



# **Research on emergency evacuation at the leakage of toxic substances in Mitsubishi Chemical Corporation**

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# Background and aim

Background : The regulation for consequence management of toxic leakage is not exist in Japan unlike US and Europe, and the level of emergency response plan is not enough. Our company has the emergency evacuation plan, but following problems are identified.

## Problems of current evacuation system

## Improvement studies

## Introduction of summary

Detection

- Accurate detection for the leakage of toxic substances

- Optimization of location of gas sensors –plant boundary and manufacturing area

Estimation of leakage rate

- A diameter, which is an input parameter of current model, is not appropriate in accidents

- The estimation of leakage rate by image analysis (kg/min) (Python-OpenCV)

Estimation of dispersion area

- Case study is unable, because estimation results calculated by TRACE are prepared and refer nearest situation

- Making dispersion model which is easy to use and is able to predict evacuation area in near future

Evacuation

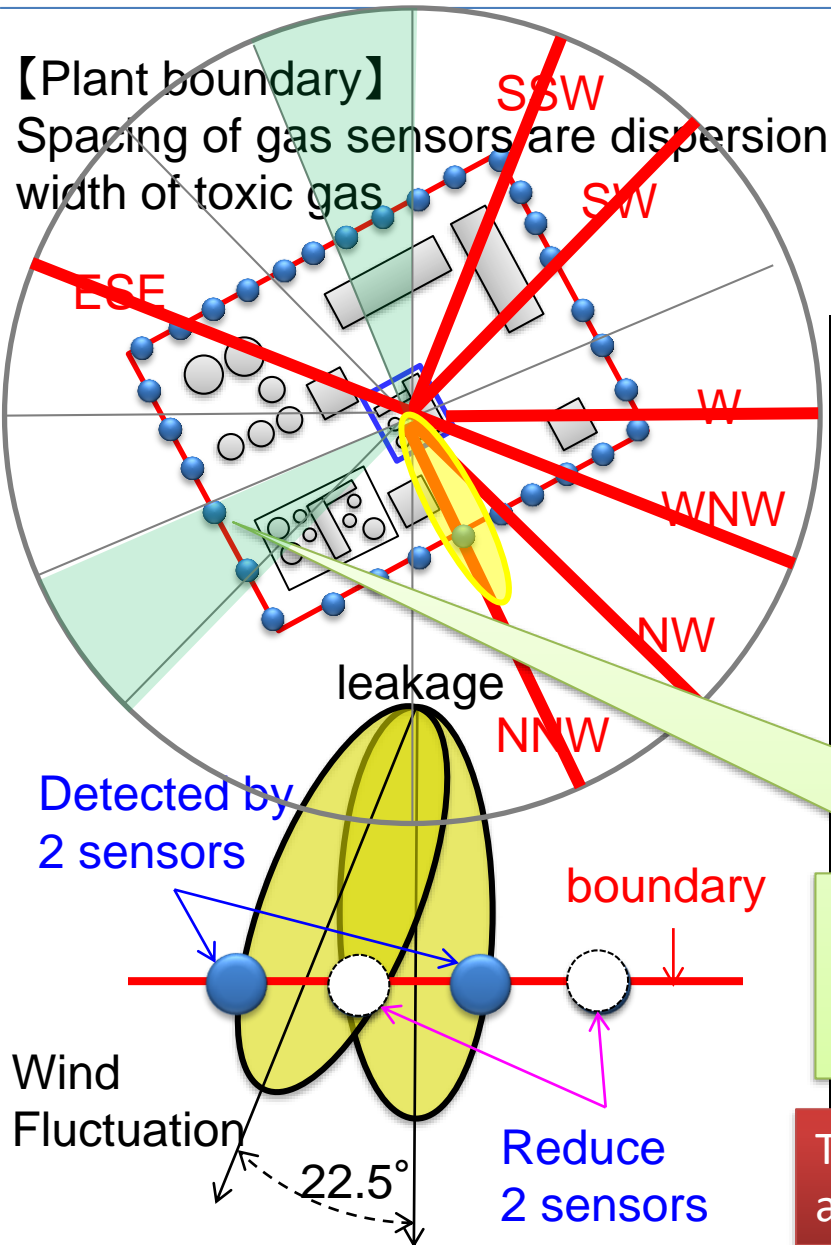
- The rule is not decided for the evacuation zone and emergency operation zone to shut down of chemical plant

- Decide threshold for evacuation
- Make a rule for evacuation zone and emergency operation zone

Today's topics

Aim : Solving all problems from leak detection to evacuation comprehensively, developing the emergency response plan, and deploying it to other factories to improve safety.

# Optimization of locations of gas sensors



Collect data from JMA (for 10 years, every 10 min)

The analysis of possibility of wind fluctuation

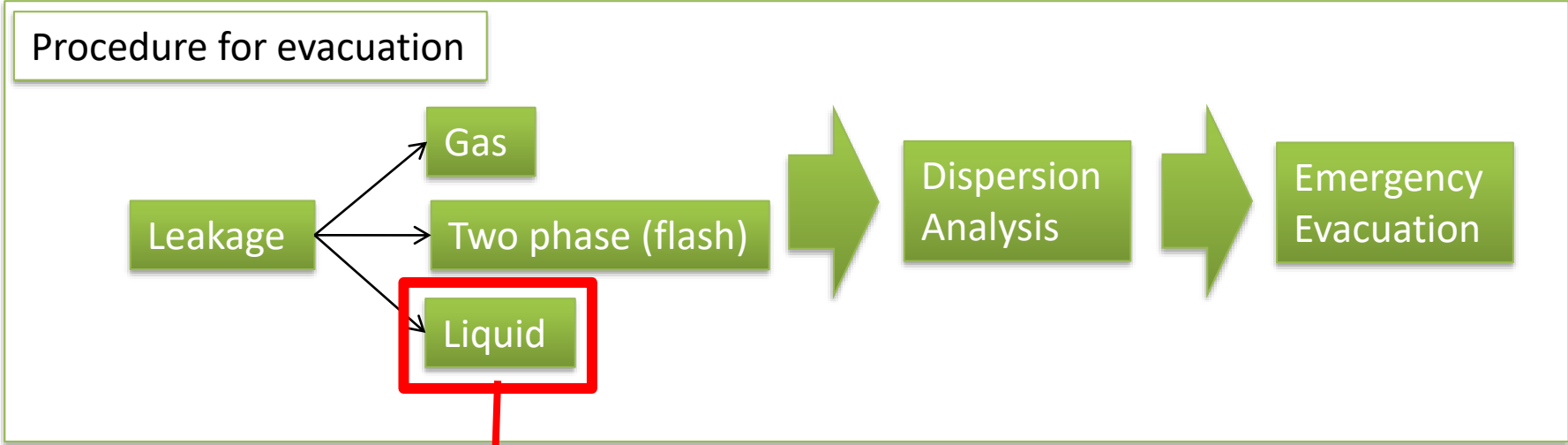
Time	2018/6/11
0:10	ENE
0:20	ENE
0:30	ENE
0:40	ENE
0:50	ENE
1:00	ENE
1:10	ENE
1:20	ENE
1:30	ENE
1:40	NE
1:50	NE
2:00	NE
2:10	NE
2:20	NE
2:30	NE
2:40	NE
2:50	ENE

Direction	Possibility(%)
N	65.1
NNE	60.6
NE	58.8
ENE	54.1
E	71.0
ESE	76.6
SE	60.9
SSE	68.4
S	42.4
SSW	78.3
SW	90.5
WSW	67.1
W	75.5
WNW	94.7
NW	85.7
NNW	75.4

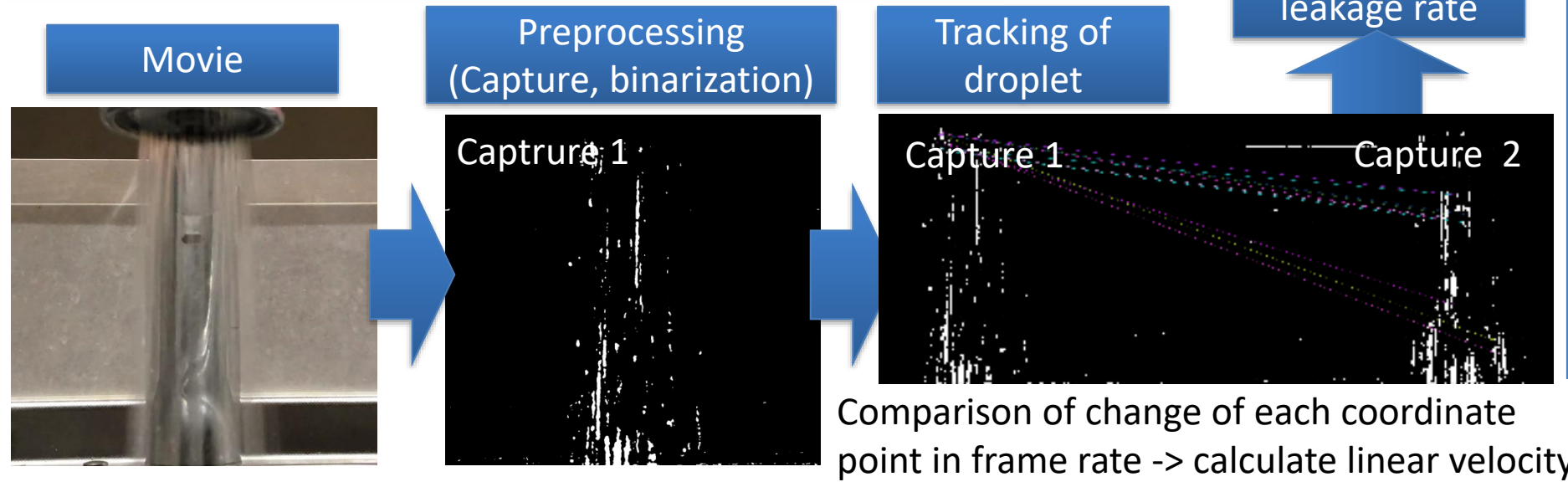
If gas sensors in manufacturing area can detect these directions, gas sensors at plant boundary would be reduced.

The combination of gas sensors in manufacturing area and plant boundary is effective.

# Estimation of leakage rate by motion analysis



## Motion analysis by OpenCV- Python (Raspberry Pi zero w)



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Aim : Solving all problems from leak detection to evacuation comprehensively, developing the emergency response plan, and deploying it to other factories to improve safety.

# Calculation by emergency evacuation model

Evacuation calculation model (Excel) : Everybody can use easily and obtain same result

**Explanation of color**

- Yellow: select from pull down
- Red: input value
- Blue: output value

Plant	A
Equipment	T-101
Substance	toxic
Leakage rate	10 kg/min
Hole diameter	3.0 mm
Wind direction	SE
Wind speed	1.5 m/sec
Atmospheric sta	F

Buttons: Obtain atm data, Cal dispersion, Draw consequence, Evacuation, Isolation

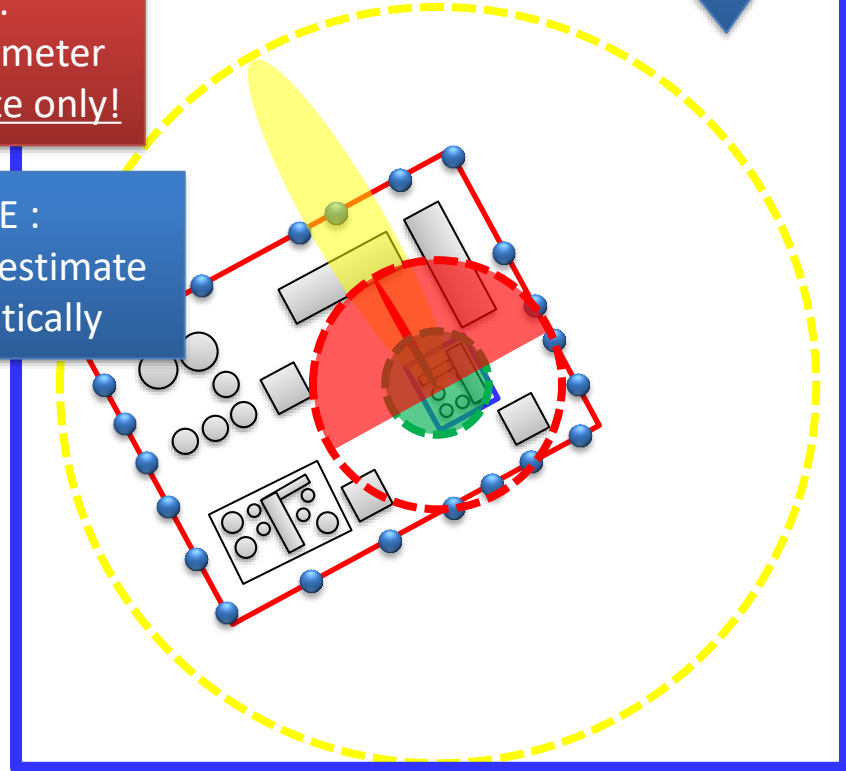
Thresholds	Concentration	Distance
PAC-3	500 ppm	100 m
PAC-2	100 ppm	250 m
PAC-1	10 ppm	800 m

**YELLOW :**  
Select values

**RED :**  
Input parameter  
Leakage rate only!

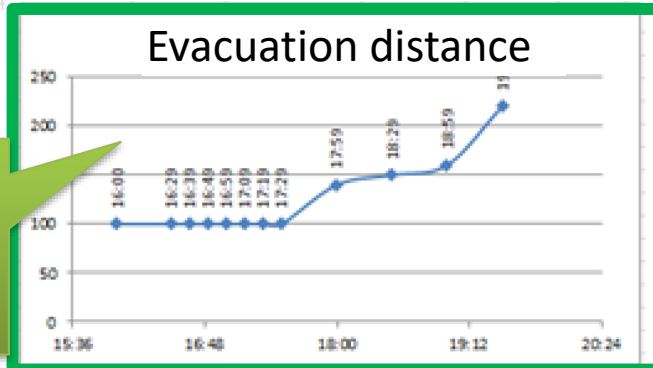
**BLUE :**  
Obtain or estimate  
automatically

Display of current  
dispersion and  
evacuation area



After input  
parameter, RED,  
push 4 buttons  
for calculation

Prediction of  
evacuation  
distance in near  
future

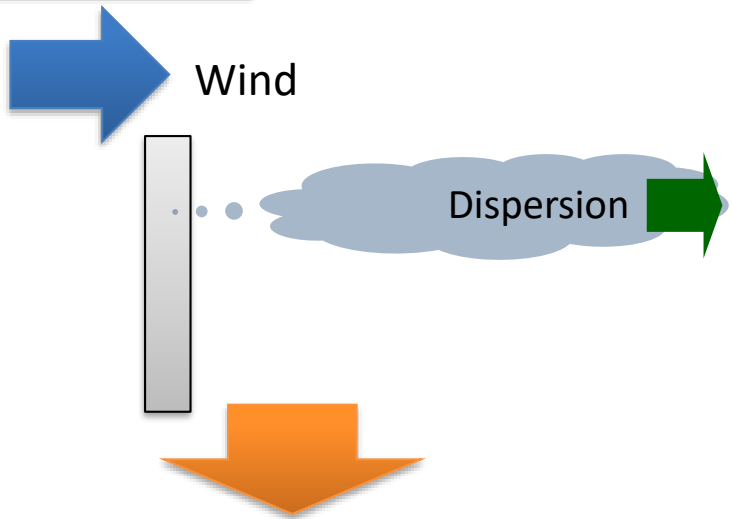


The model has online and offline mode,  
and online mode is introduced today

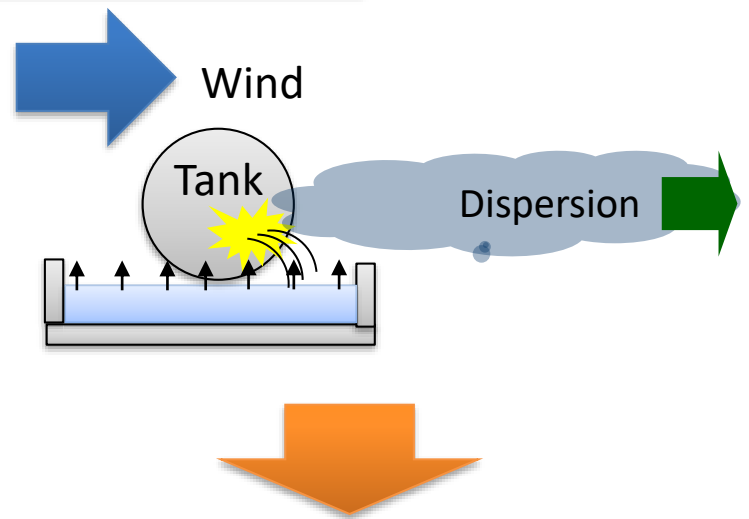
# Dispersion model – Pasquill Gifford Equation

Dispersion model is assumed release phase and pool evaporation

Leak as gas phase



Leak as liquid phase



Calculation of dispersion

$$C = \frac{Q}{2\pi \sigma_y \sigma_z u} F(y) F(z) \quad \text{Pasquill-Gifford (only passive dispersion)}$$

$$F(y) = \exp\left(-\frac{y^2}{2\sigma_y^2}\right)$$

$$F(z) = \exp\left\{-\frac{(H_e - z)^2}{2\sigma_z^2}\right\} + \left\{-\frac{(H_e + z)^2}{2\sigma_z^2}\right\}$$

Calculation of vaporization rate

$$\frac{\bar{S}b - 0.45}{0.6774\phi_m^{1/2}} = \left[1 + \left(\frac{\phi_m}{12,500}\right)^{3/5} / \left[1 + \left(\frac{300,000}{\phi_m}\right)^{7/2}\right]^{2/5}\right]^{1/2}$$

$$\phi_m = Re Sc^{2/3} / \left[1 + \left(\frac{0.0468}{Sc}\right)^{2/3}\right]^{1/2}$$



# Automatic acquisition of parameter for calculation 8/19

Data acquisition from HP of Japan Meteorological Agency  
 -> Decreasing required input parameters make everybody obtain same results

Time	Press(hPa)		Rain (mm)	Temp (C)	Dew (C)	Pvap (hPa)	Moist (%)	Wind		Sun (hr)	TASR (MJ/m <sup>2</sup> )	← Total amount of solar radiation
	Land	Sea						Speed	Direc			
7	1015.8	1019.2	--	13.1	3.2	7.7	51	6.1	N	0.3	0.52	
8	1016.6	1020.0	--	13.9	1.5	6.8	43	7.7	N	1.0	1.56	
9	1017.0	1020.4	--	14.5	1.4	6.8	41	8.0	N	1.0	2.29	
10	1017.4	1020.8	--	15.4	1.2	6.6	38	6.1	NNE	1.0	2.85	
11	1017.5	1020.9	--	15.3	1.8	7.0	40	7.0	NNE	1.0	3.22	
12	1017.3	1020.7	--	15.3	1.4	6.8	39	7.1	NNE	1.0	3.38	
13	1017.3	1020.7	--	15.1	1.6	6.9	40	6.6	NNE	1.0	3.28	
14	1017.1	1020.5	--	15.3	3.5	7.8	45	6.3	NE	1.0	2.94	
15	1017.3	1020.7	--	15.4	3.2	7.7	44	6.1	NNE	1.0	2.30	
16	1018.0	1021.4	--	15.4	3.5	7.9	45	6.0	NNE	1.0	1.69	
17	1018.7	1022.1	--	14.7	2.9	7.5	45	5.8	NNE	1.0	0.95	
18	1019.6	1023.0	--	13.7	4.3	8.3	53	7.2	NNE	0.5	0.27	

Solar radiation (0.01kW/m<sup>2</sup>)

48.1
43.3
63.6
79.2
89.4
93.9
91.1
81.7
63.9
46.9
26.4
15.0

Obtain meteorological data with one button by excel macro



Decide atmospheric stability and dispersion calculation are carried out automatically

Atmospheric stability

Wind Speed (m/s)	Daytime				Night
	Solar radiation (0.01kW/m <sup>2</sup> )				
	60<Q	30~59	15~29	1~14	
U<2.0	A	A-B	B	D	F
2.0~2.9	A-B	B	C	D	E
3.0~3.9	B	B-C	C	D	D
4.0~5.9	C	C-D	D	D	D
6.0<	C	D	D	D	D



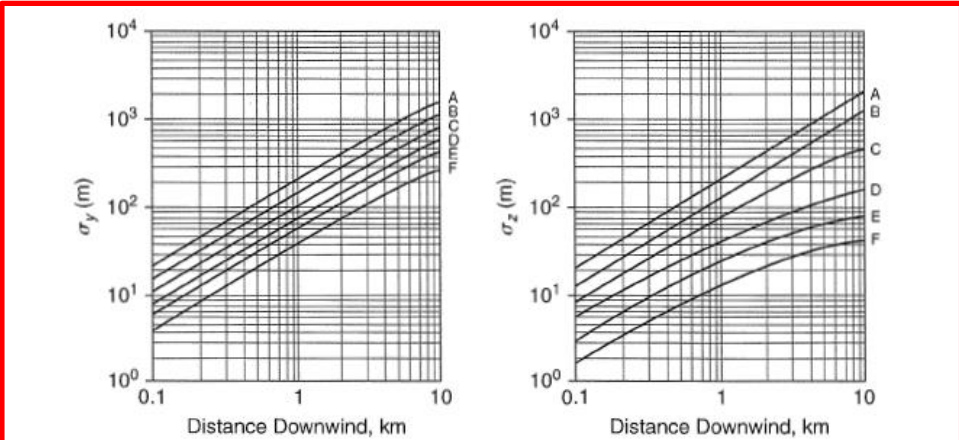
# Dispersion parameters for estimation

**Table 5-2** Recommended Equations for Pasquill-Gifford Dispersion Coefficients for Plume Dispersion<sup>a,b</sup> (the downwind distance  $x$  has units of meters)

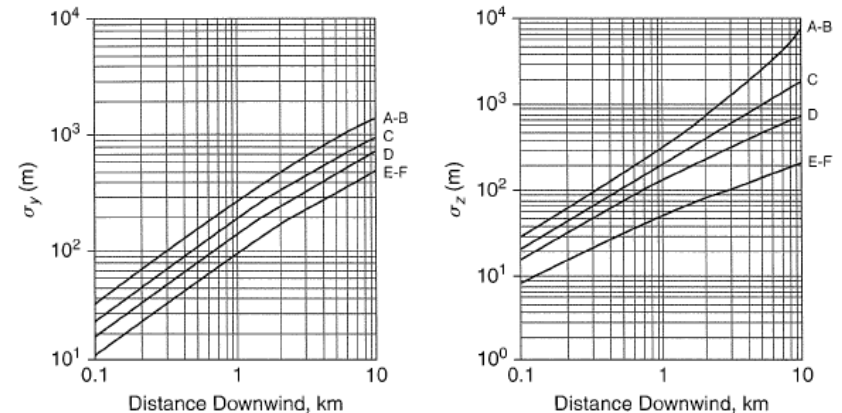
Pasquill-Gifford stability class	$\sigma_y$ (m)	$\sigma_z$ (m)
<b>Rural conditions</b>		
A	$0.22x(1 + 0.0001x)^{-1/2}$	$0.20x$
B	$0.16x(1 + 0.0001x)^{-1/2}$	$0.12x$
C	$0.11x(1 + 0.0001x)^{-1/2}$	$0.08x(1 + 0.0002x)^{-1/2}$
D	$0.08x(1 + 0.0001x)^{-1/2}$	$0.06x(1 + 0.0015x)^{-1/2}$
E	$0.06x(1 + 0.0001x)^{-1/2}$	$0.03x(1 + 0.0003x)^{-1}$
F	$0.04x(1 + 0.0001x)^{-1/2}$	$0.016x(1 + 0.0003x)^{-1}$
<b>Urban conditions</b>		
A-B	$0.32x(1 + 0.0004x)^{-1/2}$	$0.24x(1 + 0.001x)^{+1/2}$
C	$0.22x(1 + 0.0004x)^{-1/2}$	$0.20x$
D	$0.16x(1 + 0.0004x)^{-1/2}$	$0.14x(1 + 0.0003x)^{-1/2}$
E-F	$0.11x(1 + 0.0004x)^{-1/2}$	$0.08x(1 + 0.0015x)^{-1/2}$

Equation of dispersion

$$C = \frac{Q}{2\pi\sigma_y\sigma_z u} F(y)F(z)$$



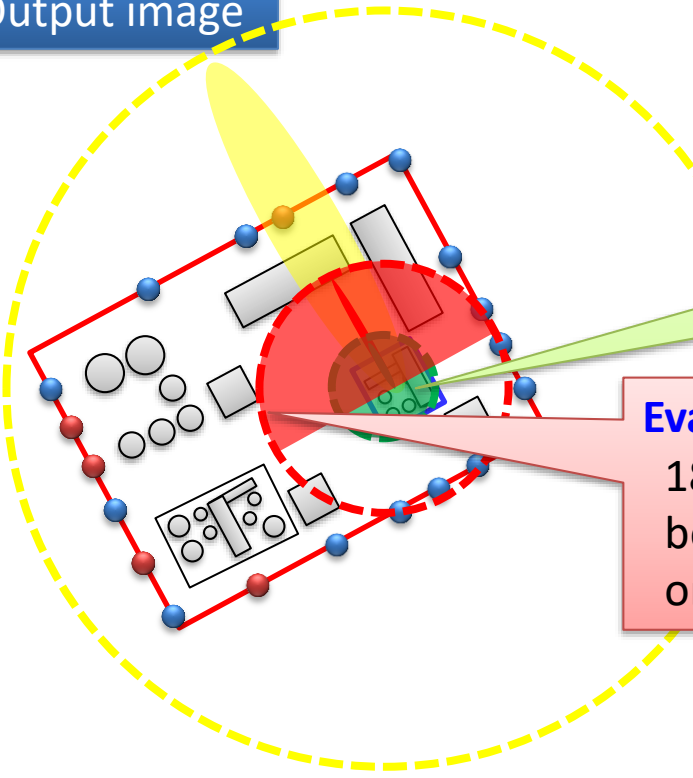
**Figure 5-10** Dispersion coefficients for Pasquill-Gifford plume model for rural releases



**Figure 5-11** Dispersion coefficients for Pasquill-Gifford plume model for urban releases.

# Output image- isolation and evacuation area

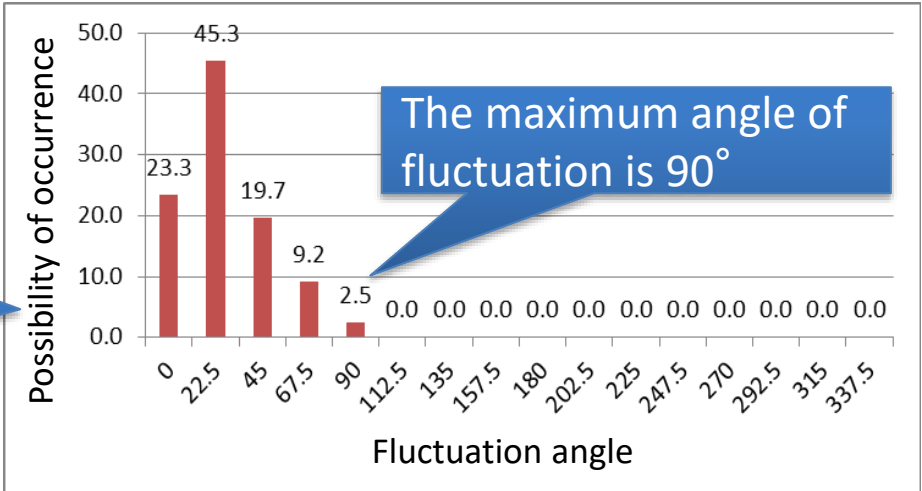
Output image



**Isolation area: PAC-3 (threat to human life)**  
 360° zone as isolation area  
 because diffusion in near field is tend to be influence by existing structures of chemical plant

**Evacuation area: PAC-2 (irreversible influence on human)**  
 180° zone of downwind  
 because the wind may fluctuate in the range of 90° on one side from the analysis of past 10 years

Collect wind direction data every 10min for the past 10yrs from JMA, and analyze 60 min of wind fluctuation



# Calculation by emergency evacuation model

Evacuation calculation model (Excel) : Everybody can use easily and obtain same result

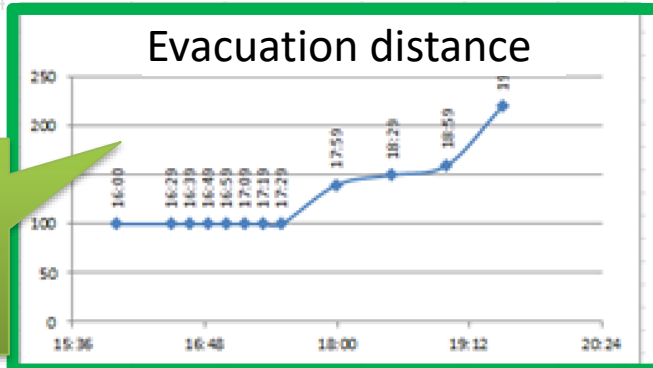
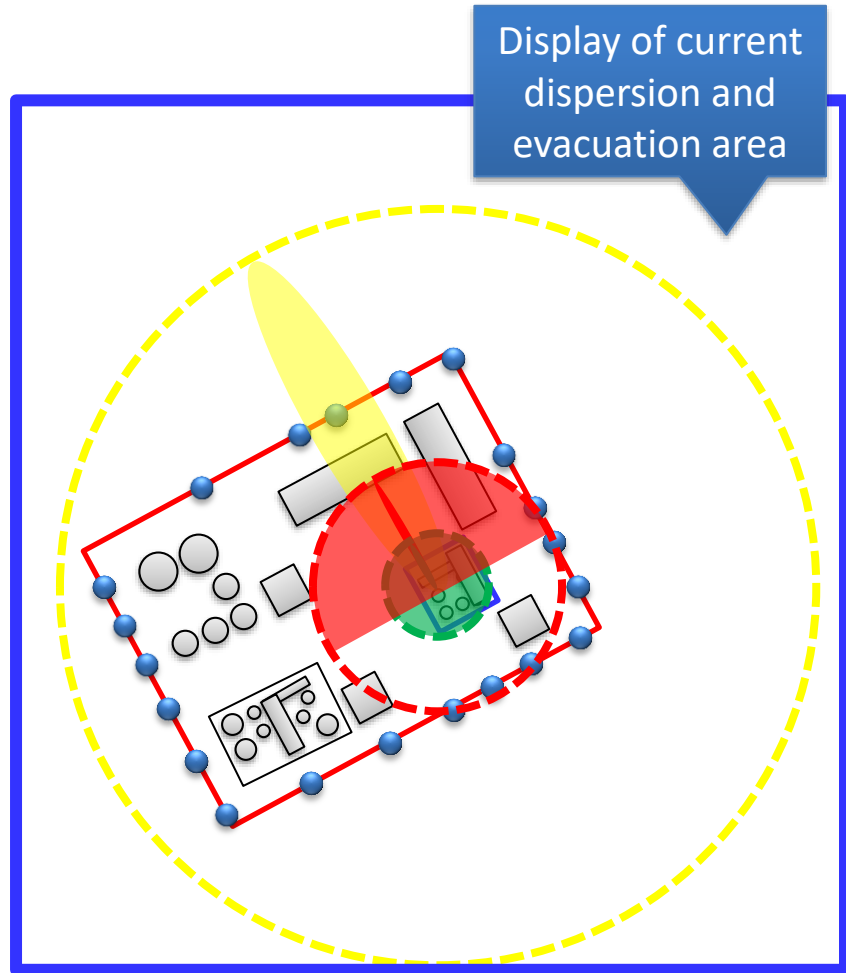
**Explanation of color**

- Yellow: select from pull down
- Red: input value
- Blue: output value

Obtain atm data	Plant	A
Cal dispersion	Equipment	T-101
Draw consequence	Substance	toxic
Evacuation, Isolation	Leakage rate	10 kg/min
	Hole diameter	3.0 mm
	Wind direction	SE
	Wind speed	1.5 m/sec
	Atmospheric sta	F

Calculation results		
Thresholds	Concentration	Distance
PAC-3	500 ppm	100 m
PAC-2	100 ppm	250 m
PAC-1	10 ppm	800 m



Prediction of evacuation distance in near future

The model of prediction in future evacuation distance is introduced in following slides

# Prediction of evacuation distance in future

Collect wind speed and duration of sunshine in 30 days automatically, and estimate them in 3 hrs. in future by cluster analysis

Time	Temperature deg.C	Rainfall mm	Wind Direction	Wind Speed m/s	Sunshine Duration
1	23.8	0	ENE	2.4	--
2	23.5	0	NE	1.3	--
3	23.6	0	NNE	1.1	--
4	23.7	0	NNE	1.5	0.0
5	23.5	0	NE	1.5	0.0
6	23.9	0	NE	2	0.0
7	24.4	0	N	2.5	0.0
8	25.2	0	NNE	2.8	0.5
9	26.2	0	N	2.9	0.7
10	26.5	0	NNE	2.6	0.7
11	26.1	0	NNE	2.2	0.1
	27.1	0	NE	3	0.8
	27.1	0	NE	2.9	0.8

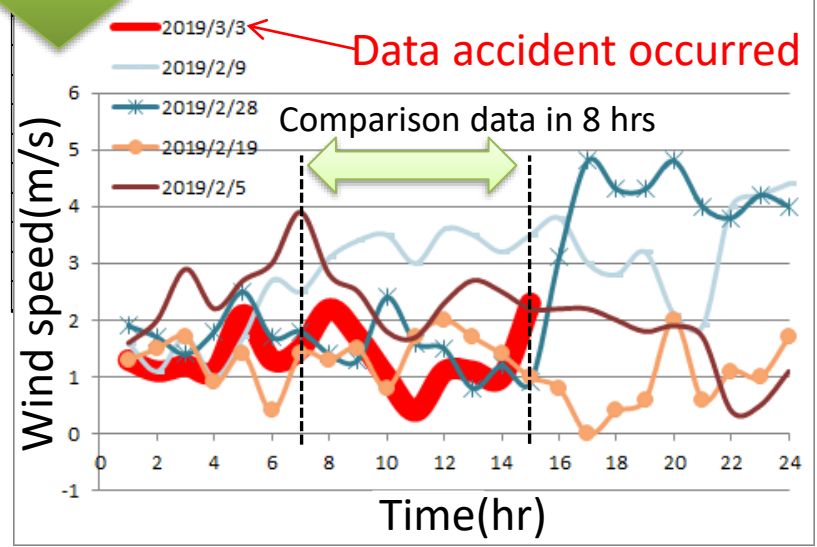
## Preprocessing of cluster analysis

Derivative wind speed is taken on the analysis instead of wind speed absolute value, because of strengthen of correlation to estimate wind speed in future.

Min-Max Normalization was carried out and data sets from 0 to 1 were created to use different dimensions data such as wind speed and sunshine duration.

$$X_{Norm} = \frac{X_{data} - x_{min}}{x_{max} - x_{min}}$$

The data used for cluster analysis is the data up to 8 hours before the current time, because the latest data is important. The period of wind speed change was about 4 hours, so 8 hours for 2 periods is used for the calculation.



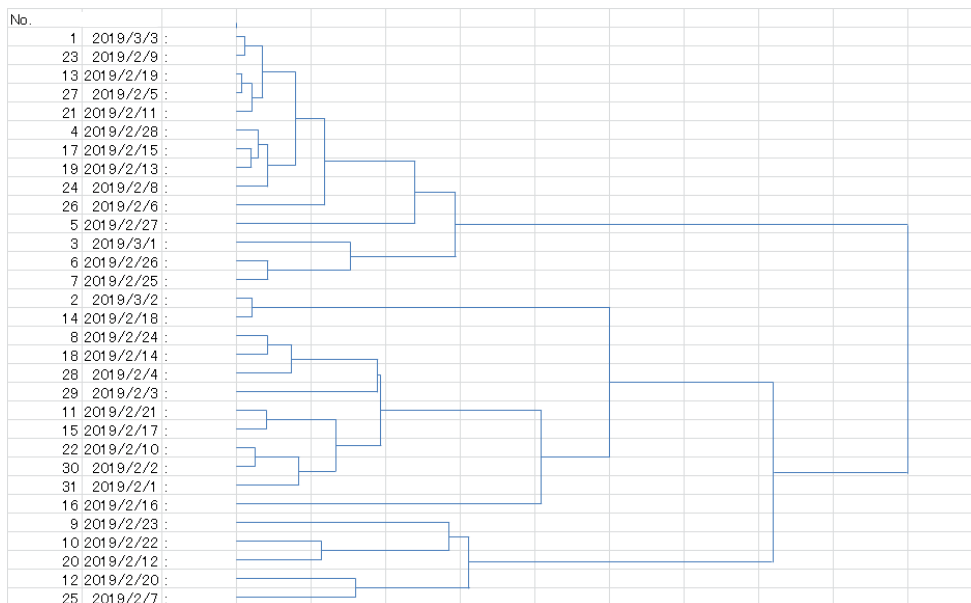
# Cluster analysis

The study of luster analysis is carried out by Ward method, minimum distance method and centroid method

- Euclid distance is taken on similarity distance
- Cluster analysis is carried out by following equation  
Weighting is carried out by among current time and reference time, because data of nearer time is more important.

$$d(A, B) = \sqrt{\sum_{n=0}^8 \frac{1}{t - (t - n) + 1} (A_{t-n}|ws - B_{t-n}|ws) + \sum_{n=0}^8 \frac{1}{t - (t - n) + 1} (A_{t-n}|sd - B_{t-n}|sd)}$$

ws: wind speed  
sd: sunshine duration



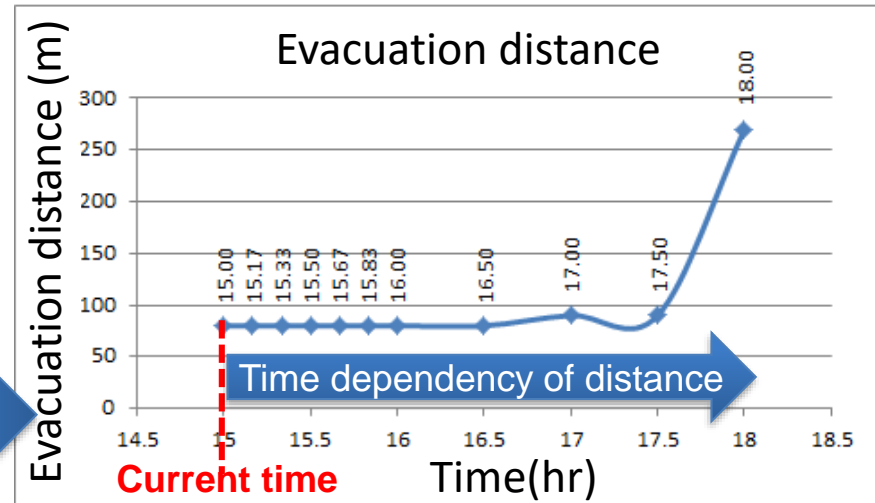
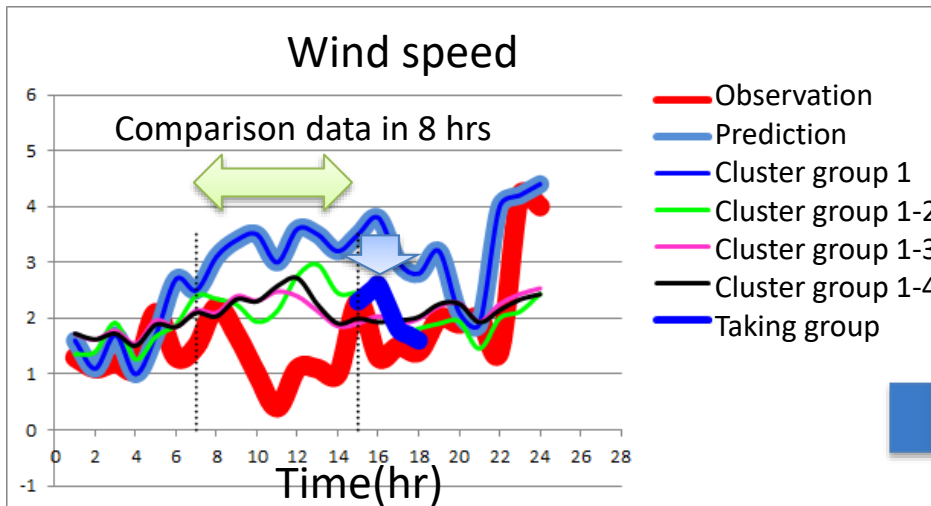
Analysis method	RMSE (m/s)
Ward	0.82
Min. distance	1.12
Centroid	1.06

Ward method is taken for cluster analysis by the result of RMSE.

# The prediction of evacuation distance by 3 hours in future

14/19

The cluster group having correlation to current wind speed and duration of sunshine is adopted for the prediction model.



Estimated value is deviation of wind speed, and absolute value of wind speed should be corrected corresponding to current wind speed.

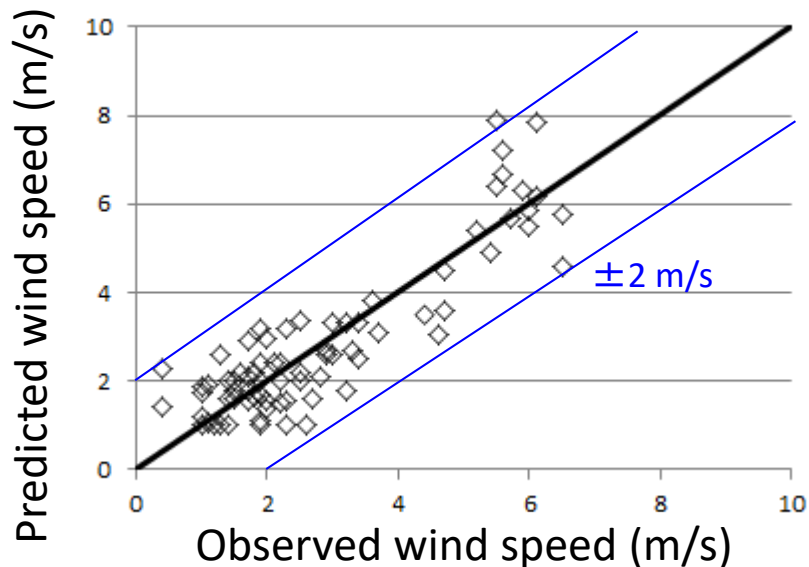
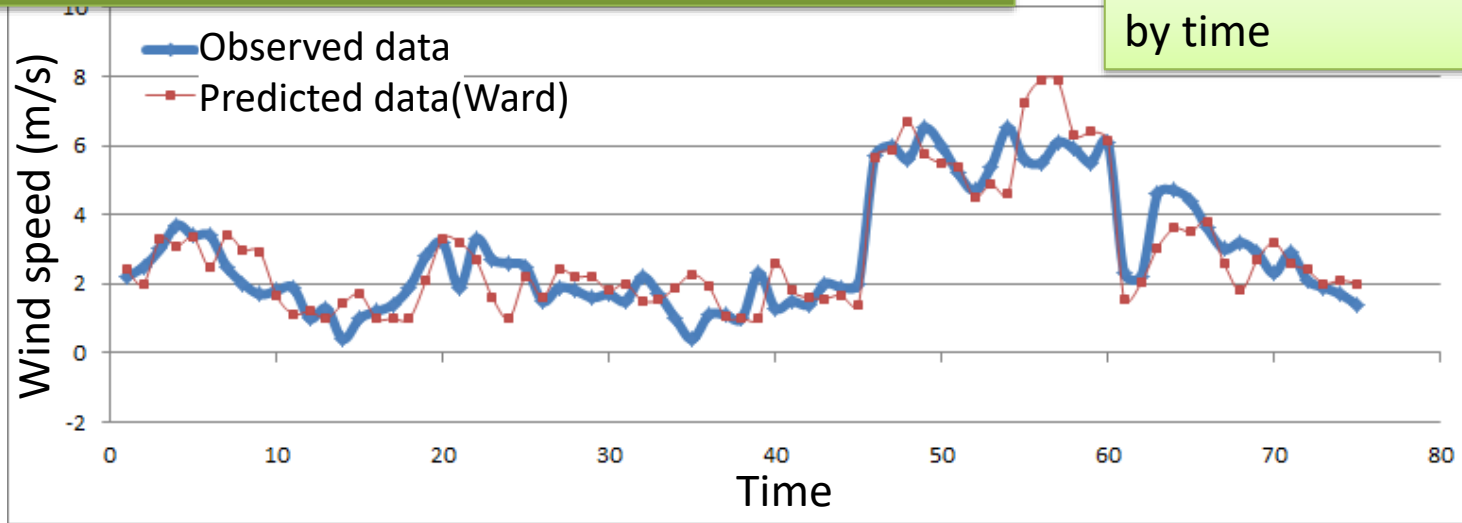
Estimate evacuation distance by 3 hours in future, and recognize necessity of preparation for increase of evacuation distance

Especially, the atmospheric condition is stable at sunset and the evacuation distance is increased, so it is considered that the prior prediction is very effective.

# Accuracy of predicted wind speed

Comparison of predicted wind speed with observed one

Plotted continuously  
by time



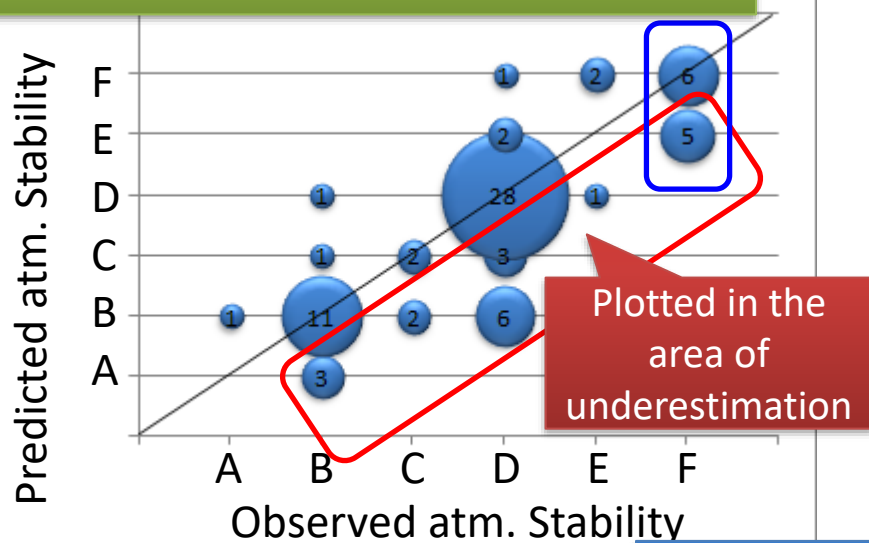
The tendency of wind speed almost  
can be estimated



However, the accuracy of prediction is about  $\pm 2$  m/s at maximum  
 $\Leftrightarrow$  If the wind speed is low, the relative error will increase. It becomes a factor to deteriorate the accuracy of evacuation distance estimation

# Accuracy of predicted atmospheric stability

## Comparison of predicted atmospheric stability with observed one



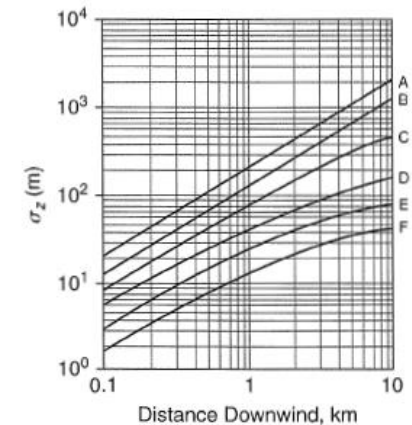
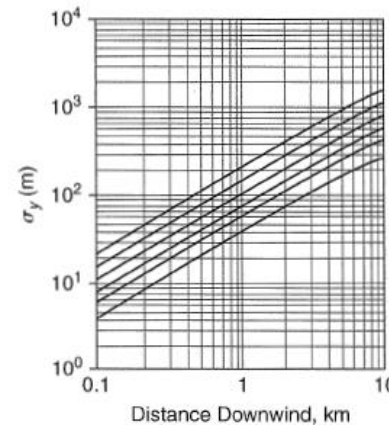
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$$F(y) = \exp\left\{-\frac{y^2}{2\sigma_y^2}\right\}$$

$$F(z) = \exp\left\{-\frac{(H_e - z)^2}{2\sigma_z^2}\right\} + \left\{-\frac{(H_e + z)^2}{2\sigma_z^2}\right\}$$

Evacuation distance increases as A → F



## Judgment of atm. Stability

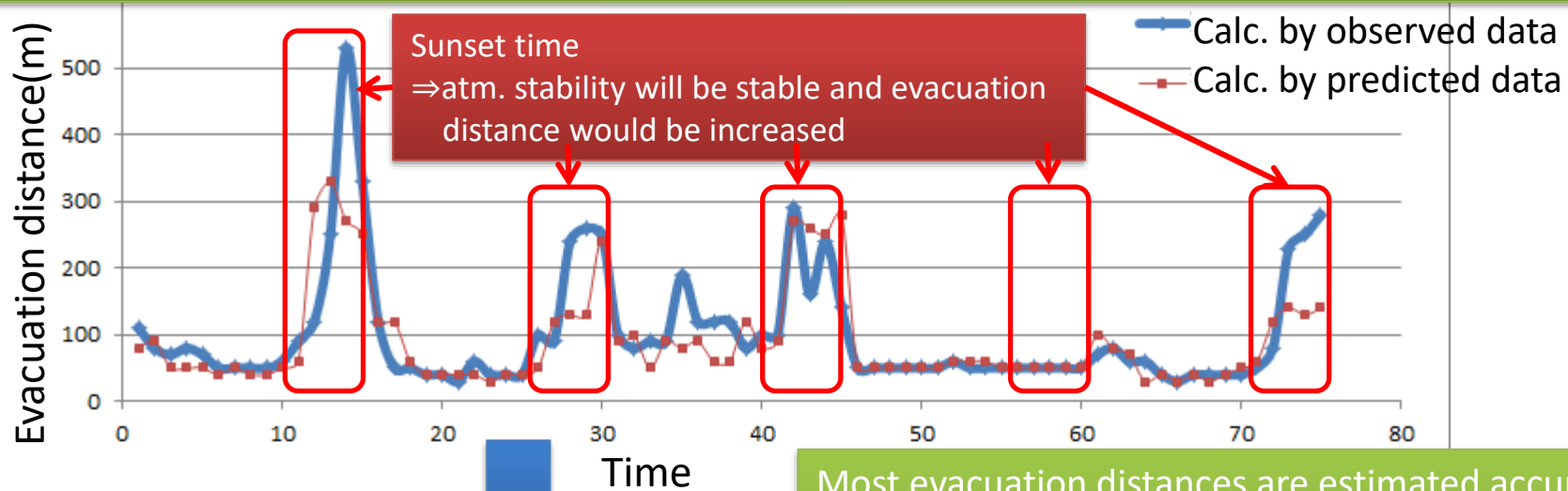
Wind Speed (m/s)	Daytime				Night
	Solar radiation (0.01kW/m <sup>2</sup> )				
	60<0	30~59	15~29	1~14	
U<2.0	A	A-B	B	D	F
2.0~2.9	A-B	B	C	D	E
3.0~3.9	B	B-C	C	D	D
4.0~5.9	C	C-D	D	D	D
6.0<	C	D	D	D	D

Accuracy of predicted atm. stability is important, because parameter taken for calculation is changed by it.



# Accuracy of predicted evacuation distance

## Comparison of evacuation distance calculated by predicted atm. condition with observed one



Most evacuation distances are estimated accurately, but there are some plots not matching in case of sudden change of wind speed

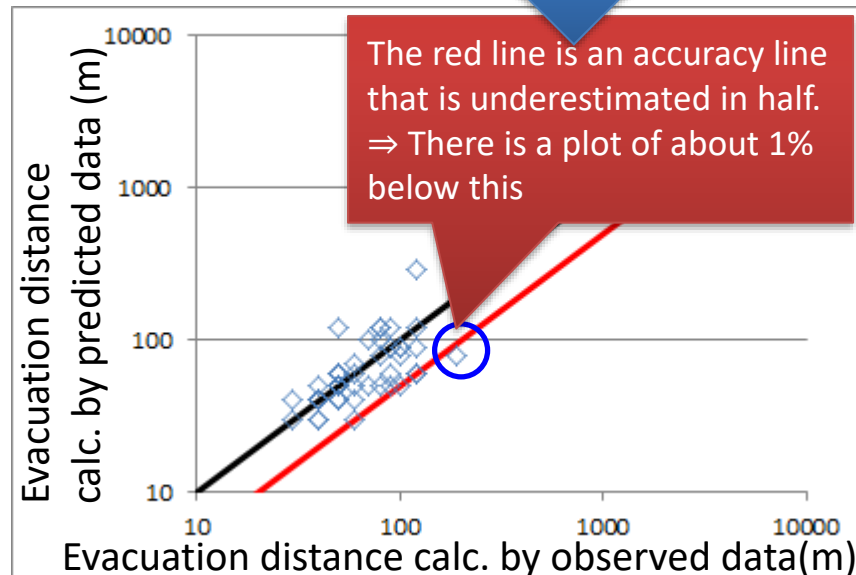
### 【Current operation】

It is possible to estimate the evacuation distance in advance with an accuracy of approximately 99% without underestimation, by adopting a distance that is twice the predicted distance as the evacuation distance as the safety factor.



### 【Future plan】

The study of increasing accuracy about data set having large predicting error, especially atmospheric stability F.



# Summery and future plans

Technical approaches are studied for each problems in order to construct comprehensive emergency response plan. The problems are still remain for completion and continue to study below items.

## Problems of current evacuation system

## Improvement studies

## Future plans

Detection

- Accurate detection for the leakage of toxic substances

- Optimization of locations of gas sensors –plant boundary and manufacturing area

- Study many case studies and make some simple dispersion model to implement them easily

Estimation of leakage rate

- A diameter, which is an input parameter of current model, is not appropriate in accidents

- The estimation of leakage rate by image analysis (Python-OpenCV)

- (same as left)

Estimation of dispersion area

- Case study is unable, because estimation results calculated by TRACE are prepared and refer nearest situation

- Making dispersion model which is easy to use and is able to predict near future evacuation area

- Improving prediction model and check accuracy for various conditions

Evacuation

- The rule is not decided for the evacuation zone and zone of emergency operation for shut down of chemical plant

- Decide threshold
- Make a rule for evacuation zone and emergency operation zone

- (Finished)

This presentation  
(Red area)



# Thank you for your attention!

Yuto Mizuta  
Safety Engineering Center  
Mitsubishi Chemical