

**Exercise** : Producing site-specific guidance using domestic data

Akira Ito &

Staffs of seasonal forecast sector

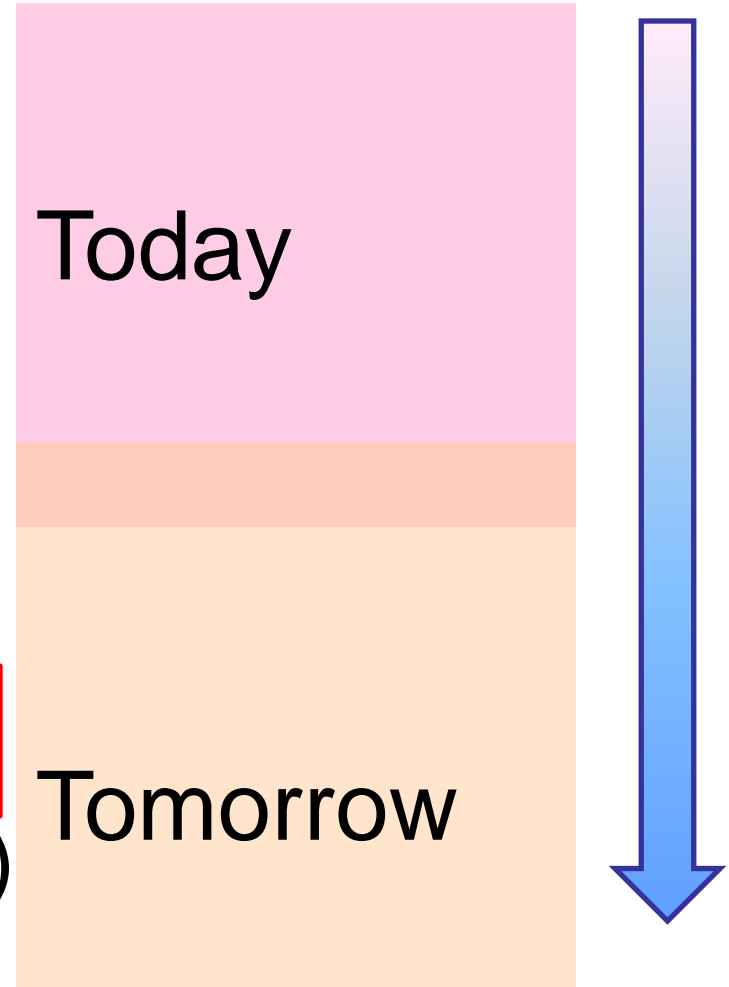
Climate Prediction Division  
Japan Meteorological Agency

# Objectives

- To clarify how to produce guidance for surface temperature and precipitation.
- To identify effective predictors.
- To verify guidance based on deterministic and probabilistic methods.
- To produce one-month forecasts using guidance and the latest numerical prediction.

# Procedures

1. Single regression model
2. Multiple regression model
3. Probabilistic forecast
4. Verification
5. Production of one-month forecasts for Nov. 2011
6. Creation of presentations
7. Presentations (10 minutes)



# 6. Creation of Presentations

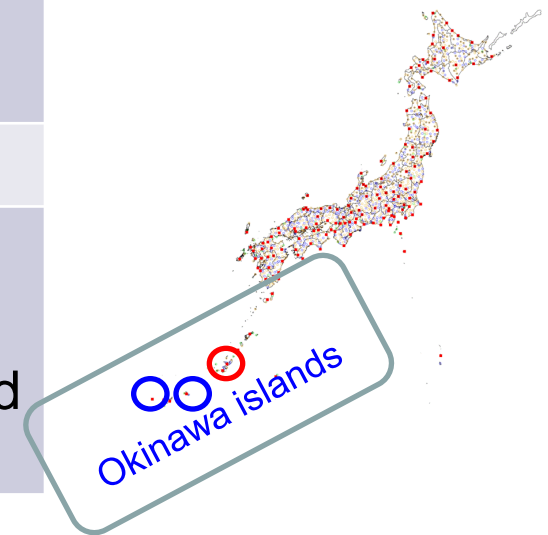
## An example

- What predictors do you use?
- Why do you select the predictors?
  - By ITACS regression tools, statistical relationship, traditional, ...
- Verification results
- Forecasts for your country

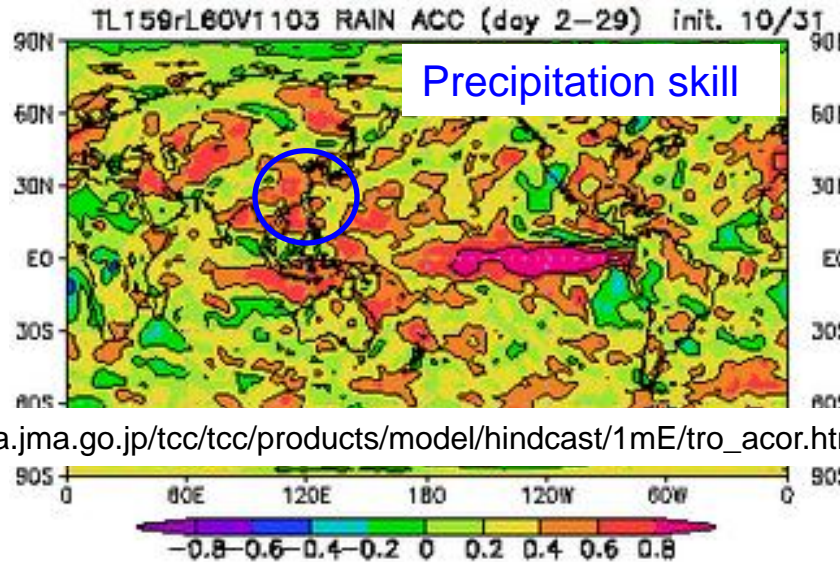
The duration should be around 10 minutes per person.

# Summary of the guidance

Station	Naha	Naha
Season	November	November
Predictand	Precipitation	Temperature
Predictors	Model precipitation, Tsurf,V850	T850,V1000, Model precipitation
Correlation	0.61	0.56
Brier Skill Score	0.15 ( including Ishigakijima and Miyakojima )	0.28 ( including Ishigakijima and Miyakojima )



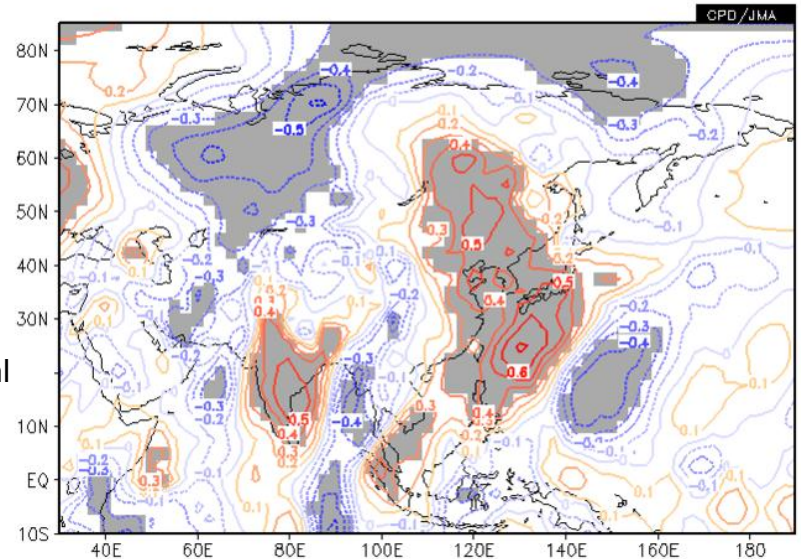
## The reason I select the predictors



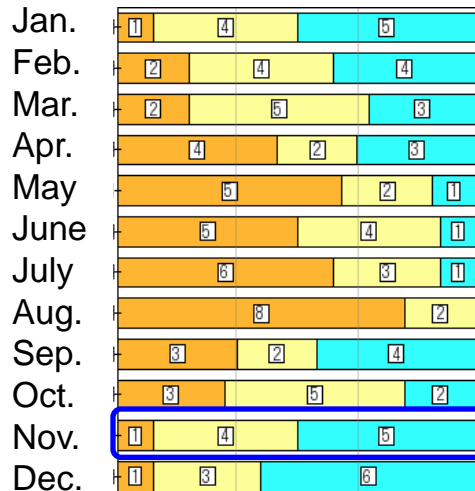
[http://ds.data.jma.go.jp/tcc/tcc/products/model/hindcast/1mE/tro\\_acor.html](http://ds.data.jma.go.jp/tcc/tcc/products/model/hindcast/1mE/tro_acor.html)

DATA1 JRA-JCDAS v23 ANOM lat = -10:85 lon = 30:190 level = 3:3  
time = 1979110100:2010110100 ave = 1MONTH

DATA2 USER\_INPUT USER\_INPUT1 HIST lat = -90:90 lon = 0:360 level = 1:1  
time = 1979110100:2010110100 ave = 1MONTH analysis method = CORRELATION



### Relationship between temperature and precipitation in observation data



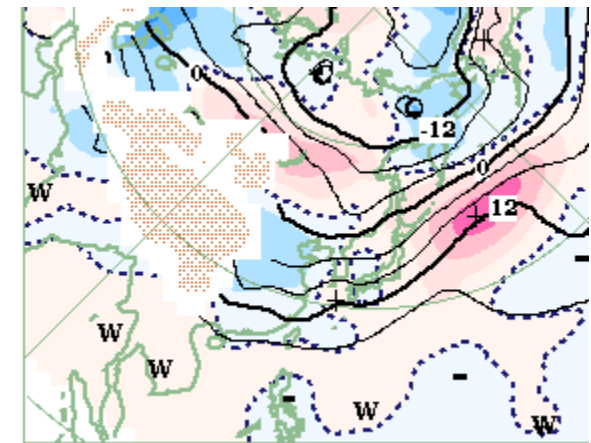
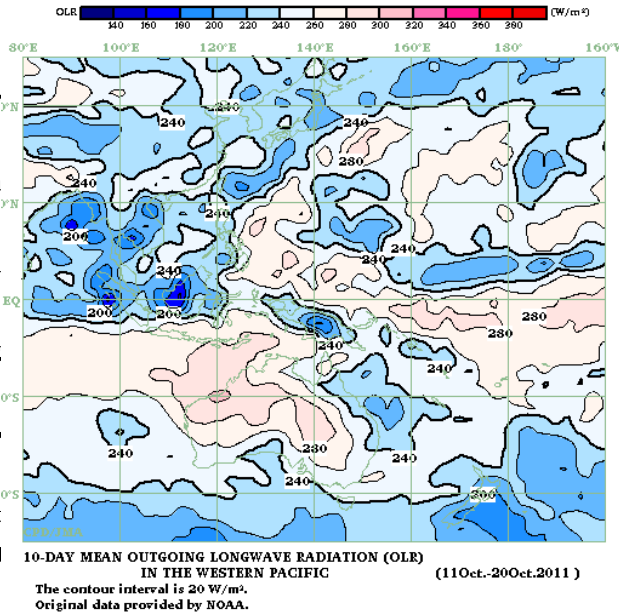
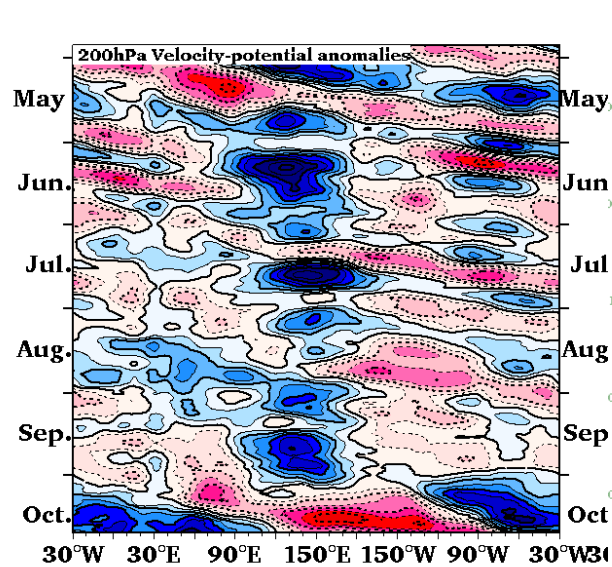
The precipitation skill around Naha is relatively high.

The 850 hPa meridional wind ( $V$ ) is deeply associated with November precipitation over Naha.

Surface temperature has positive relationship with precipitation in the past observation data.

So they are likely to be useful as predictors.

# Current condition



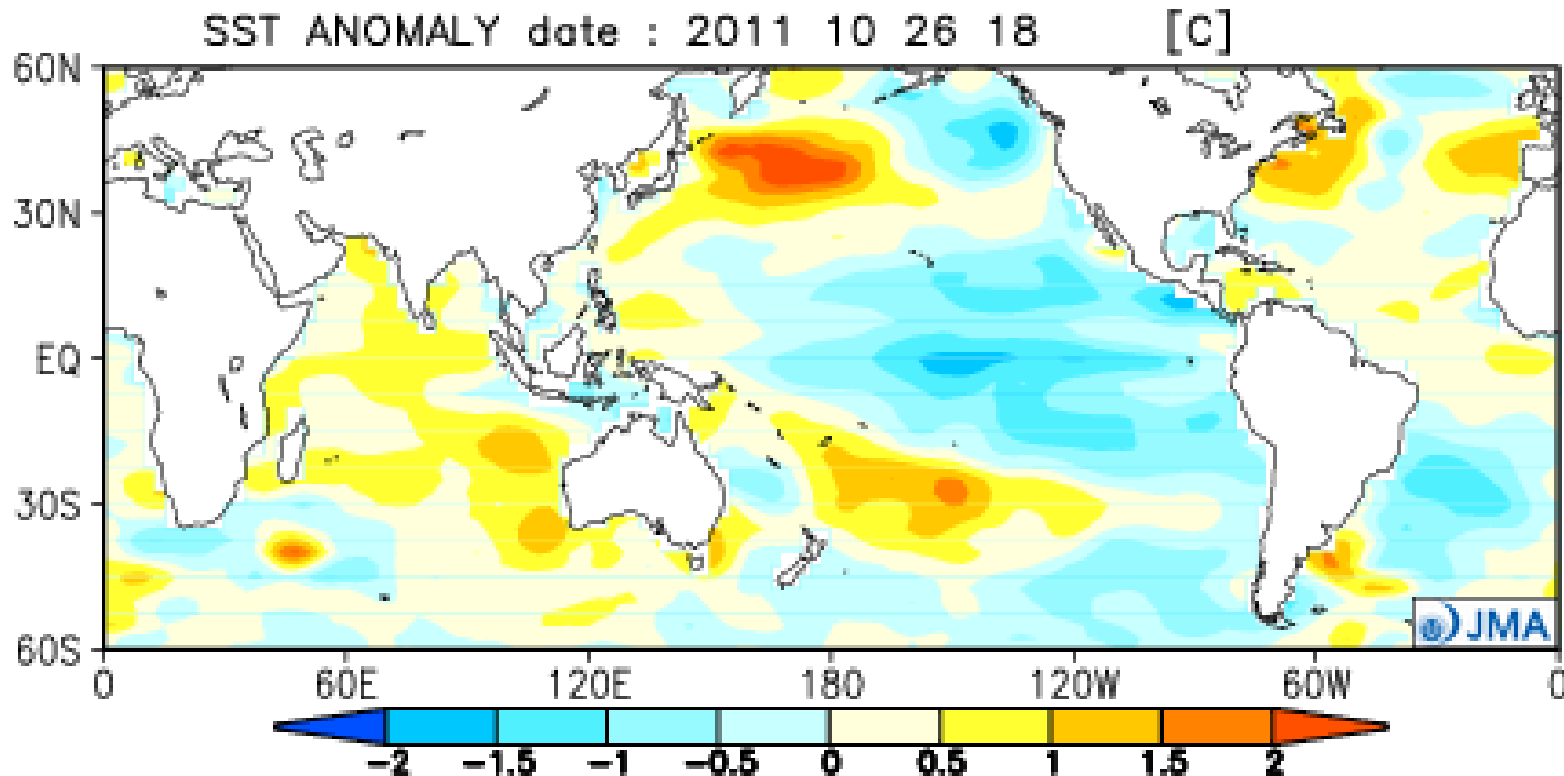
Time-Longitude Cross Section of 200hPa Velocity Potential for MJO monitoring

OLR Anomaly (11 – 20 Oct.)

T850 (23 – 27 Oct.)

# Initial condition

26 Oct. 2011



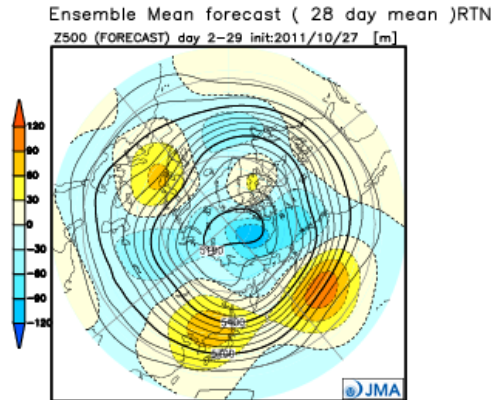
La Niña-like pattern



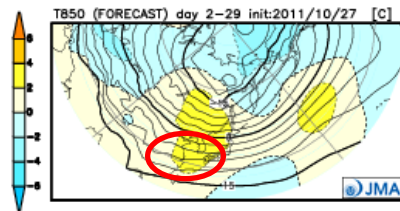
# Numerical prediction

Initial date: 27 Oct. 2011  
day 2-29

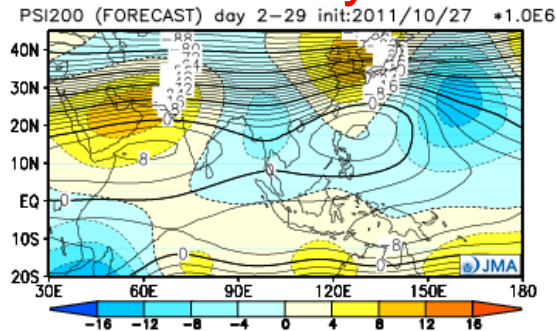
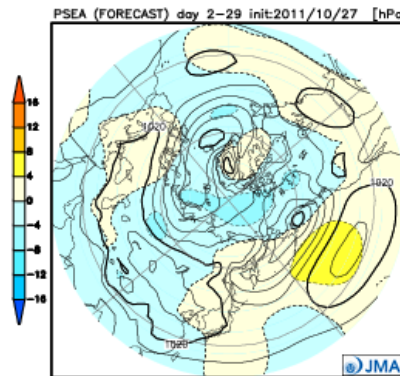
Z500



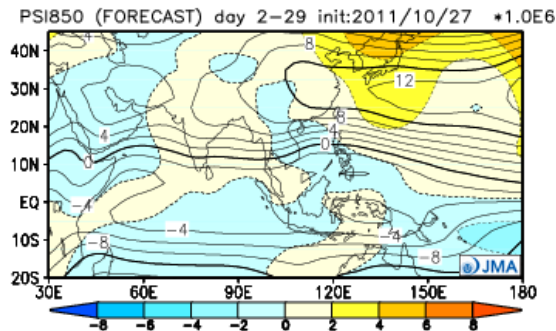
T850



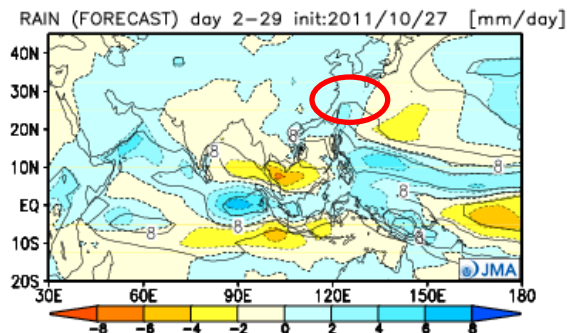
SLP



stream function  
at 200 hPa



stream function  
at 850 hPa



Precipitation

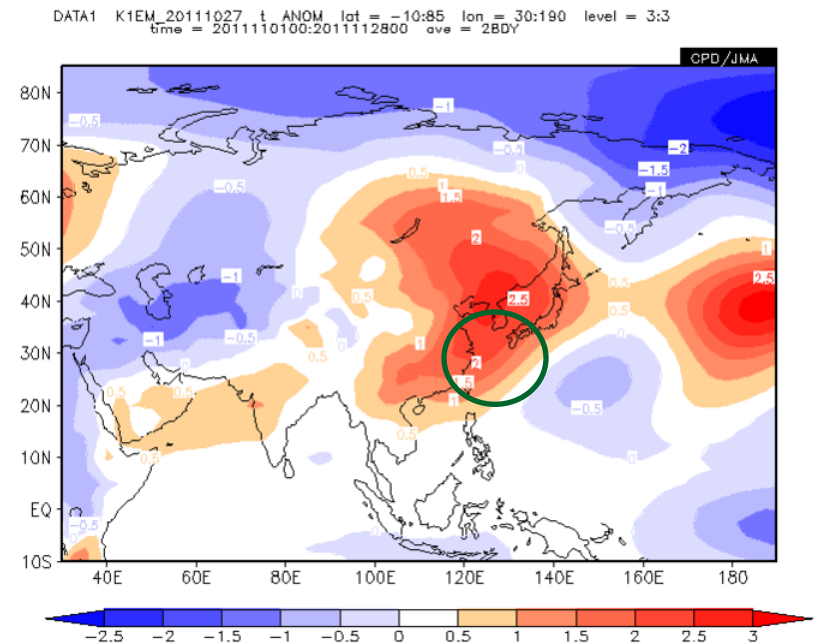
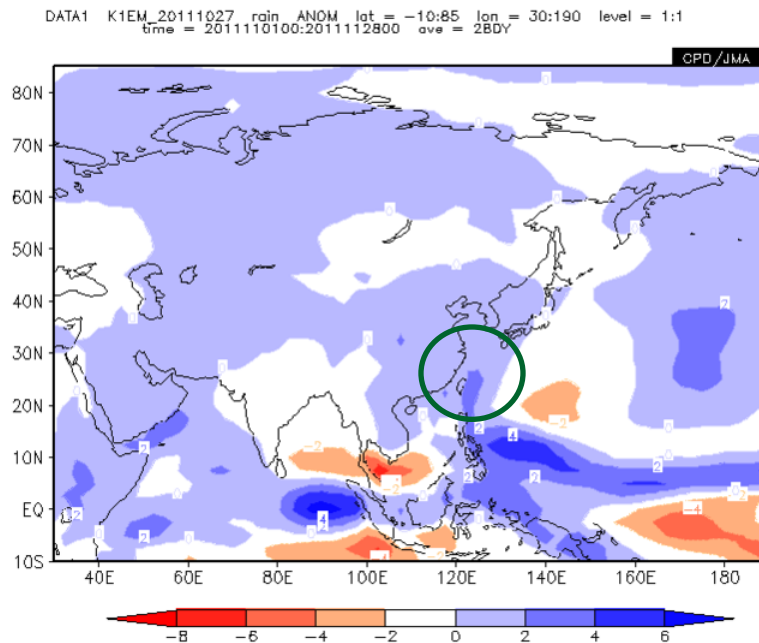
# Numerical prediction

Example

Initial date: 27 Oct. 2011  
Target: 1<sup>st</sup> – 28<sup>th</sup> November

Precipitation

T850



# Guidance

Station : Naha  
Period : November

## Precipitation

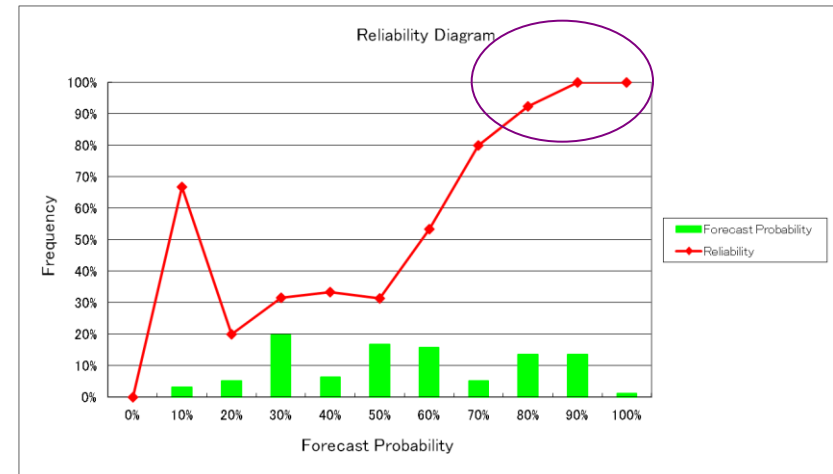
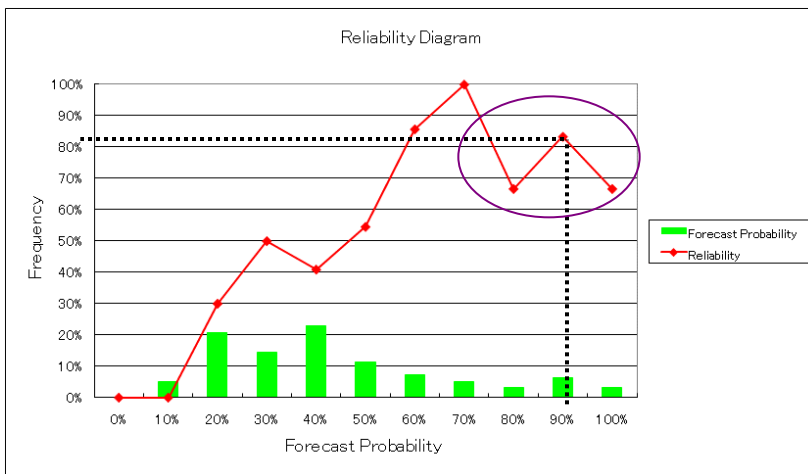
Predictors	Prediction
Model precipitation	4.69 mm/day
Tsurf	297.8 K
V850	-0.46 m/s

## Temperature

Predictors	Prediction
T850	287.2 K
V1000	-4.03 m/s
Model precipitation	4.69 mm/day

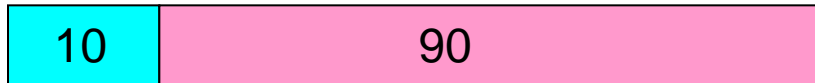
**Prob. of above-normal precipitation 90%**

**Prob. of above-normal temperature 91%**



## Summary of one-month forecasts for Naha

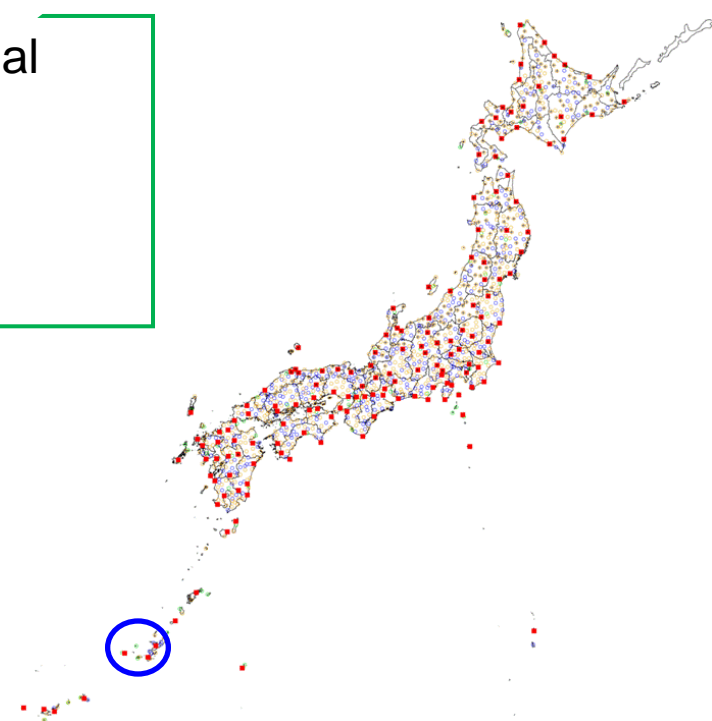
Average temperature is likely to be above-normal with 90% probability in Naha.



Precipitation amount is likely to be above-normal with 80% probability in Naha.

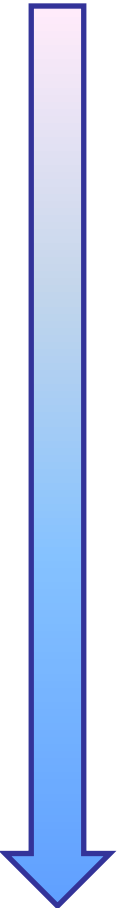
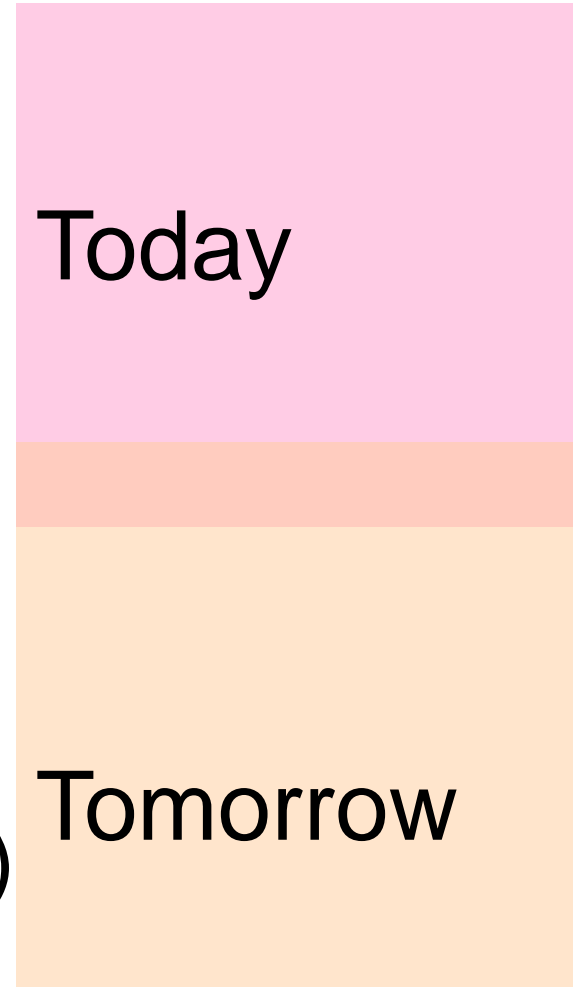


Create a presentation with your originality.



# Procedures

1. Single regression model
2. Multiple regression model
3. Probabilistic forecast
4. Verification
5. Production of one-month forecasts for Nov. 2011
6. Creation of presentations
7. Presentations (10 minutes)



# Preparation

- Observation data (by trainees)
- Predictors
  - GPV data over trainees' stations in hindcast  
(init. 31<sup>st</sup> Oct. 1979 - 2010) *HindcastGPV.xls*
  - GPV data for latest prediction (init. 27<sup>th</sup> Oct. 2011)  
*LatestPredictionGPV.xls*
- Excel software for producing guidance  
*Exercise for Guidance.xls*
- Textbook  
*Exercise for Guidance.doc*

# Predictors ( prepared )

- Model precipitation
- Temperature at Surface, 850hPa and 700hPa
- Wind (u, v) at 1000hPa and 850hPa
- Relative humidity at 850hPa

If you need any other variables, we will prepare them as soon as possible.

# Forecast Periods

- November (necessary)

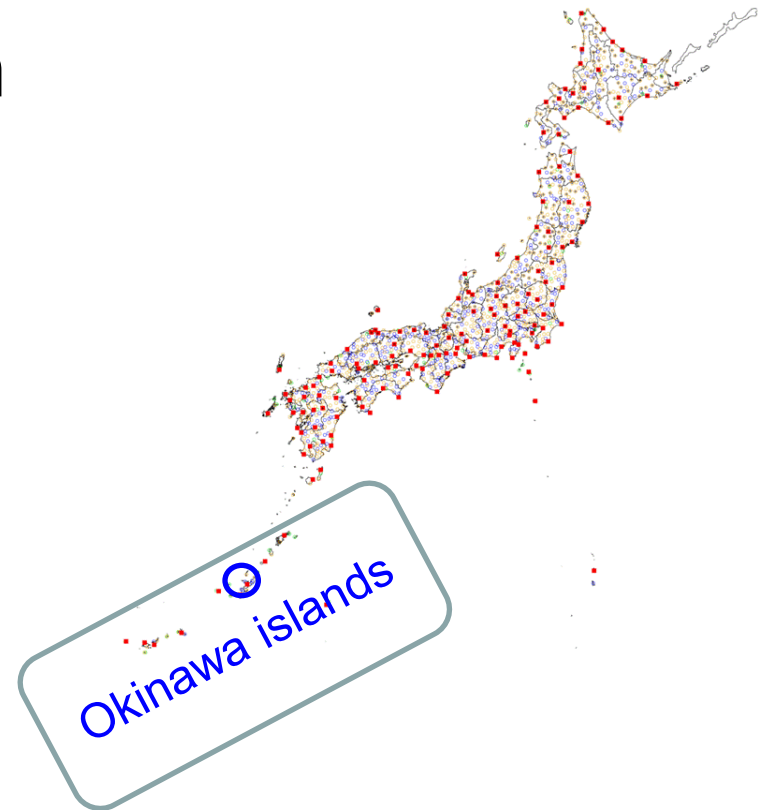
If you have enough time,

- Weekly ( 1<sup>st</sup> week, 2<sup>nd</sup> week, 3<sup>rd</sup> and 4<sup>th</sup> week)
- The first half of the month ( 1 Nov. – 14 Nov.)
- The second half of the month ( 15 Nov. – 28 Nov.)



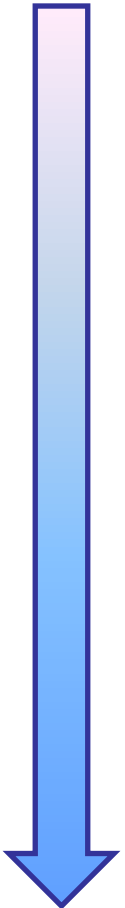
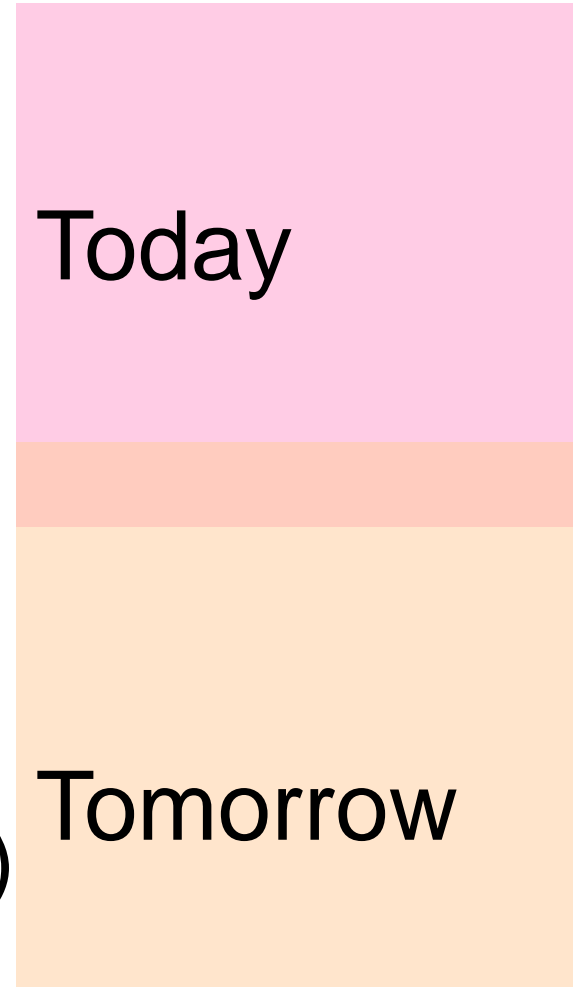
# Example Description

- Target Station : Naha
- Forecast Period : November
- Predictand : Precipitation  
(objective variable)
- Predictors : ○, △, □
- Normalization : Done



# Procedures

1. Single regression model
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# 1. Single Regression Model

- Open “Exercise for Guidance.xls”.
- Paste the observation data into the Temperature/Precipitation worksheet.

ExerciseForGuidance2011 [互換モード] - Microsoft Excel

ホーム 挿入 ページレイアウト 数式 データ 校閲 表示 Acrobat

標準 ページレイアウト 改ページプレビュー ユーザー設定のビュー 全画面表示

ルーター 枠線 メッセージバー 表示/非表示

数式バー 見出し

ズーム 100% 選択範囲に合わせて拡大/縮小

新しいウィンドウを開く

分割

並べて比較 同時にスクロール 元の位置に戻す

表示しない 再表示

作業状態の保存 ウィンドウの切り替え

マクロ

H2O

1	Naha	Year	Target	Observation	Forecast	Probabilistic Forecast
2			UJA/DJF	Precipitation	%	N(%), $\sigma n$
3				deg mm	power of 1/4	Prob of above-normal
4				deg mm <sup>0.25</sup>	Predictor 1	
5					Predictor 2	
6					Predictor 3	
7					power of 4	
8					$\sigma^2$	
9	1979	NDV		282.5		
10	1980	NDV		197.5		
11	1981	NDV		71.0		
12	1982	NDV		199.0		
13	1983	NDV		5.0		
14	1984	NDV		119.0		
15	1985	NDV		91.0		
16	1986	NDV		120.5		
17	1987	NDV		174.0		
18	1988	NDV		49.5		
19	1989	NDV		135.5		
20	1990	NDV		140.0		
21	1991	NDV		45.0		
22	1992	NDV		125.5		
23	1993	NDV		143.0		
24	1994	NDV		84.5		
25	1995	NDV		148.5		
26	1996	NDV		39.5		
27	1997	NDV		181.5		
28	1998	NDV		194.0		
29	1999	NDV		85.5		
30	2000	NDV		292.5		
31	2001	NDV		3.5		
32	2002	NDV		28.5		
33	2003	NDV		120.0		
34	2004	NDV		88.5		
35	2005	NDV		48.0		
36	2006	NDV		118.5		
37	2007	NDV		104.0		
38	2008	NDV		119.0		
39	2009	NDV		145.5		
40	2010	NDV		194.0		
41	Normal			114.2		
42	Single Regression	slope		#DIV/0!	#DIV/0!	#DIV/0!
43		intercept		#DIV/0!	#DIV/0!	#DIV/0!
44		Correlation		#DIV/0!	#DIV/0!	#DIV/0!
45						
46	Multi Regression	slope		#VALUE!	#VALUE!	#VALUE!
47		intercept		#VALUE!		
48		Correlation		#DIV/0!		
49						
50						
51						
52						
53						

Paste the observation data for which guidance is to be produced.

Time Series of forecast and observation

Scatter Plot

# 1. Single Regression Model

- Calculate the power of  $\frac{1}{4}$  for normalization in case of precipitation.
- Calculate normal value from 1979 to 2010.

The screenshot shows an Excel spreadsheet with the following data and charts:

Year	Target	Precipitation	power of 1/4	Predictor 1	Predictor 2	Predictor 3	Forecast	power of 4	$\sigma^2$	Probabilistic Forecast
1979	NDV	292.3	4.93							
1980	NDV	197.5	3.75							
1981	NDV	71.0	2.90							
1982	NDV	199.0	3.76							
1983	NDV	5.0	1.50							
1984	NDV	119.0	3.30							
1985	NDV	91.0	3.09							
1986	NDV	120.5	3.31							
1987	NDV	174.0	3.83							
1988	NDV	49.5	2.85							
1989	NDV	135.3	3.43							
1990	NDV	140.0	3.44							
1991	NDV	45.0	2.59							
1992	NDV	125.5	3.35							
1993	NDV	143.0	3.46							
1994	NDV	64.5	2.83							
1995	NDV	148.5	3.49							
1996	NDV	39.5	2.51							
1997	NDV	161.5	3.36							
1998	NDV	164.0	3.38							
1999	NDV	88.5	2.86							
2000	NDV	292.3	4.14							
2001	NDV	9.5	1.37							
2002	NDV	28.5	2.21							
2003	NDV	120.0	3.31							
2004	NDV	88.5	2.88							
2005	NDV	48.0	2.63							
2006	NDV	118.5	3.29							
2007	NDV	104.0	3.19							
2008	NDV	119.0	3.30							
2009	NDV	143.5	3.47							
2010	NDV	194.0	3.73							
Normal			117.7							

**Time Series of forecast and observation**

**Scatter Plot**

**Annotations:**

- Calculate the power of  $\frac{1}{4}$  for precipitation. Input “=C4^0.25” in D4.
- Calculate normal from 1979 to 2010. “=AVERAGE(D4:D35)” in D36

**Regression Analysis Results:**

Regression Type	Parameter	Value
Single Regression	slope	#DIV/0!
	intercept	#DIV/0!
	Correlation	#DIV/0!
Multi Regression	slope	#VALUE!
	intercept	#VALUE!
	Correlation	#DIV/0!

# 1. Single Regression Model

- Open “HindcastGPV.xls”. ← Predictors
- Select a predictor and paste it into column E (or for temperature, column D).
- Try each predictor to find the most effective one.

1	Naha	Observation								
2	Year Target	Precipitation	power of 1/4	Predictor 1	Predictor 2	Predictor 3	Fore-cast	power of 4	$\sigma n^2$	Probabilistic Fore cast
3		deg mm	deg mm <sup>0.25</sup>	Tsurf		V850				N(Xs, $\sigma n$ )
4	1979 NOV	262.5	4.03	4.33						Prob. of above-normal
5	1980 NOV	197.5	3.75	4						
6	1981 NOV	71.0	2.90	4.37						
7	1982 NOV	189.0	3.76	2.52						
8	1983 NOV	5.0	1.50	3.05						
9	1984 NOV	119.0	3.30	1.76						
10	1985 NOV	91.0	3.09	2.46						
11	1986 NOV	120.5	3.31	3.59						
12	1987 NOV	174.0	3.63	3.68						
13	1988 NOV	49.5	2.65	3.87						
14	1989 NOV	138.5	3.43	1.35						
15	1990 NOV	140.0	3.44	3.01						
16	1991 NOV	45.0	2.53	2.34						
17	1992 NOV	126.5	3.35	4.02						
18	1993 NOV	143.0	3.46	3.62						
19	1994 NOV	64.5	2.83	1.68						
20	1995 NOV	148.5	3.49	2.28						
21	1996 NOV	39.5	2.51	1.8						
22	1997 NOV	161.5	3.56	4.32						
23	1998 NOV	164.0	3.58	5.41						
24	1999 NOV	66.5	2.86	4.45						
25	2000 NOV	292.5	4.14	7.33						
26	2001 NOV	3.5	1.37	2.74						
27	2002 NOV	28.5	2.31	2.93						
28	2003 NOV	120.0	3.31	4.62						
29	2004 NOV	68.5	2.88	0.67						
30	2005 NOV	48.0	2.63	1.93						
31	2006 NOV	116.5	3.29	2.95						
32	2007 NOV	104.0	3.19	4.39						
33	2008 NOV	119.0	3.30	5.97						
34	2009 NOV	145.5	3.47	3.66						
35	2010 NOV	194.0	3.73	4.27						
36	Normal	117.7	3.14							
37	Single Regression	slope	0.19	#DIV/0!	#DIV/0!					
38		intercept	2.52	#DIV/0!	#DIV/0!					
39		Correlation	0.42							
40										
41	Multi Regression	slope	#VALUE!	#VALUE!	#VALUE!					
42		intercept	#VALUE!	#VALUE!	#VALUE!					
43		Correlation	#DIV/0!							

Paste the model precipitation data for GPV over the selected station.

Check the anomaly correlation coefficient (ACC) in E39.

For Naha, the ACC is around 0.4.

If the level of skill is low, try each predictor to find the most effective one.

# 1. Single Regression Model

- Calculate forecasts using a single regression equation.

ExerciseForGuidance2011 [互換モード] - Microsoft Excel

ホーム 挿入 ページレイアウト 数式 データ 校閲 表示 Acrobat

標準 ページレイアウト プレビュー コーナー設定 全画面表示 ブックの表示 ルーラー 数式バー 特線 見出し メッセージバー 表示/非表示

ズーム 100% 選択範囲に合わせて拡大/縮小 新しいウィンドウを開く ウィンドウの固定 ウィンドウの位置を元に戻す

H4 =E4\*E\$37+E\$38

	A	B	C	D	E	F	G	H	I	J	K
1	Naha		Observation					Forecast			Probabilistic Forecast
2		Year Target	Precipitation	power of 1/4	Predictor 1	Predictor 2	Predictor 3	Xs	power of 4	$\sigma n^2$	$N(Xs, \sigma n)$
3			deg mm	deg mm^0.25	Rain	Tsurf	V850				Prob. of above-normal
4		1979 NOV	262.5	4.03	4.33			3.32			
5		1980 NOV	197.5	3.75	4			3.26			
6		1981 NOV	71.0	2.90	4.37			3.32			
7		1982 NOV	199.0	3.76	2.52			2.98			
8		1983 NOV	5.0	1.50	3.05			3.08			
9		1984 NOV	119.0	3.30	1.76			2.84			
10		1985 NOV	91.0	3.09	2.46			2.97			
11		1986 NOV	120.5	3.31	3.59			3.18			
12		1987 NOV	174.0	3.63	3.66			3.20			
13		1988 NOV	49.5	2.65	3.87			3.23			
14		1989 NOV	138.5	3.43	1.35			2.77			
15		1990 NOV	140.0	3.44	3.01			3.07			
16		1991 NOV	45.0	2.59	2.34			2.95			
17		1992 NOV	126.5	3.35	4.02			3.26			
18		1993 NOV	143.0	3.46	3.62			3.19			
19		1994 NOV	64.5	2.83	1.68			2.83			
20		1995 NOV	148.5	3.49	2.28			2.94			
21		1996 NOV	39.5	2.51	1.8			2.85			
22		1997 NOV	161.5	3.56	4.32			3.32			
23		1998 NOV	164.0	3.58	5.41			3.52			
24		1999 NOV	66.5	2.86	4.45			3.34			
25		2000 NOV	292.5	4.14	7.33			3.87			
26		2001 NOV	3.5	1.37	2.74			3.02			
27		2002 NOV	28.5	2.31	2.33			2.95			
28		2003 NOV	120.0	3.31	4.62			3.37			
29		2004 NOV	68.5	2.88	0.67			2.64			
30		2005 NOV	48.0	2.63	1.93			2.87			
31		2006 NOV	116.5	3.29	2.95			3.06			
32		2007 NOV	104.0	3.19	4.39			3.33			
33		2008 NOV	119.0	3.30	5.97			3.62			
34		2009 NOV	145.5	3.47	3.66			3.19			
35		2010 NOV	194.0	3.73	4.27			3.31			
36	Normal		117.7	3.14							
37			slope		0.19	#DIV/0!	#DIV/0!			$\sigma n$	
38	Single Regression		intercept		2.52	#DIV/0!	#DIV/0!				
39			Correlation		0.42	#DIV/0!	#DIV/0!				
40											
41	Multi Regression		slope		#VALUE!	#VALUE!	#VALUE!				
42			intercept		#VALUE!						
43			Correlation		#DIV/0!						

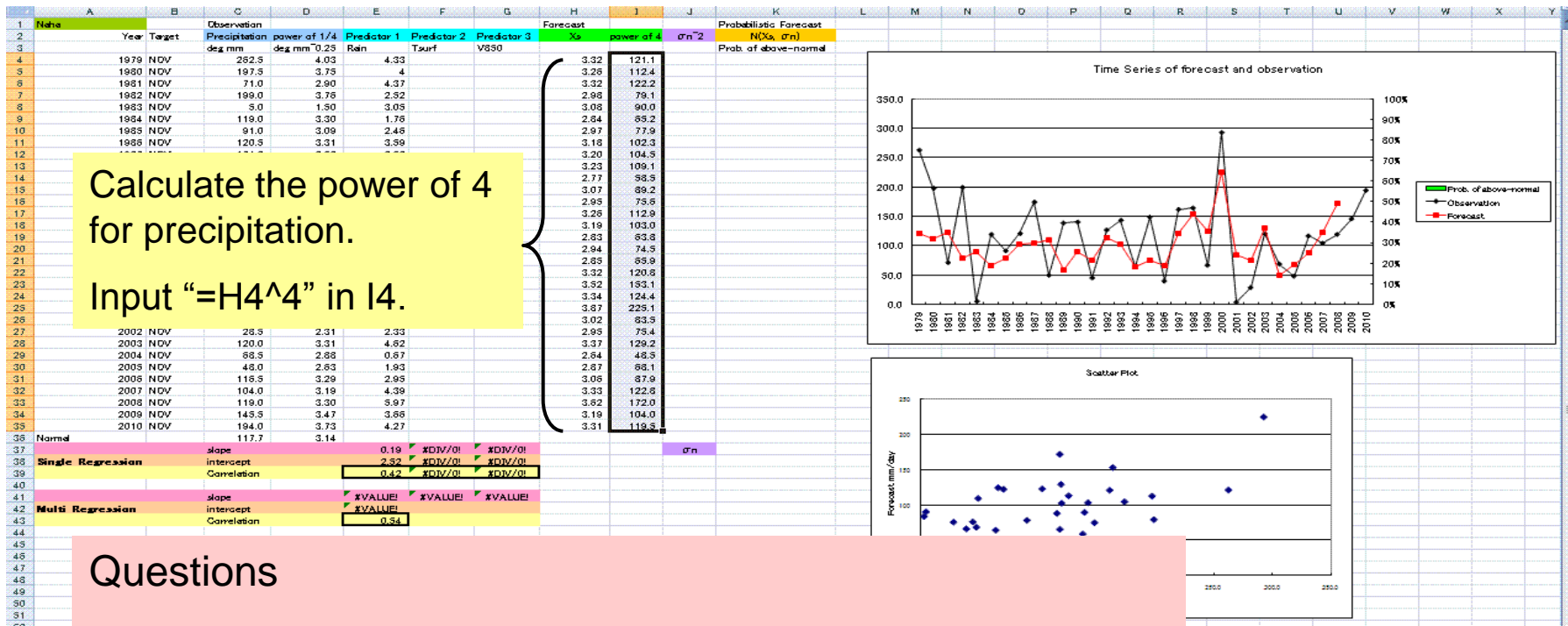
Calculate forecast values using a single regression equation.

Input "=E\$37 \* \$E4+\$E\$38" in H4.

$$Y = a * X + b$$

# 1. Single Regression Model

- Calculate the power of 4 in column I for precipitation.
- Two time series are shown in the line charts. The red line indicates the forecast values.

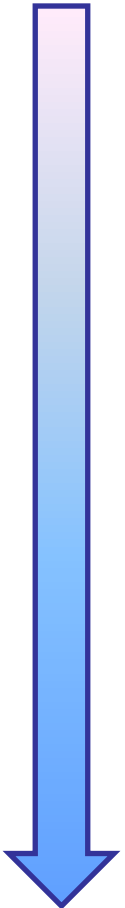
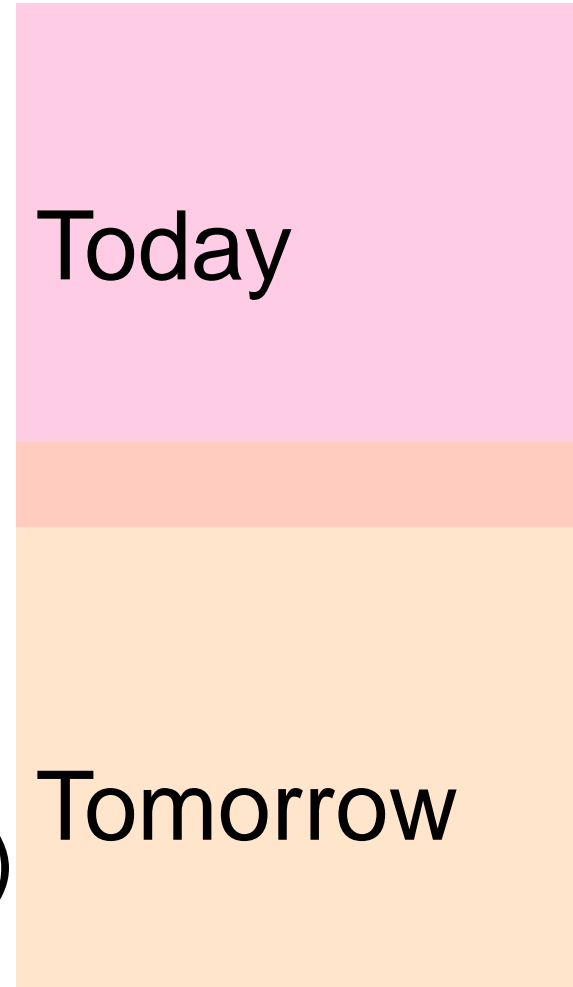


## Questions

1. What predictors are selected?
2. Can accurate guidance be produced?
3. How does guidance help to predict the hottest/coldest/drought/wet years in your country?

# Procedures

1. Single regression model
2. Multiple regression model
3. Probabilistic forecast
4. Verification
5. Production of one-month forecasts for Nov. 2011
6. Creation of presentations
7. Presentations (10 minutes)





# 2. Multiple Regression Model

- Look for the most effective combination of three predictors.

Observation	Target	Predictor 1	Predictor 2	Predictor 3	Forecast	power of 4	$\sigma^2$	Probabilistic Forecast
deg mm	deg mm	Rain	Tsuiri	V850	%			$N(x, \sigma)$
4 NOV	262.5	4.03	4.33	296.44	-1.48	3.32	121.1	
5 NOV	197.5	3.75	4	296.67	-2.3	3.26	112.4	
6 NOV	71.0	2.90	4.37	296.42	-0.84	3.32	122.2	
7 NOV	199.0	3.76	2.52	296.96	-1.69	2.98	79.1	
8 NOV	5.0	1.50	3.05	297.34	-3.61	3.08	90.0	
9 NOV	119.0	3.30	1.76	296.9	-2.55	2.84	65.2	
10 NOV	91.0	3.09	2.46	296.61	-2.76	2.97	77.9	
11 NOV	120.5	3.31	3.59	296.62	-2.46	3.18	102.3	
12 NOV	174.0	3.63	3.68	297.39	-1.62	3.20	104.5	
13 NOV	49.5	2.65	3.87	296.77	-2.93	3.23	109.1	
14 NOV	138.5	3.43	1.35	296.48	-1.9	2.77	58.5	
15 NOV	140.0	3.44	3.01	296.85	-2.09	3.07	80.0	
16 NOV	45.0	2.59	2.34	296.03	-2.68	2.95		
17 NOV	126.5	3.35	4.02	296.46	-1.8	3.26		
18 NOV	143.0	3.46	3.62	296.86	-1.31	3.19		
19 NOV	64.5	2.83	1.68	296.57	-1.13	2.83		
20 NOV	148.5	3.49	2.28	296.82	-2.58	2.94		
21 NOV	39.5	2.51	1.8	296.75	-3.26	2.85		
22 NOV	161.5	3.56	4.32	296.32	-2.08	3.32		
23 NOV	164.0	3.58	5.41	297.6	-2.57	3.52	153.1	
24 NOV	66.5	2.86	4.45	297.49	-3.88	3.34	124.4	
25 NOV	292.5	4.14	7.33	297.74	-1.01	3.87	225.1	
26 NOV	3.5	1.37	2.74	296.79	-2.84	3.02	83.5	
27 NOV	28.5	2.31	2.33	296.6	-2.77	2.95	75.4	
28 NOV	120.0	3.31	4.62	297.19	-1.01	3.37	129.2	
29 NOV	68.5	2.88	0.67	296.05	-2.64	2.64	48.5	
30 NOV	48.0	2.63	1.93	297.25	-1.85	2.87	68.1	
31 NOV	116.5	3.29	2.95	297.43	-1.61	3.06	87.9	
32 NOV	104.0	3.19	4.39	296.91	-3.33	3.33	122.8	
33 NOV	119.0	3.30	5.97	297.8	-1.15	3.62	172.0	
34 NOV	145.5	3.47	3.66	296.81	-1.42	3.19	104.0	
35 NOV	194.0	3.73	4.27	297.15	-1.64	3.31	119.5	
36	117.7	3.14						
37	slope		0.19	0.13	0.42		$\sigma^2$	
38	intercept		2.52	-35.17	4.05			
39	Correlation		0.42	0.10	0.54			
40								
41	slope		0.18	-0.25	0.34			
42	intercept		76.11					
43	Correlation		0.54					
44								

Select the most effective combination of predictors after trial and error.

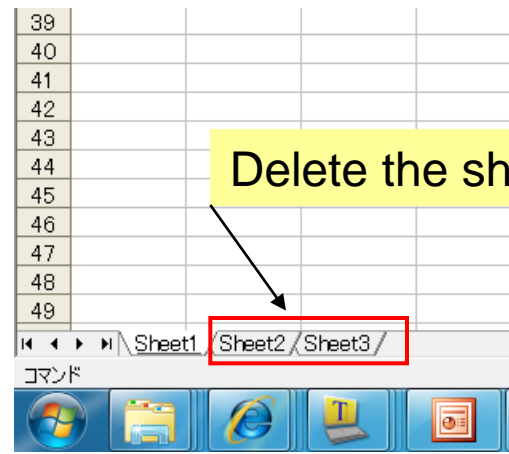
ITACS will help you find likely predictors.

# 2. Multiple Regression Model

- Let's use ITACS for looking for the effective predictors.
  - Preparing observation data for CSV format at first.

	Year	Month	Day	Value [mm]
1	1979	11	1	262.5
2	1980	11	1	197.5
3	1981	11	1	71
4	1982	11	1	199
5	1983	11	1	5
6	1984	11	1	119
7	1985	11	1	91
8	1986	11	1	120.5
9	1987	11	1	174
10	1988	11	1	49.5
11	1989	11	1	138.5
12	1990	11	1	140
13	1991	11	1	45
14	1992	11	1	126.5
15	1993	11	1	143
16	1994	11	1	64.5
17	1995	11	1	148.5
18	1996	11	1	39.5
19	1997	11	1	161.5
20	1998	11	1	164
21	1999	11	1	66.5
22	2000	11	1	292.5
23	2001	11	1	3.5
24	2002	11	1	28.5
25	2003	11	1	120
26	2004	11	1	68.5
27	2005	11	1	48
28	2006	11	1	116.5
29	2007	11	1	104
30	2008	11	1	119
31	2009	11	1	145.5
32	2010	11	1	194
33				

These are monthly values.



# 2. Multiple Regression Model

ITACS v3.0 in server1 - Windows Internet Explorer

http://y.kishou.go.jp/itacs/analyze30/index1.php?dataset=JRA-JCDAS&element=v23&element\_edit=0&dtype=ANOM&area=30.190,-10.85,ASIA&lat\_s=

Period: Nov. 1979 – Nov. 2010

data1

dataset	element	data type	area	level	average period	show period
JRA-JCDAS	V Meridional wind(m/s)	ANOM	ASIA	850 hPa	Year average	RANGE
	Vector <input type="checkbox"/>		Lat: -10 - 85 Ave <input type="checkbox"/>		Ave <input type="checkbox"/>	1979 - 2010
	SD <input type="checkbox"/>		Lon: 30 - 190 Ave <input type="checkbox"/>			11 - 11

analysis method : CORRELATION\_COEFFICIENT

Select CORRELATION\_COEFFICIENT

data2

dataset	element	input txt	average period	lag	significance
USER INPUT	UPLOAD TXT	C:\fakepath\NahaNovPrec.csv	Year average	0 YEAR	90%(two side)
	SD <input type="checkbox"/>	1979,11,1,282.5, 1980,11,1,197.5, 1981,11,1,171.0, 1982,11,1,199.0, 1983,11,1,15.0, 1984,11,1,119.0, 1985,11,1,91.0, 1986,11,1,120.5, 1987,11,1,174.0, 1988,11,1,49.5, 1989,11,1,138.5, 1990,11,1,140.0, 1991,11,1,45.0, 1992,11,1,126.5, 1993,11,1,143.0, 1994,11,1,64.5, 1995,11,1,148.5, 1996,11,1,39.5, 1997,11,1,161.5, 1998,11,1,164.0,			

Upload your observation data

<http://extreme.kishou.go.jp/tool/itacs-tcc2011/>

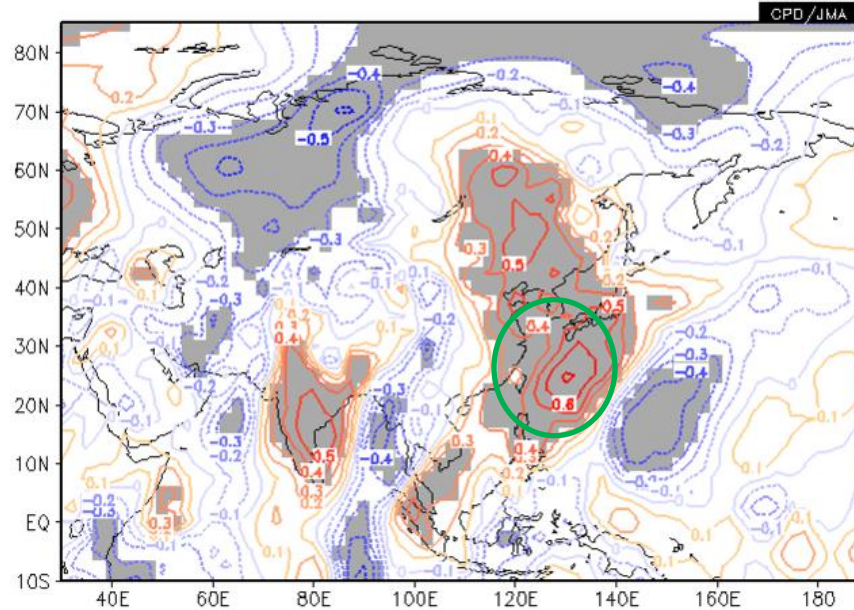
The ITACS can produce a correlation map between two variables.

One is **V** at 850hPa and the other is observed precipitation in Nana.

ITACS

# 2. Multiple Regression Model

```
DATA1 JRA-JCDAS v23 ANOM lat = -10:85 lon = 30:190 level = 3:3  
time = 1979110100:2010110100 ave = 1MONTH  
DATA2 USER_INPUT USER_INPUT1 HIST lat = -90:90 lon = 0:360 level = 1:1  
time = 1979110100:2010110100 ave = 1MONTH analysis method = CORRELATION_COEFFICIENT
```



This is a relationship between 850 hPa meridional wind ( $V$ ) and precipitation in Naha.

The  $V$  around Okinawa Islands looks a likely predictor.

Try to look for effective predictors in this way.

# 2. Multiple Regression Model

- Calculate forecasts using a multiple regression equation.

1	A	B	C	D	E	F	G	H	I	J	K
2	Naha	Observation	Precipitation	power of 1/4	Predictor 1	Predictor 2	Predictor 3	Xs	power of 4	σn'2	Probabilistic Forecast
3	Year Target	Rain	deg mm	deg mm^0.25	Tsurf	V850				N(Xs, σn)	Prob. of above-normal
4	1979 NOV	262.5	4.03	4.33	296.44	-1.48	3.6	175.2			
5	1980 NOV	197.5	3.75	4	296.67	-2.3	3.2	110.3			
6	1981 NOV	71.0	2.90	4.37	296.42	-0.84	3.9	224.5			
7	1982 NOV	199.0	3.76	2.52	296.86	-1.69	3.1	97.8			
8	1983 NOV	5.0	1.50	3.05	297.34	-3.61	2.5	36.5			
9	1984 NOV	119.0	3.30	1.76	295.9	-2.55	3.0	75.8			
10	1985 NOV	91.0	3.09	2.46	296.61	-2.76	2.8	63.8			
11	1986 NOV	120.5	3.31	3.59	296.62	-2.46	3.1	95.5			
12	1987 NOV	174.0	3.63	3.68	297.39	-1.62	3.2	110.6			
13	1988 NOV	49.5	2.65	3.87	296.77	-2.93	3.0	78.5			
14	1989 NOV	138.5	3.43	1.35	296.48	-1.9	3.0	76.8			
15	1990 NOV	140.0	3.44	3.01	296.85	-2.09	3.1	91.8			
16	1991 NOV	45.0	2.59	2.34	296.03	-2.68	3.0	78.4			
17	1992 NOV	126.5	3.35	4.02	296.46	-1.8	3.5	144.7			
18	1993 NOV	143.0	3.46	3.62	296.86	-1.31	3.5	144.8			
19	1994 NOV	64.5	2.83	1.68	296.57	-1.13	3.3	113.2			
20	1995 NOV	148.5	3.49	2.28	296.82	-2.58	2.8	62.0			
21	1996 NOV	39.5	2.51	1.8	296.75	-3.26	2.5	39.3			
22	1997 NOV	161.5	3.56	4.32	296.32	-2.08	3.5	143.1			
23	1998 NOV	164.0	3.58	5.41	297.6	-2.57	3.2	100.6			
24	1999 NOV	66.5	2.86	4.45	297.49	-3.88	2.6	43.9			
25	2000 NOV	292.5	4.14	7.33	297.74	-1.01	4.0	258.1			
26	2001 NOV	3.5	1.37	2.74	296.79	-2.84	2.8	61.8			
27	2002 NOV	28.5	2.31	2.33	296.6	-2.77	2.8	61.7			
28	2003 NOV	120.0	3.31	4.62	297.19	-1.01	3.7	180.9			
29	2004 NOV	68.5	2.88	0.67	296.05	-2.64	2.7	52.5			
30	2005 NOV	48.0	2.63	1.93	297.25	-1.85	2.9	69.8			
31	2006 NOV	116.5	3.29	2.95	297.43	-1.61	3.1	93.3			
32	2007 NOV	104.0	3.19	4.39	296.91	-3.33	2.9	70.3			
33	2008 NOV	119.0	3.30	5.97	297.8	-1.15	3.7	189.7			
34	2009 NOV	145.5	3.47	3.66	296.81	-1.42	3.5	141.8			
35	2010 NOV	194.0	3.73	4.27	297.15	-1.64	3.4	133.4			
36	Normal	117.7	3.14								
37	Single Regression	slope		0.19	0.13	0.42				σn	
38	Single Regression	intercept		2.52	-35.17	4.05					
39	Single Regression	Correlation		0.42	0.10	0.54					
40											
41	Multi Regression	slope		0.18	-0.25	0.34					
42	Multi Regression	intercept		75.11							
43	Multi Regression	Correlation		0.61							
44											

Calculate forecasts using a multiple regression equation.

Input “ $=\$E\$41 * \$E4 + \$F\$41 * \$F4 + \$G\$41 * \$G4 + \$E\$42$ ” in H4.

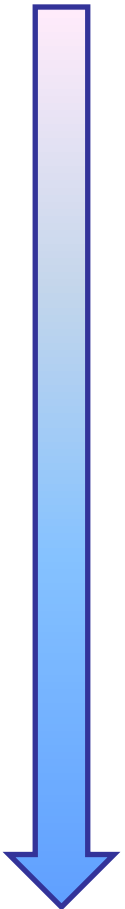
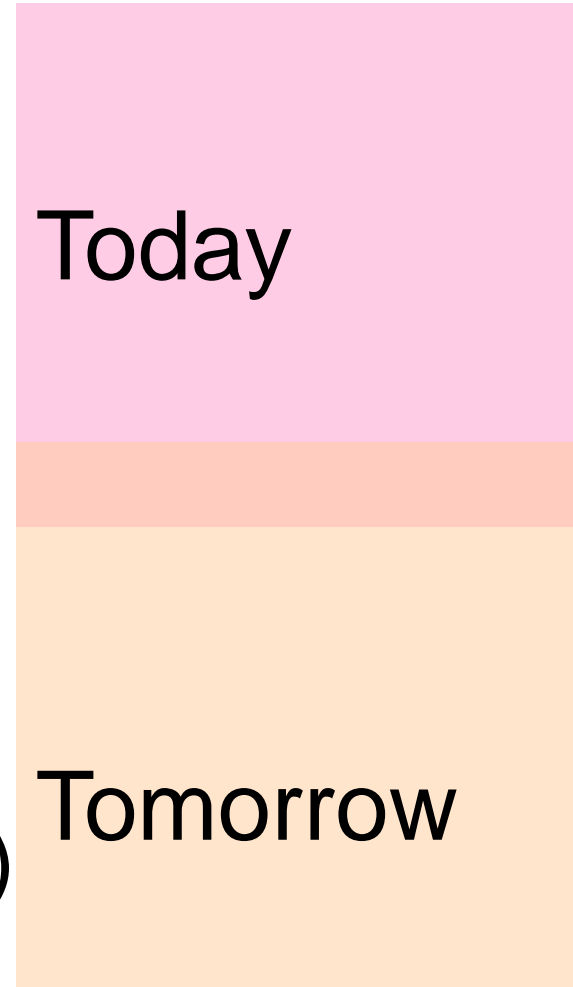
Multiple Anomaly Correlation Coefficient

## Questions

- What predictors are selected?
- Can you produce more accurate guidance than that of the single regression model?

# Procedures

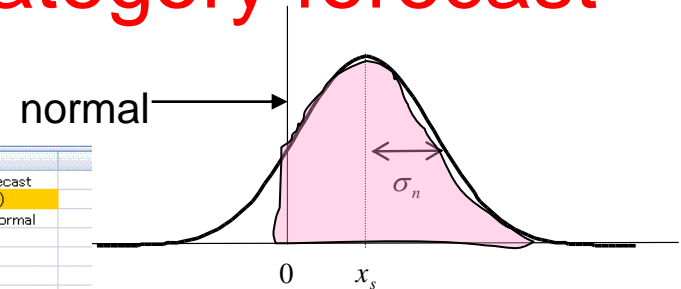
1. Single regression model
2. Multiple regression model
- 3. Probabilistic forecast**
4. Verification
5. Production of one-month forecasts for Nov. 2011
6. Creation of presentations
7. Presentations (10 minutes)



# 3. Probabilistic Forecast

## 2-category forecast

- Calculate the square of regression errors.
- Calculate the root mean of the values.



	A	B	C	D	E	F	G	H	I	J	K	
1	Naha		Observation					Forecast			Probabilistic Forecast	
2		Year	Target	Precipitation	power of 1/4	Predictor 1	Predictor 2	Predictor 3	Xs	power of 4	σn^2	N(Xs, σn)
3			deg mm	deg mm^0.25	Rain	Tsurf	V850				Prob. of above-normal	
4		1979 NOV	262.5	4.03	4.33	296.44	-1.48	3.6	175.2	7619.550		
5		1980 NOV	197.5	3.75	4	296.67	-2.3	3.2	110.3	7596.852		
6		1981 NOV	71.0	2.90	4.37	296.42	-0.84	3.9	224.5	23567.658		
7		1982 NOV	199.0	3.76	2.52	296.86	-1.69	3.1	97.8	10235.293		
8		1983 NOV	5.0	1.50	3.05	297.34	-3.61	2.5	36.5	992.582		
9		1984 NOV	119.0	3.30	1.76	295.9	-2.55	3.0	75.8	1868.390		
10		1985 NOV	91.0	3.09	2.46	296.61	-2.76	2.8	63.8	737.423		
11		1986 NOV	120.5	3.31	3.59	296.62	-2.46	3.1	95.5	624.755		
12		1987 NOV	174.0	3.63	3.68	297.39	-1.62	3.2	110.6	4022.297		
13		1988 NOV	49.5	2.65	3.87	296.77	-2.93	3.0	78.5	839.760		
14		1989 NOV	138.5	3.43	1.35	296.48	-1.9	3.0	76.8	3806.688		
15		1990 NOV	140.0	3.44	3.01	296.85	-2.09	3.1	91.8	2321.631		
16		1991 NOV	45.0	2.59	2.34	296.03	-2.68	3.0	78.4	1114.689		
17		1992 NOV	126.5	3.35	4.02	296.46	-1.8	3.5	144.7	332.543		
18		1993 NOV	143.0	3.46	3.62	296.86	-1.31	3.5	144.8	3.410		
19		1994 NOV	64.5	2.83	1.68	296.57	-1.13	3.3	113.2	2371.241		
20		1995 NOV	148.5	3.49	2.28	296.82	-2.58	2.8	62.0	7488.193		
21		1996 NOV	39.5	2.51	1.8	296.75	-3.26	2.5	39.3	0.034		
22		1997 NOV	161.5	3.56	4.32	296.32	-2.08	3.5	143.1	336.878		
23		1998 NOV	164.0	3.58	5.41	297.6	-2.57	3.2	100.6	4014.454		
24		1999 NOV	66.5	2.86	4.45	297.49	-3.88	2.6	43.9	511.164		
25		2000 NOV	292.5	4.14	7.33	297.74	-1.01	4.0	258.1	1183.674		
26		2001 NOV	3.5	1.37	2.74	296.79	-2.84	2.8	61.8	3402.164		
27		2002 NOV	28.5	2.31	2.33	296.6	-2.77	2.8	61.7	1103.534		
28		2003 NOV	120.0	3.31	4.62	297.19	-1.01	3.7	180.9	3705.652		
29		2004 NOV	68.5	2.88	0.67	296.05	-2.64	2.7	52.5	257.465		
30		2005 NOV	48.0	2.63	1.93	297.25	-1.85	2.9	69.8	475.675		
31		2006 NOV	116.5	3.29	2.95	297.43	-1.61	3.1	93.3	536.416		
32		2007 NOV	104.0	3.19	4.39	296.91	-3.33	2.9	70.3	1137.262		
33		2008 NOV	119.0	3.30	5.97	297.8	-1.15	3.7	188.7	4859.705		
34		2009 NOV	145.5	3.47	3.66	296.81	-1.42	3.5	141.8	14.015		
35		2010 NOV	194.0	3.73	4.27	297.15	-1.64	3.4	133.4	3675.638		
36	Normal		117.7	3.14						56.113		
37			slope		0.19	0.13	0.42				σn	
38	Single Regression		intercept		2.52	-35.17	4.05					
39			Correlation		0.42	0.10	0.54					
40												
41	Multi Regression		slope		0.18	-0.25	0.34					
42			intercept		76.11							
43			Correlation		0.61							
44												

Input "=(H4-D4)^2" in J4 to calculate the square error.

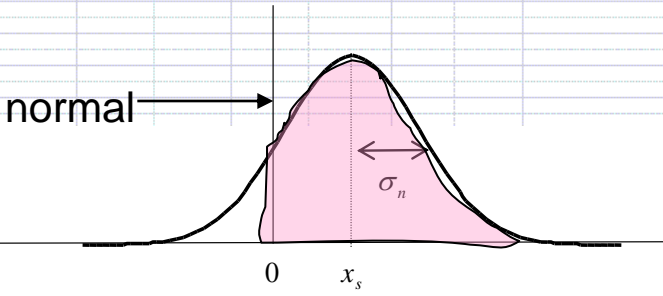
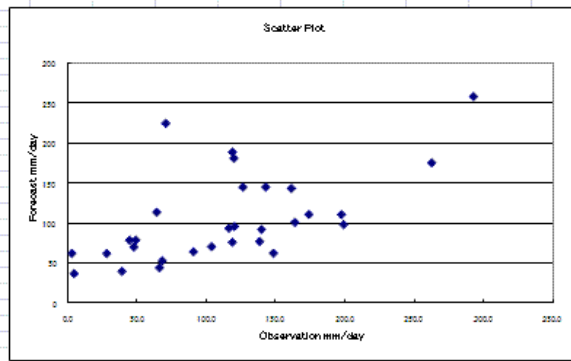
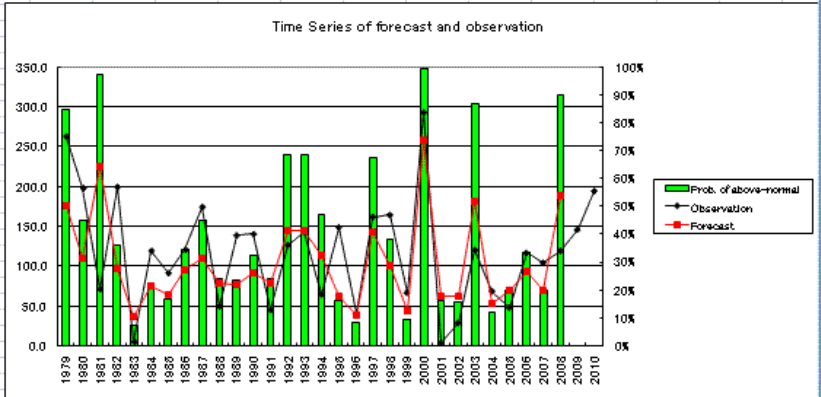
Input " =SQRT(AVERAGE(J4:J35))" in J36 to calculate the root mean square error.

# 3. Probabilistic Forecast

- Calculate the probability of above-normal values.

1	Neha		Observation										Probabilistic Forecast
2	Year	Target	Precipitation	power of 1/4	Predictor 1	Predictor 2	Predictor 3	$\chi_s$	power of 4	$\sigma_n^2$			$N(\chi_s, \sigma_n)$
3			deg mm	deg mm <sup>0.25</sup>	Rain	Tsurf	V850						Prob of above-normal
4	1979	NDV	262.5	4.03	4.33	296.44	-1.48	3.6	175.2	7619.5			85%
5	1980	NDV	197.5	3.75	4	296.67	-2.3	3.2	110.3	7986.9			45%
6	1981	NDV	71.0	2.90	4.37	296.42	-0.84	3.9	224.5	23567.7			97%
7	1982	NDV	199.0	3.76	2.52	296.65	-1.69	3.1	97.8	10235.3			36%
8	1983	NDV	5.0	1.50	3.05	297.34	-3.61	2.5	35.5	992.6			7%
9	1984	NDV	119.0	3.30	1.76	295.9	-2.65	3.0	75.8	1888.4			23%
10	1985	NDV	91.0	3.09	2.46	296.61	-2.76	2.8	63.8	737.4			17%
11	1986	NDV	120.5	3.31	3.59	296.62	-2.48	3.1	95.3	624.8			35%
12	1987	NDV	174.0	3.63	3.68	297.39	-1.62	3.2	110.6	4022.3			45%
13	1988	NDV	49.5	2.65	3.87	296.77	-2.93	3.0	78.5	839.8			24%
14	1989	NDV	138.5	3.43	1.35	296.48	-1.9	3.0	75.8	3806.7			23%
15	1990	NDV	140.0	3.44	3.01	296.65	-2.09	3.1	91.8	2321.6			32%
16	1991	NDV	45.0	2.59	2.34	296.03	-2.68	3.0	78.4	1114.7			24%
17													99%
18													99%
19													47%
20													16%
21													8%
22													67%
23													38%
24	1999	NDV	65.5	2.86	4.45	297.49	-3.88	2.6	43.9	511.2			9%
25	2000	NDV	292.5	4.14	7.33	297.74	-1.01	4.0	258.1	1183.7			99%
26	2001	NDV	3.5	1.37	2.74	296.79	-2.84	2.8	61.8	3402.2			16%
27	2002	NDV	28.5	2.31	2.33	296.6	-2.77	2.8	61.7	1103.5			16%
28	2003	NDV	120.0	3.31	4.62	297.19	-1.01	3.7	180.9	3705.7			87%
29	2004	NDV	68.5	2.88	0.67	296.05	-2.64	2.7	52.5	257.5			12%
30	2005	NDV	48.0	2.63	1.93	297.25	-1.85	2.9	69.8	475.7			20%
31	2006	NDV	116.5	3.29	2.95	297.43	-1.61	3.1	93.3	536.4			33%
32	2007	NDV	104.0	3.19	4.39	296.91	-3.33	2.9	70.3	1137.3			20%
33	2008	NDV	119.0	3.30	5.97	297.8	-1.13	3.7	168.7	4659.7			90%
34	2009	NDV	145.5	3.47	3.66	296.81	-1.42	3.5	141.8	14.0			67%
35	2010	NDV	194.0	3.73	4.27	297.15	-1.64	3.4	133.4	3675.6			61%
36	Normal		117.7	3.14						55.1			
37			slpce		0.19	0.13	0.42			$\sigma_n$			
38	Single Regression		intercept		2.52	-35.17	4.05						
39			Correlation		0.42	0.10	0.34						
40													
41			slpce		0.18	-0.25	0.34						
42	Multi Regression		intercept		75.11								
43			Correlation		0.61								
44													
45													
46													
47													
48													
49													
50													
51													
52													
53													

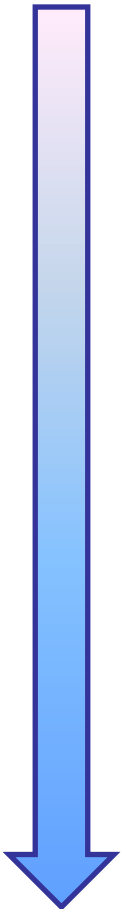
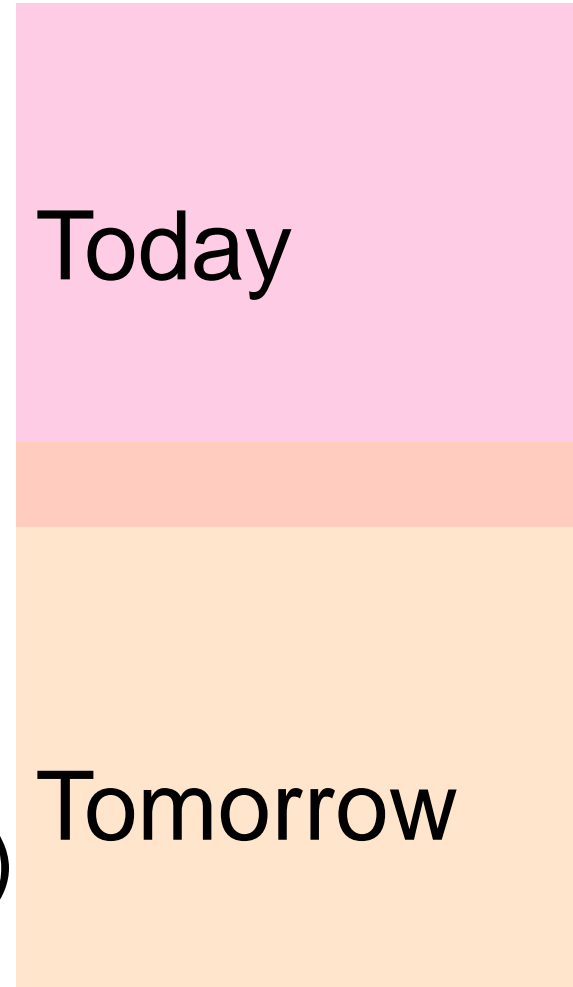
Input “=1-NORMDIST(\$D\$36,\$H4,\$J\$36,TRUE)” in K4 to calculate probability of above-normal.





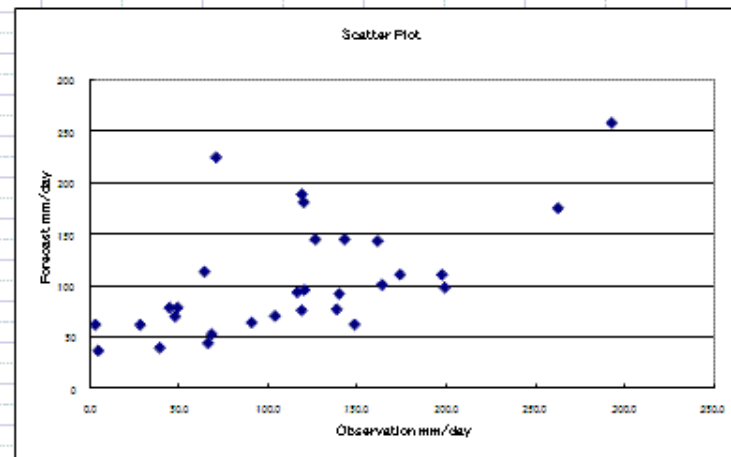
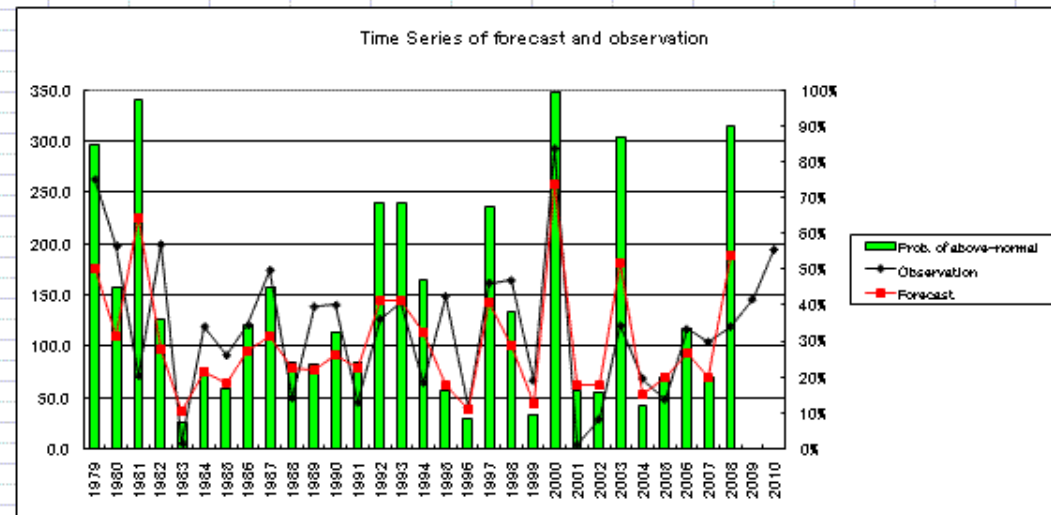
# Procedures

1. Single regression model
2. Multiple regression model
3. Probabilistic forecast
4. **Verification**
5. Production of one-month forecasts for Nov. 2011
6. Creation of presentations
7. Presentations (10 minutes)



# 4-1. Deterministic Verification

- Anomaly Correlation
- Root Mean Square Error
- Time series chart
- Scatter plot



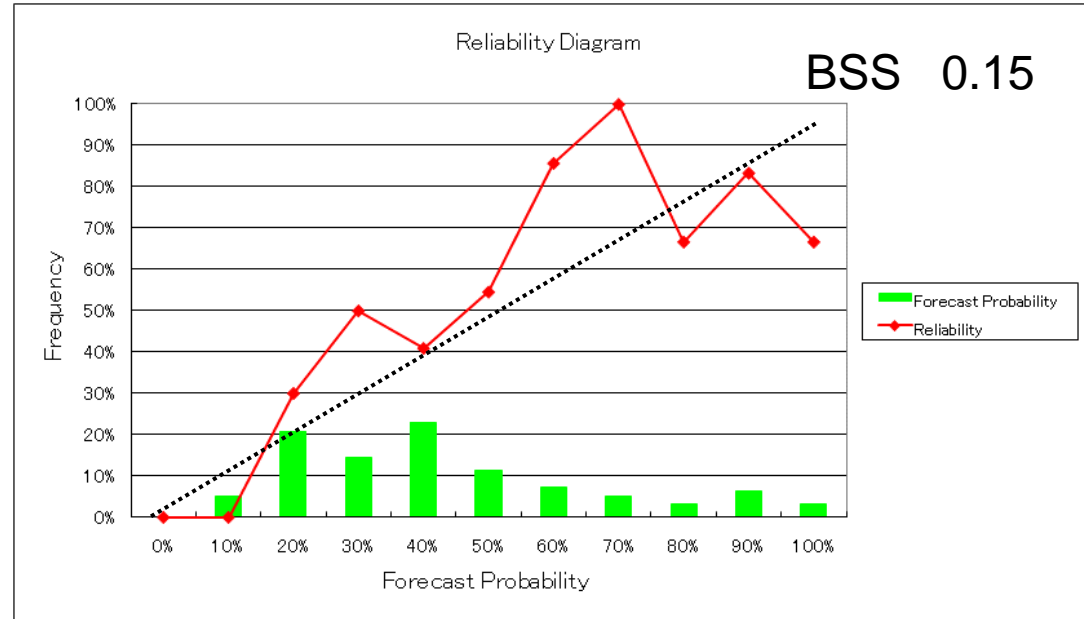
# 4-2. Probabilistic Verification

- Brier Skill Score (BSS)
- Reliability Diagram

$$b = \frac{1}{N} \sum_{i=1}^N (p_i - v_i)^2, \quad 0 \leq p_i \leq 1, \quad v_i \in \{0,1\}$$

$$BSS = \frac{bc - b}{bc}$$

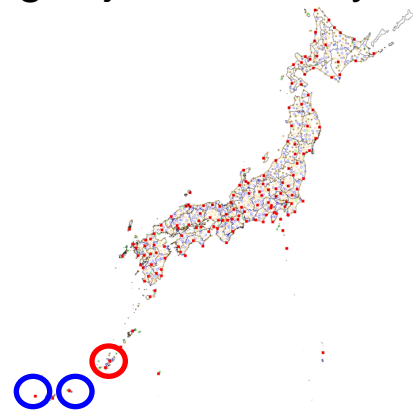
See the textbook in detail



Skill of JMA Operational Guidance from 2008 to 2010.

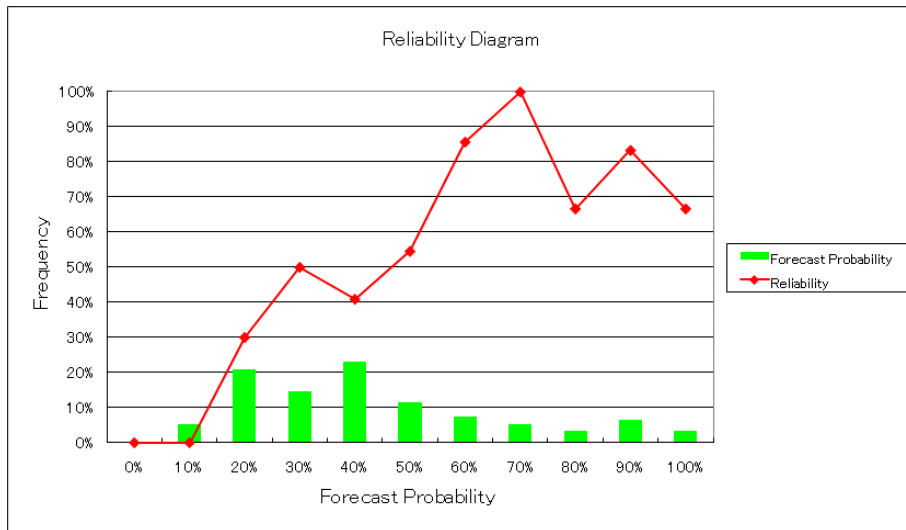
Target Period	BSS
1 <sup>st</sup> weekly temp.	0.55
2 <sup>nd</sup> weekly temp.	0.3
Monthly temp.	0.4
Monthly prec.	0.1

Reliability diagram of Nov. precipitation, totaling Naha, Ishigakijima and Miyakojima station in Japan.



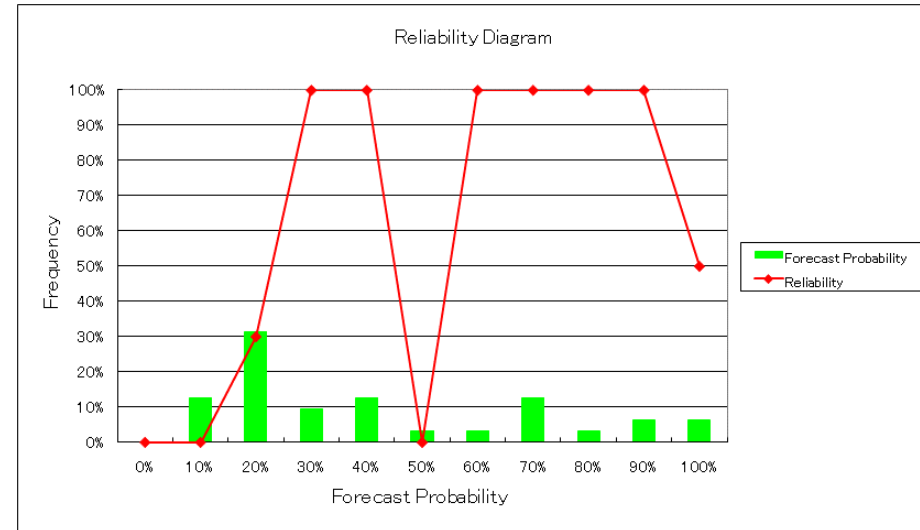
# 4-2. Probabilistic Verification

It is important to have a lot of samples to do probabilistic verification.



90 samples 30 years x 3 stations  
Totaling Naha, Ishigakijima, Miyakojima station.

Reliable



30 samples  
Only Naha station.

Unreliable

# Calculation of Brier Skill Score

$$b = \frac{1}{N} \sum_{i=1}^N (p_i - v_i)^2, \quad 0 \leq p_i \leq 1, \quad v_i \in \{0,1\}$$

The "ROUND" function can be used to round values.

	A	B	C	D	E	F	G	H
			observation	Prob. of above-normal	(Pi-Vi) <sup>2</sup>	round off	above-normal : 1	
1								
2	1979 NOV Naha		262.5	85%	0.0233	80%	1	1
3	1980 NOV		197.5	45%	0.3049	40%	1	1
4	1981 NOV		71.0	97%	0.9438	100%	0	0
5	1982 NOV		199.0	36%	0.4075	40%	1	1
6	1983 NOV		5.0	7%	0.0055	10%	0	0
7	1984 NOV		119.0	23%	0.5968	20%	1	1
8	1985 NOV		91.0	17%	0.0284	20%	0	0
9	1986 NOV		120.5	35%	0.4275	30%	1	1
10	1987 NOV		174.0	45%	0.3031	40%	1	1
11	1988 NOV		49.5	24%	0.0587	20%	0	0
12	1989 NOV		138.5	23%	0.5882	20%	1	1
13	1990 NOV		140.0	32%	0.4593	30%	1	1
14	1991 NOV		45.0	24%	0.0584	20%	0	0
15	1992 NOV		126.5	69%	0.0992	70%	1	1
16	1993 NOV		143.0	69%	0.0988	70%	1	1
17	1994 NOV		64.5	47%	0.2190	50%	0	0
18	1995 NOV		148.5	16%	0.7051			
19	1996 NOV		39.5	8%	0.0066			
20	1997 NOV		161.5	67%	0.1057			
21	1998 NOV		164.0	38%	0.3837			
22	1999 NOV		66.5	9%	0.0089			
23	2000 NOV		292.5	99%	0.0000			
24	2001 NOV		3.5	16%	0.0255			
25	2002 NOV		28.5	16%	0.0253			
26	2003 NOV		120.0	87%	0.0169			
27	2004 NOV		68.5	12%	0.0150			
28	2005 NOV		48.0	20%	0.0387			
29	2006 NOV		116.5	33%	0.1103			
30	2007 NOV		104.0	20%	0.0396			
31	2008 NOV		119.0	90%	0.0106			
32	2009 NOV		145.5	67%	0.1116			
33	2010 NOV		194.0	61%	0.1521			
34	1979 NOV Ishigakijima		226.0	45%	0.3002			
35	1980 NOV		170.5	46%	0.2934			
36	1981 NOV		174.5	68%	0.1026			
37	1982 NOV		329.0	37%	0.4019			
38	1983 NOV		77.5	45%	0.2015			

Averaging these values gives the Brier Score  $b$ .

The climatological Brier score  $bc$  is 0.25 for a two-category forecast:  $BSS = (bc - b) / bc$

Observation Prob. of above-normal

Avoid totaling different variables because their levels of forecast skill usually vary significantly.

# Reliability Diagram

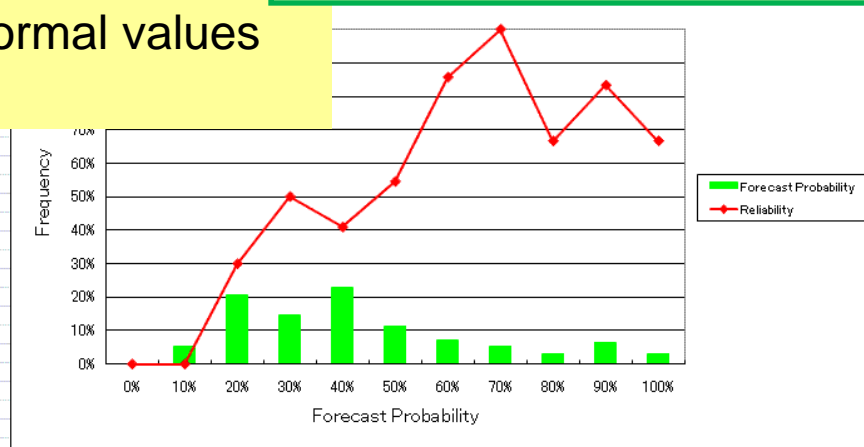
The "COUNTIF" function can be used to count the number of cases with the same forecast probability.

	F	G	H	I	J	K	L	M	N	O	P	Q	R	S	T	U
1	round off	above-normal	: 1													
2		80%		1												
3		40%		1												
4		100%		0												
5		40%		1												
6		10%		0												
7		20%		1												
					Forecast Probability	0%	10%	20%	30%	40%	50%	60%	70%	80%	90%	100%
					Frequency of Forecast	0	5	20	14	22	11	7	5	3	6	3
					Frequency of Observation	0	0	6	7	9	6	6	5	2	5	2
					Reliability	#DIV/0!	0%	30%	50%	41%	55%	86%	100%	67%	83%	67%
					Forecast Probability	0%	5%	21%	15%	23%	11%	7%	5%	3%	6%	3%

The "SUMPRODUCT" function can be used to calculate the frequency of above-normal values for each forecast probability.

The equations have been already written.

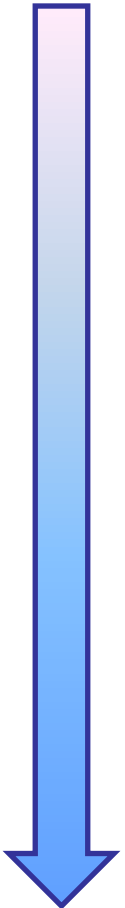
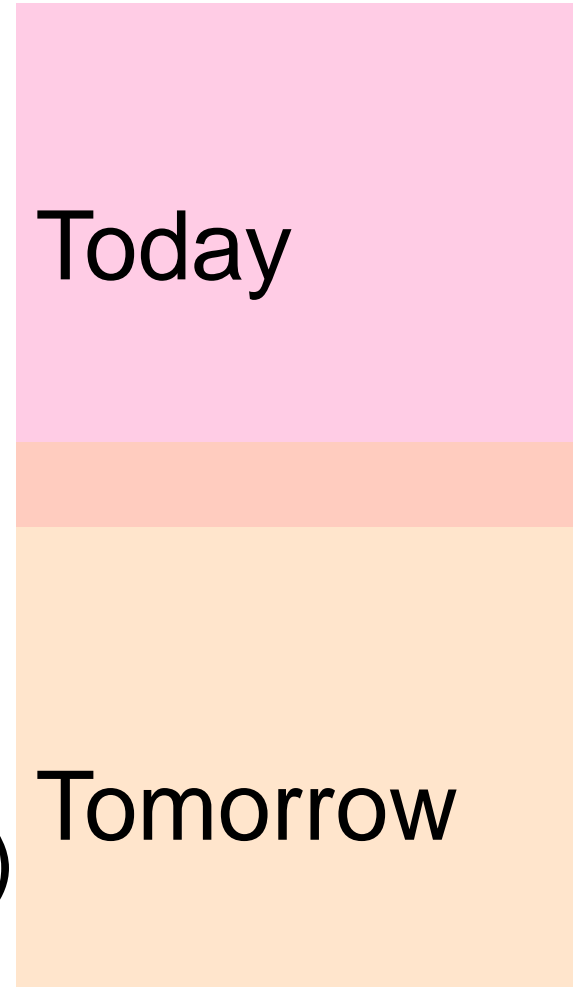
19	40%	1	0
20	70%	1	1
21	40%	1	1
22	10%	0	0
23	100%	1	1
24	20%	0	0
25	20%	0	0
26	90%	1	1
27	10%	0	0
28	20%	0	0
29	30%	1	1
30	20%	0	0
31	90%	1	1
32	70%	1	1
33	60%	1	1
34	50%	1	1
35	50%	1	1
36	70%	1	1
37	40%	1	1
38	40%	0	0
39	20%	0	0
40	30%	1	1
41	50%	1	1
42	40%	1	1
43	40%	0	0
44	20%	1	1
45	40%	1	1
46	20%	0	0
47	30%	0	0
48	50%	0	0
49	40%	0	0
50	40%	0	0
51	40%	1	1



## Reliability Diagram

# Procedures

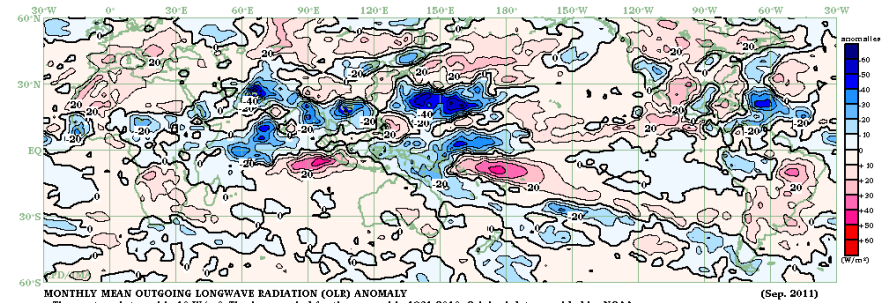
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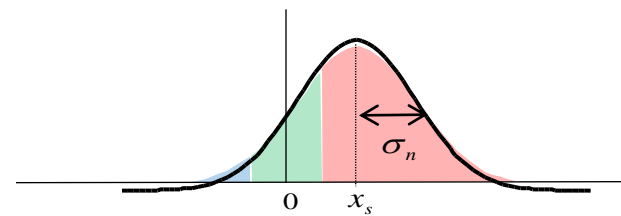
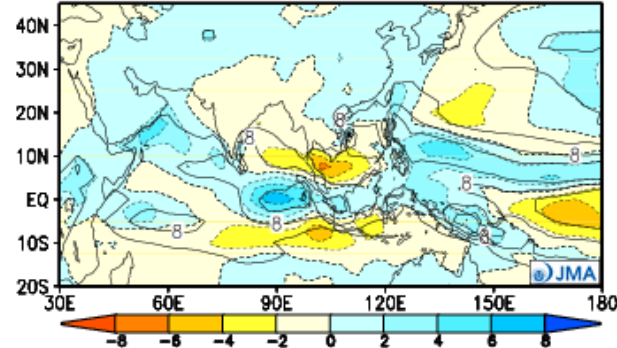
# 5. Production of one-month forecasts for Nov.

initial date: 27 Oct. 2011

- Current Conditions
- Numerical Prediction
- Guidance
- Forecast



RAIN (FORECAST) day 2-29 init:2011/10/27 [mm/day]

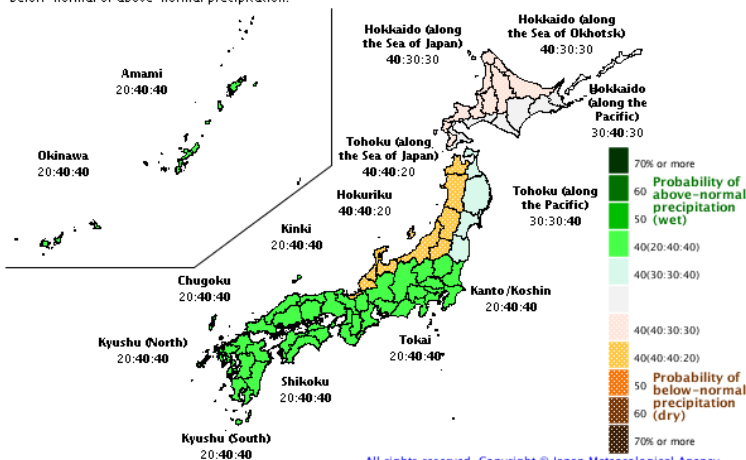


Guidance

## Precipitation

29 October - 28 November

Probability of below-normal precipitation (dry), near-normal precipitation (average), above-normal precipitation (wet) for each area. Colored areas have a 40% probability or more of below-normal or above-normal precipitation.





# *Thank you*

## Links

- Verifications

<http://ds.data.jma.go.jp/tcc/tcc/products/model/hindcast/1mE/index.html>

- ITACS tool <http://extreme.kishou.go.jp/tool/itacs-tcc2011/>

- TCC web <http://ds.data.jma.go.jp/tcc/tcc/news/>

- Daily Forecast in Tokyo <http://www.jma.go.jp/en/yoho/206.html>