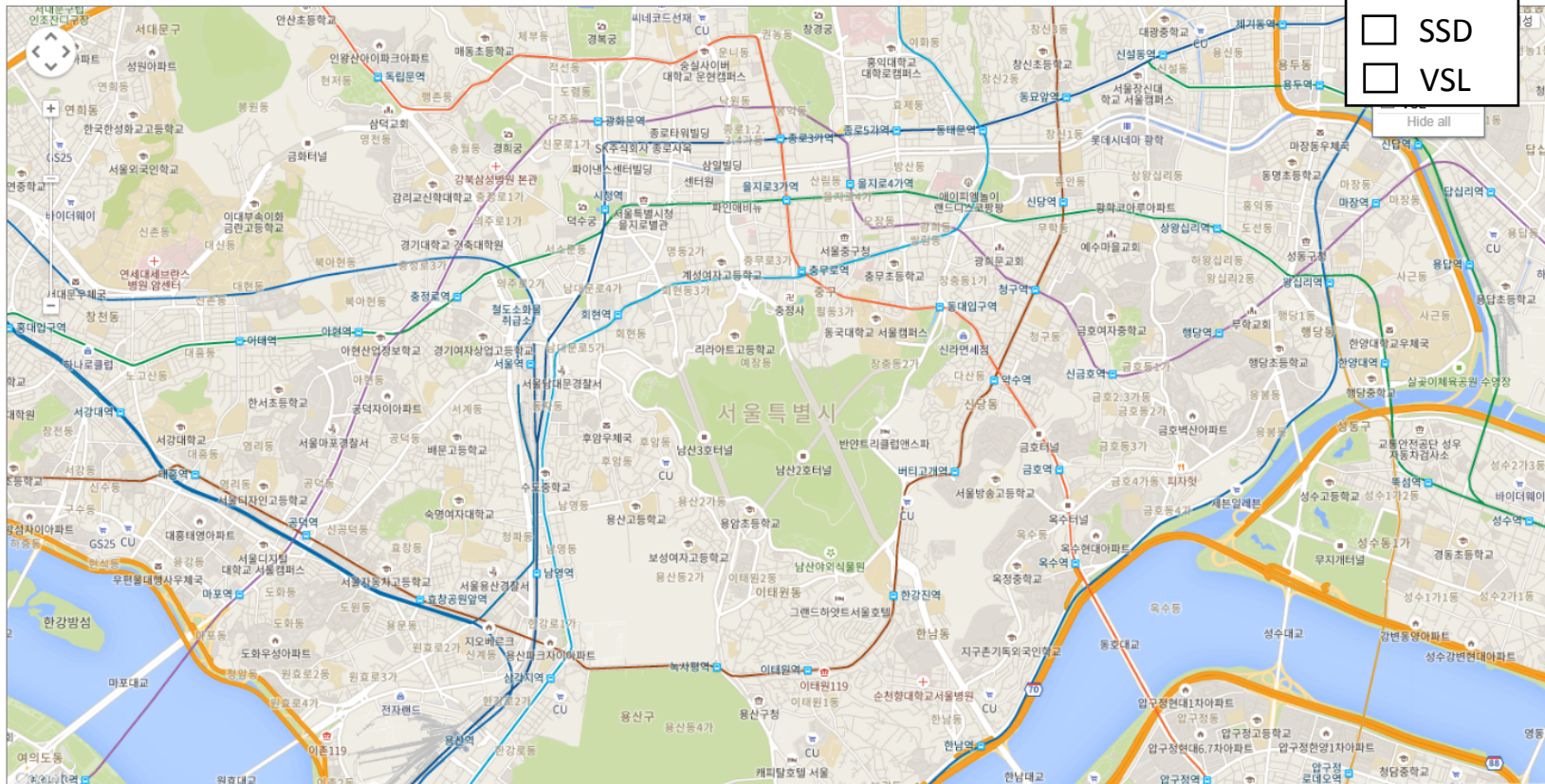


도로 기상 정보

2013. 7. 23 08:00 08:10 08:20 08:30 08:40 08:50 09:00 09:10 09:20

- Rain
- VD
- SSD
- VSL

Hide all



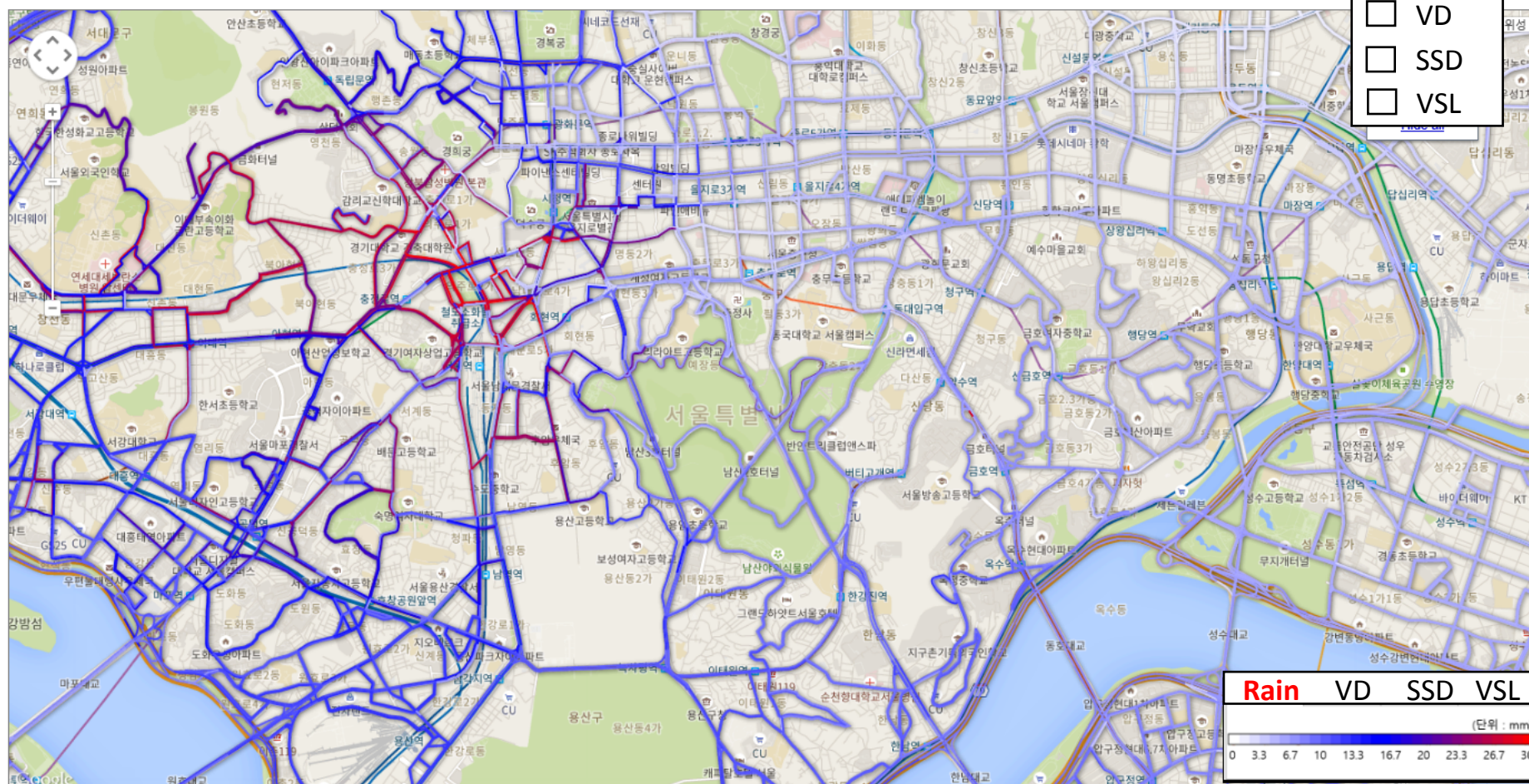
Example of rain information



도로 기상 정보

2013. 7. 23 08:00 08:10 08:20 08:30 08:40 08:50 09:00 09:10 09:20

- Rain
- VD
- SSD
- VSL



- Example of visibility distance information



도로 기상 정보

2013. 7. 23

08:00

08:10

08:20

08:30

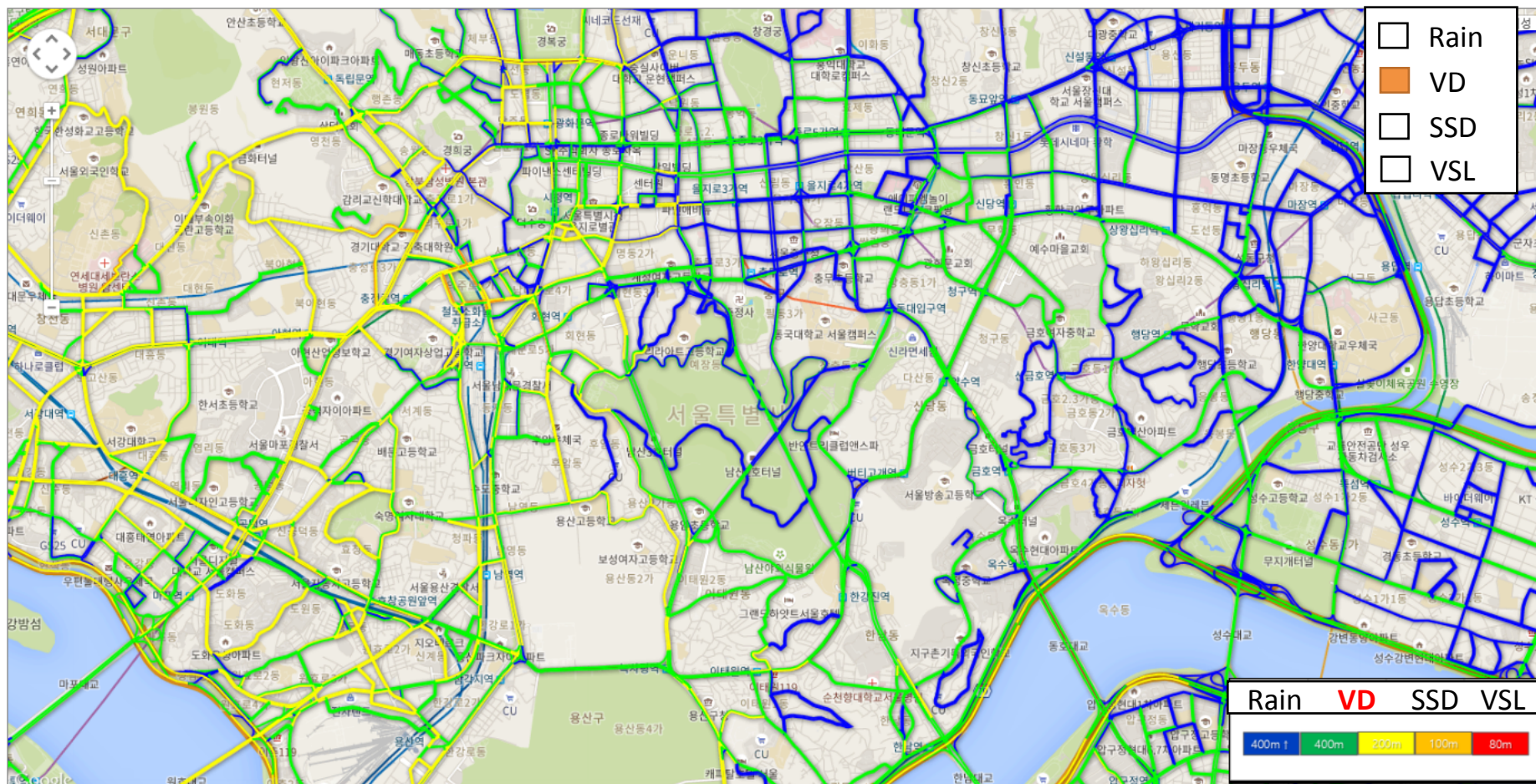
08:40

08:50

09:00

09:10

09:20



✓ End Users

Example of End-user product



Please Drive Slowly



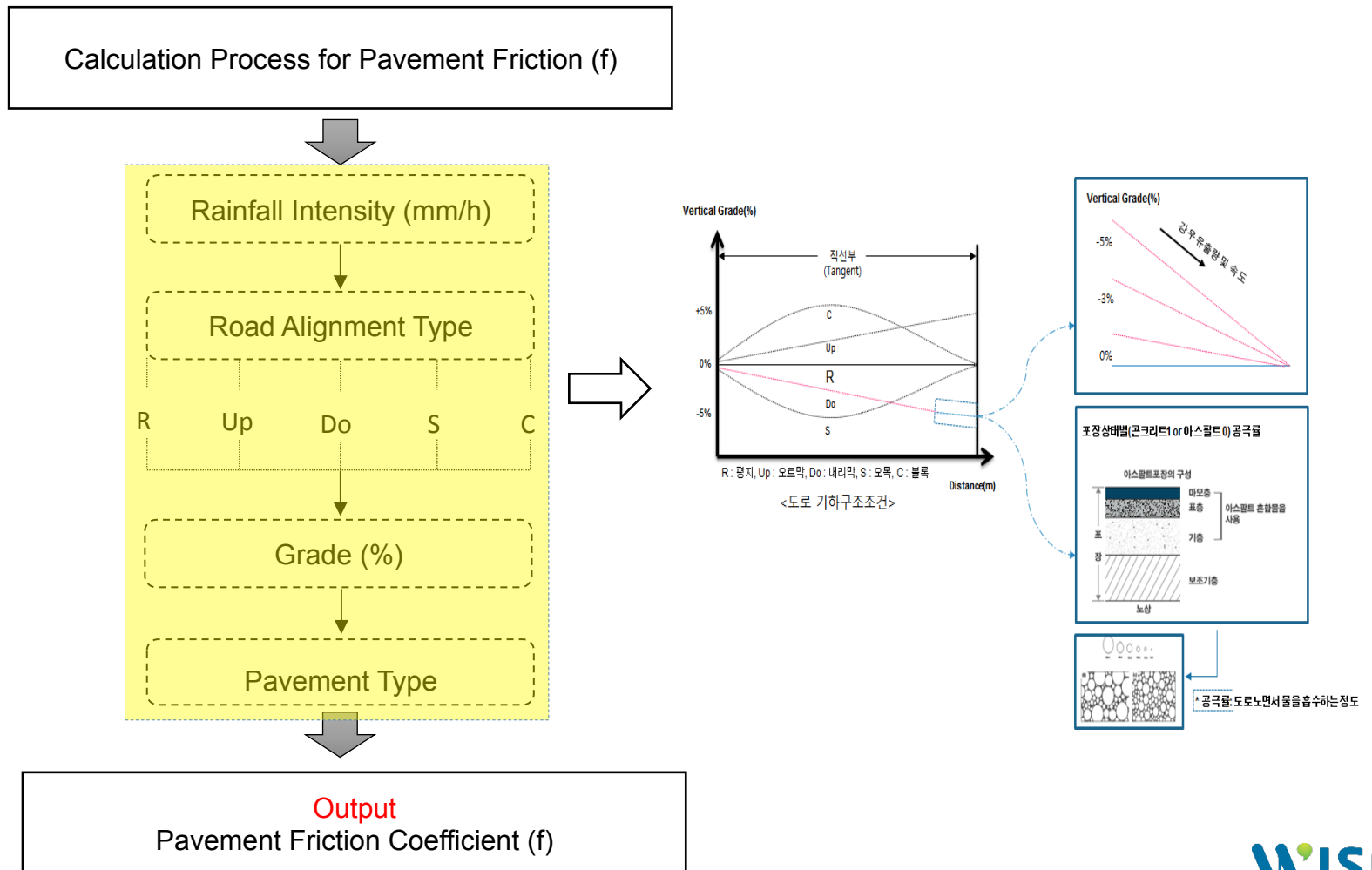
6. Summary

- Assessment of road weather based on the distance.
 - Validation sites : 33 (within 20 meter from road)
 - Fitting sites : 157
- Inverse distance weighting (IDW) was considered.
- **IDW** is the best model at **locality rainfall events** in the sense of RMSE.
- However, it is not at **globality rainfall events**.
 - VSL was calculated from rainfall intensity by considering stopping sight distance, and visibility distance.



✓ Further Study

- Process of Research



Thanks for
Your attention

