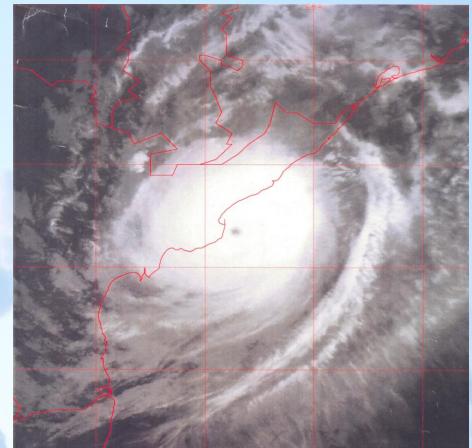
Dvorak Technique - Tropical Cyclone Intensity Analysis



Vernon Dvorak (circa: late 1970s).



Suman Goyal Scientist-E Satellite Meteorology Division





Introduction

For the past three decades, Vernon Dvorak's practical insights and tools for estimating Tropical Cyclone (TC) intensity from satellite data have proven to be invaluable in forecast applications.

The Dvorak technique's practical appeal and demonstrated skill in the face of tremendous dynamic complexity place it among the great meteorological innovations of our time.





- The technique evolved significantly during 1970 -1984 and matured over an extended period so that there is no single reference that wholly defines the application of the technique. However the document "Workbook on Tropical Cloud Systems.." published in 1990 ; tries to brings together a collection of notes regarding application of the technique as a reference for operational forecasters.
- The future evolution of the Dvorak and similar satellite-based TC intensity estimation methods is of vital interest to the meteorological and coastal communities, and the continued improvement may be a top research priority in the atmospheric sciences.





Past History and Foundation of the Technique

- The first methods for tropical storm analysis using satellite imageries (TIROS 1) were developed and operationally used in early 1960's when only one Picture was available per day (Fett, 1964; Timchalk; et al 1965).
- By the late 1960's, polar orbiting satellites with visible and limited IR capabilities were providing TC forecasters with coarse-resolution imagery several times a day. At this time there were no enhancement or animation capabilities. Early work by Fett (1966), Fritz et al. (1966), and Hubert and Timchalk (1969) was generally unsuccessful in inferring TC intensity from this type of imagery.





Past History and Foundation of the Technique

In early 1970's number of satellite increased and there their capabilities improved. Dvorak and his colleagues started working to analyse the tropical cyclones using satellite imageries.

He derived an empirical method relating TC clouds structure to storm intensity using a simple numerical index (CI) corresponding to the maximum sustained wind (MSW) as shown in the Table below (Dvorak 1972, 1973).





CI No	MSW(kt)	
1.0		
	25	
1.5	25	
2.0	30	
2.5	35	
3.0	45	
3.5	55	
4.0	65	
4.5	77	
5.0	90	
5.5	102	
6.0	115	
6.5	127	
7.0	140	
7.5	155	
8.0	170	







vortex	T No	
WML	T1.0	
D	T1.5	
DD	T2.0	
CS	T2.5 & T3.0	
SCS	T3.5	
VSCS	T4.0 to T6.0	
SUPER CYCLONIC STORM	T6.5 to T8.0	





Basics of Dvorak Technique

The technique relies on four distinct geophysical properties that relate organised cloud patterns to TC intensity.

- 1. Vorticity,
- 2. Vertical wind shear,
- 3. Convection, and
- 4. Core temperature.





- Vorticity: The strength and distribution of circular winds (by implication, vorticity) in a TC organises the clouds into patterns that Dvorak relates to the MSW.
- Vertical wind shear: The shear is kinematics force that acts distort the vorticity consequently the cloud pattern. Dvorak found that degree distortion was also related to the MSW.
- Convection: the convection in the bands of the outer core of the cyclone also figures in the cloud pattern recognisation and scene type assignment.
- Core Temperature: Using CTT in the TC inner core the technique relates convective vigor to intensity.





Evolution of the Technique

Originally the technique was largely reliant on pattern-matching concepts and the application of Dvorak's development/decay model.

The significant revisions of 1982 and 1984 shifted the emphasis of the technique toward direct measurement of cloud features.





Details of the Technique





In Dvorak technique following types of satellite imagery are used.

Visible imagery
EIR (Enhanced Infrared imagery)
Digital IR imagery





Enhanced Infrared Imagery (EIR)

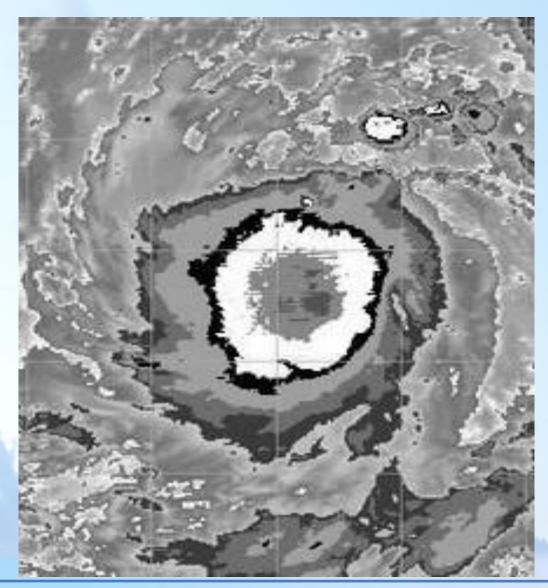
During night time visible imagery is not available and water vapour imagery are not helpful therefore this method was developed by Dvorak and Wright in 1978. In this method we use special lookup table (to highlight the features we use different lookup table in different imageries). In EIR lookup table different temperature ranges have different gray shades.

WMG (warm medium gray) OW (off white) DG (dark gray) MG (medium gray) LG (light gray) B (black) W (white) CMG (cold medium gray) CDG (cold dark gray) > + 9°C + 9°C to - 30°C - 31°C to - 41°C - 42°C to - 53°C - 54°C to - 63°C - 64°C to - 69°C -70°C to -75°C -76°C to - 80°C < - 81°C



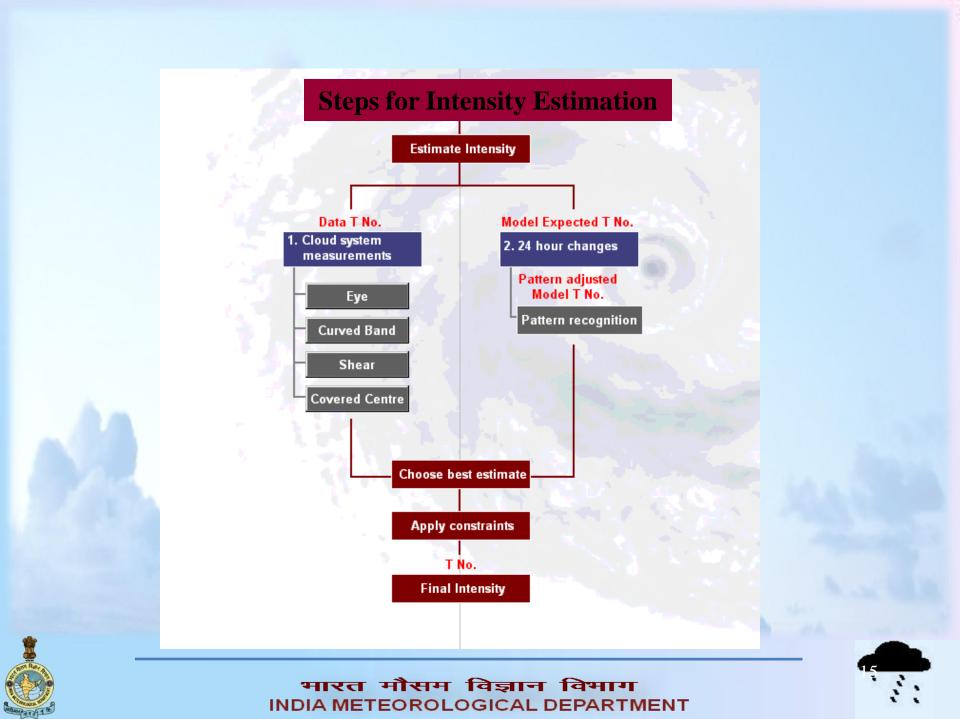


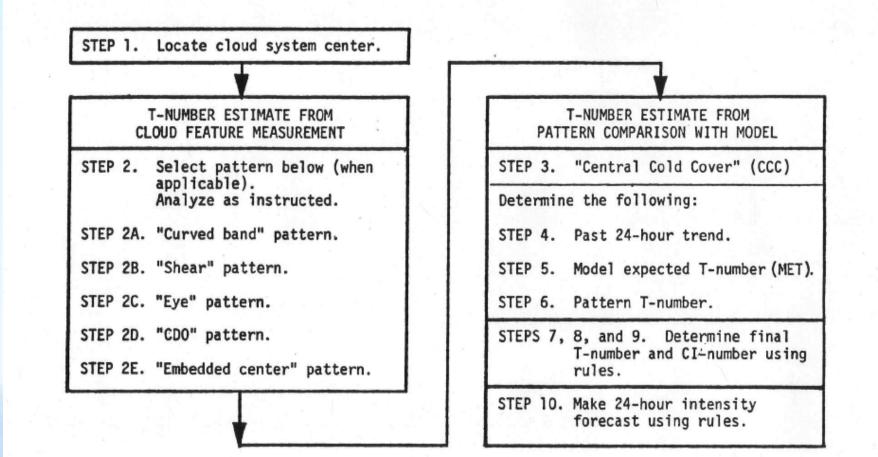
Enhanced Infrared Imagery







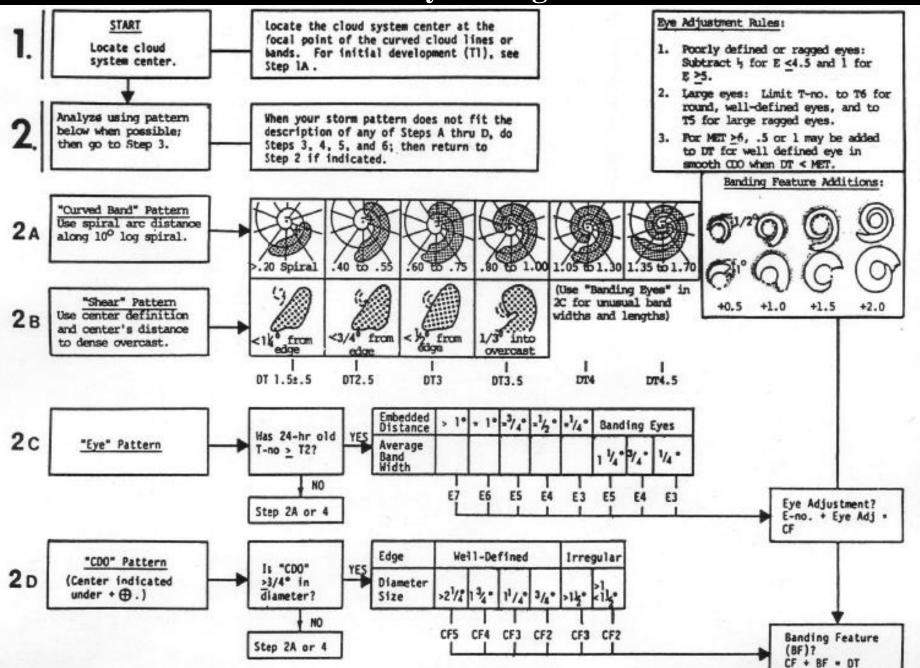




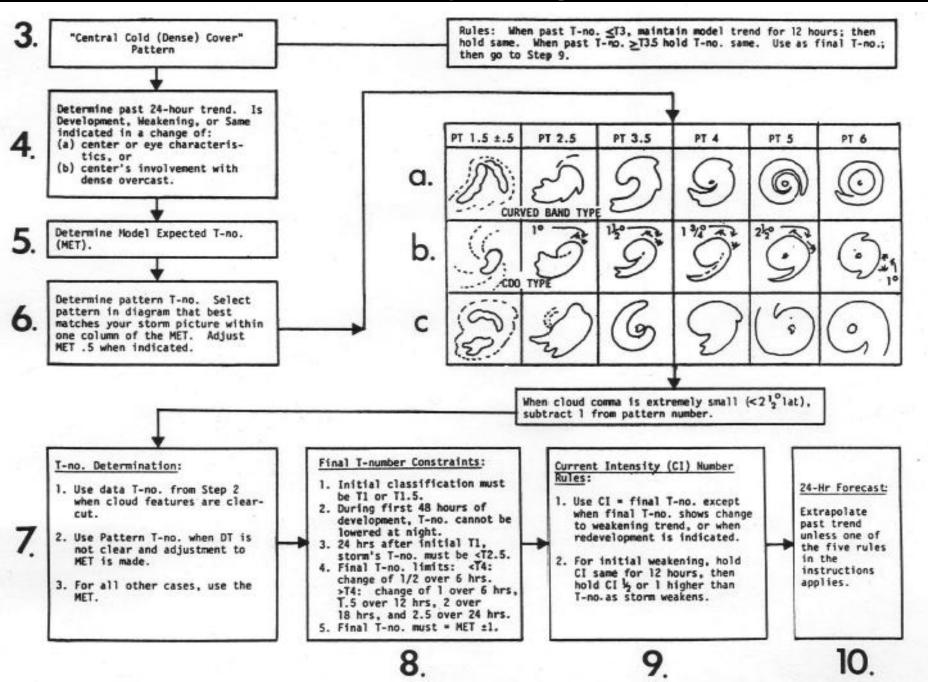




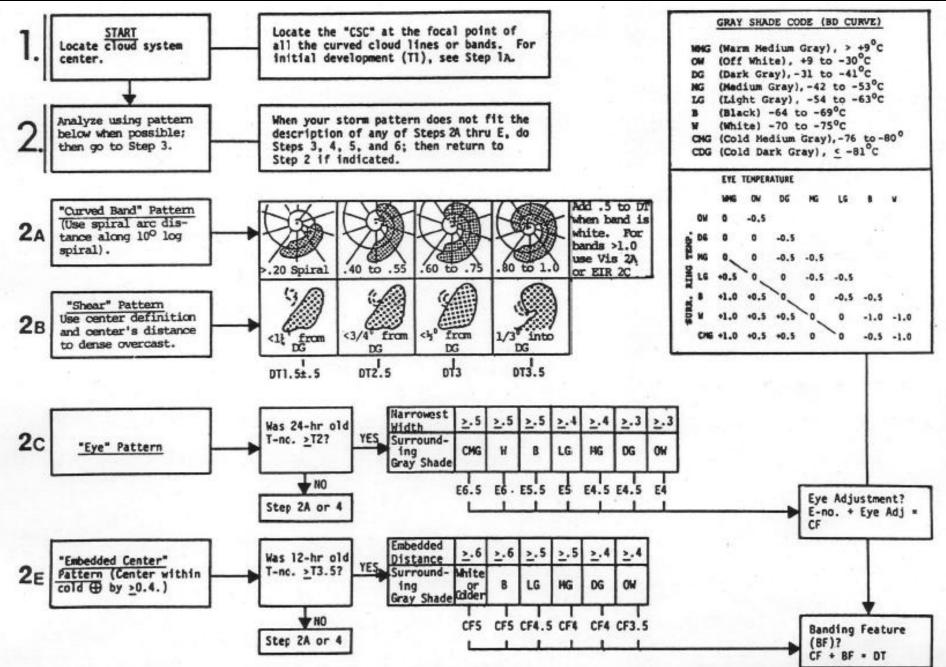
VIS Analysis Diagram-1



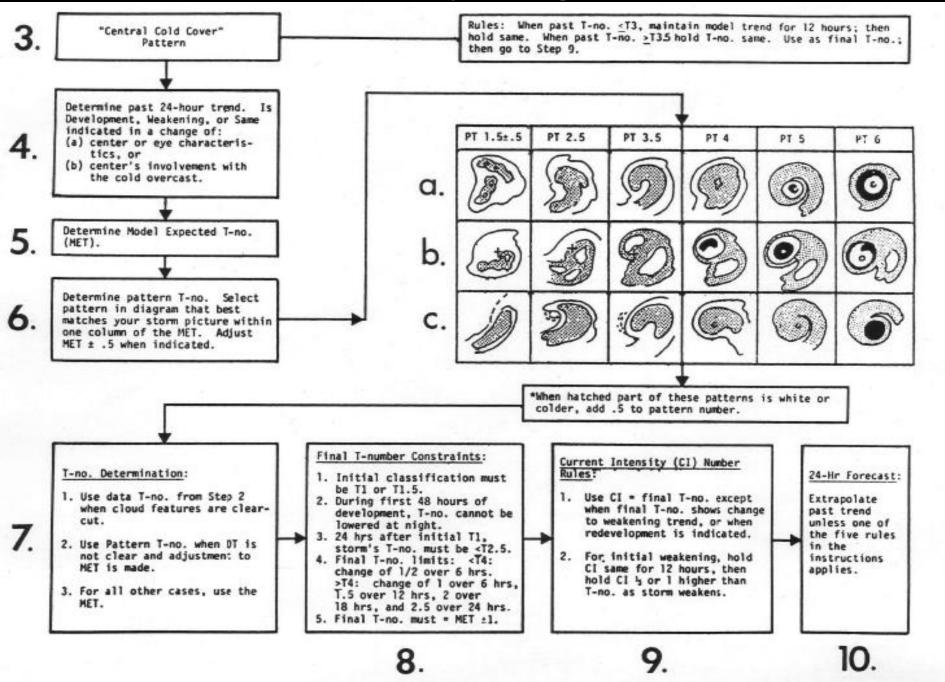
VIS Analysis Diagram-2



EIR Analysis Diagram-1



EIR Analysis Diagram-2



Step No. 1: Tropical System Identification

≻Whenever we observe convective cloud clusters placed randomly over certain area having approximate dimension of 5°x5° for 24hrs and does not disappear due to diurnal variation. Than we keep a close watch for the formation of vortex (low pressure system) over the area.

- ➢ The tropical disturbance reaches tropical storm intensity (T2.5) 36 hours after the first classification (T 1.0).
- ➢Animation suggests that the cloud pattern does not evolve continuously from stage to stage but appear to form in surges. The center as defined by the cloud feature would appear welldefined and easy to interpret during a surge of pattern growth; but following the surge, the clouds features generally become poorly defined and difficult to understand.





Cloud System Center (CSC) Identification

From Dvorak (1985):

"The cloud system center is defined as the focal point of all the curved lines or bands of the cloud system. It can also be thought of as the point toward which the curved lines merge or spiral."

and

"Centre not always obvious, especially at night." ➤ Maintain track continuity.

Use all available data – QuikSCAT, Microwave data, etc.
Centre location can influence intensity measurement.







Cloud system center (CSC) is also defined as the focal point of all curved lines or the bands of the cloud system or geometric center of eye, if present. When more than one well-defined CSC is apparent, we use the best one that fits the past track of the system.

CSC is generally well defined by the cumulus cloud lines in visible imagery.

>During night time- we are left with only Water vapour & IR imagery. Water vapour imagery filter the low clouds. In IR imagery there is not much contrast between clouds top temperature of low (cumulus) clouds and surrounding land surface. Therefore it is difficult to fix cloud system center during night time especially in shear pattern system.

➢ If convective cloud mass persists for 24 hrs and it has a CSC defined with an area having a diameter of 2.5° latitude or less and persist for 6 hrs, then we measure its feature to assign the intensity.



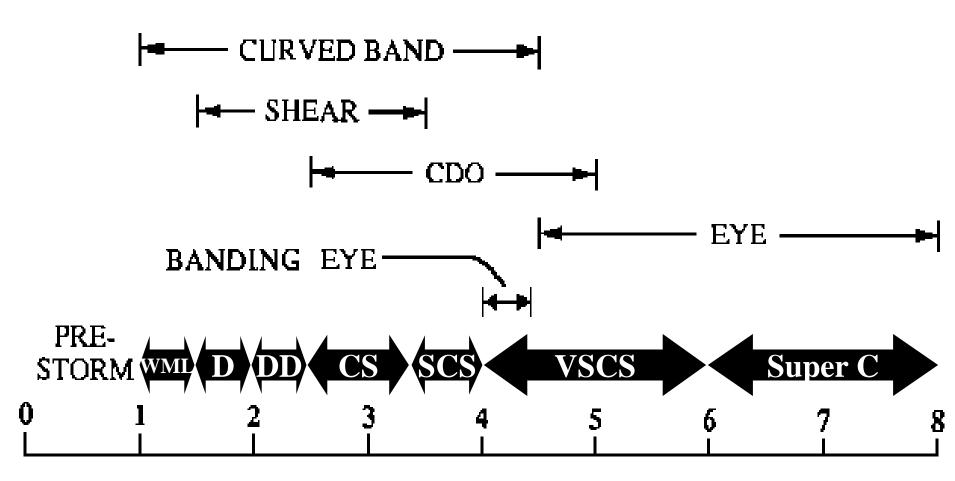


Step No. 2: Pattern Reorganizations:





FOUR PRIMARY PATTERNS AND TYPICAL T - NO.'s



Curved Bands Pattern

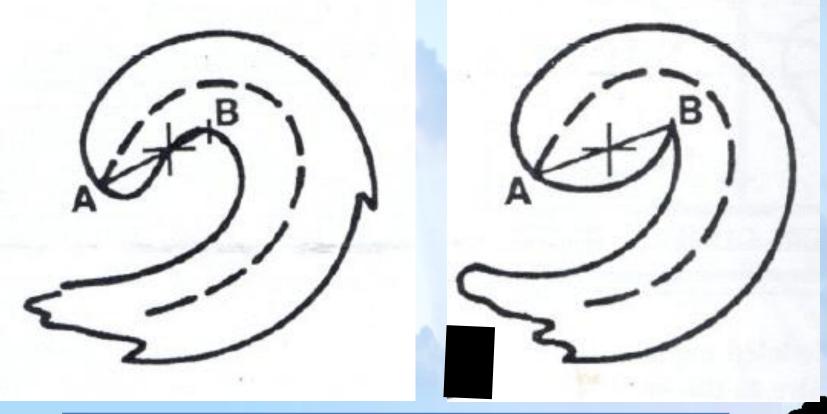
Method: Measure the curvature of the band.

Physical principle: the "wrap-aroundness" of the convective bands indicates the vorticity associated with the system.





Technique for determining center for Curved band pattern

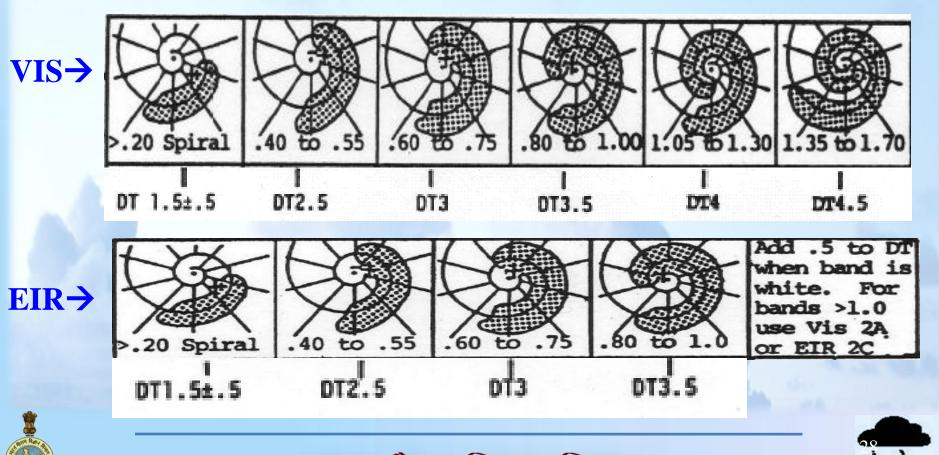




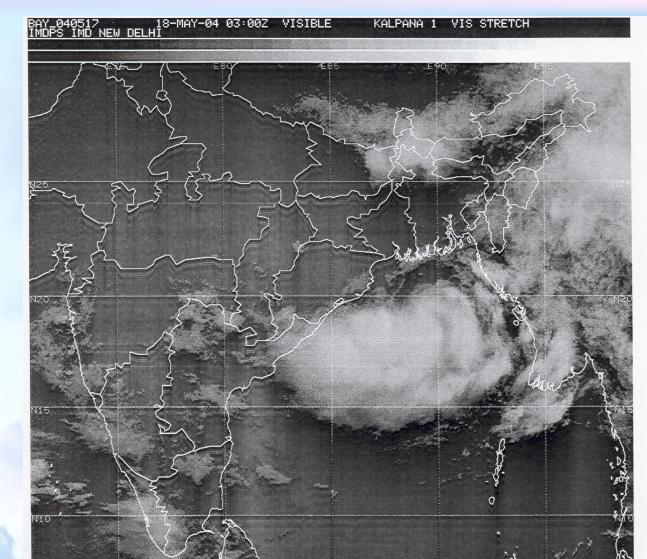


Curved Band

Rule 2A→ Use spiral arc distance along 10° log spiral



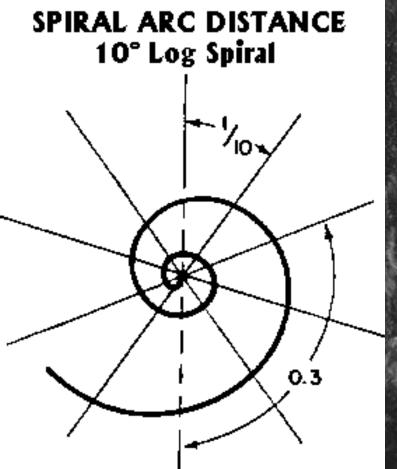
Band Pattern

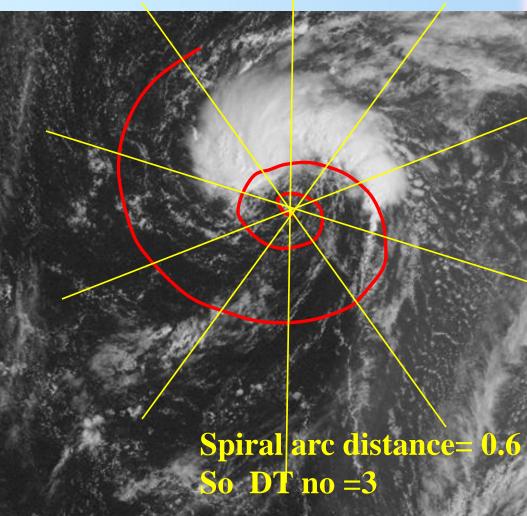


F95

29



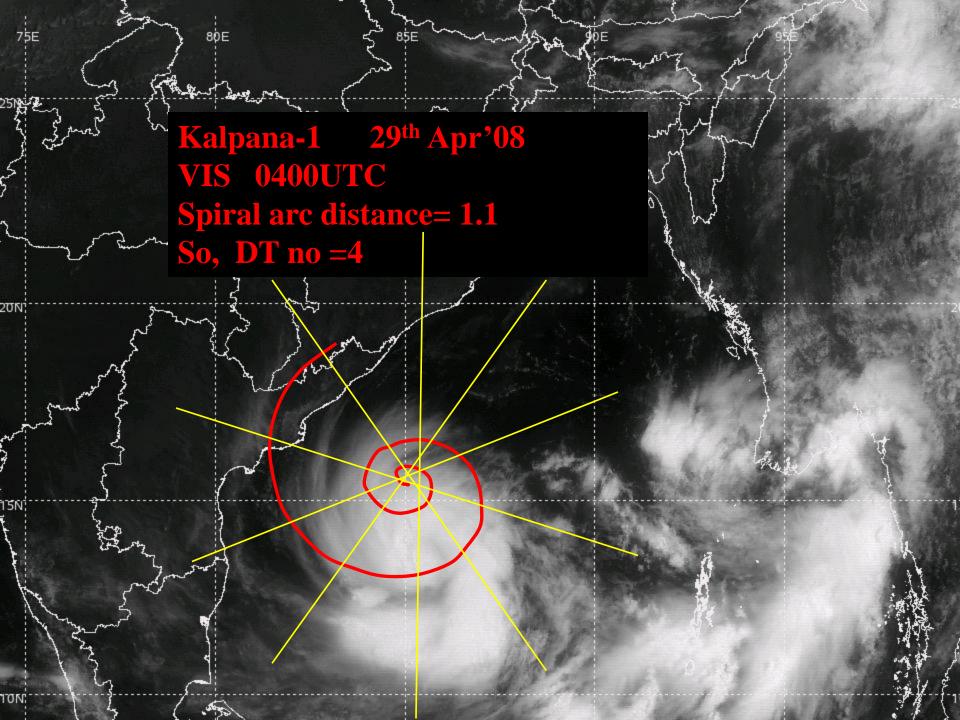




DT number is determined by curvature of band around 10° log spiral







SHEAR PATTERN

<u>Method</u>: Measure the distance form the low level centre to the edge of the "dense overcast".

<u>Physical principle</u>: greater involvement of the low level centre with the deep convection indicates a stronger system.

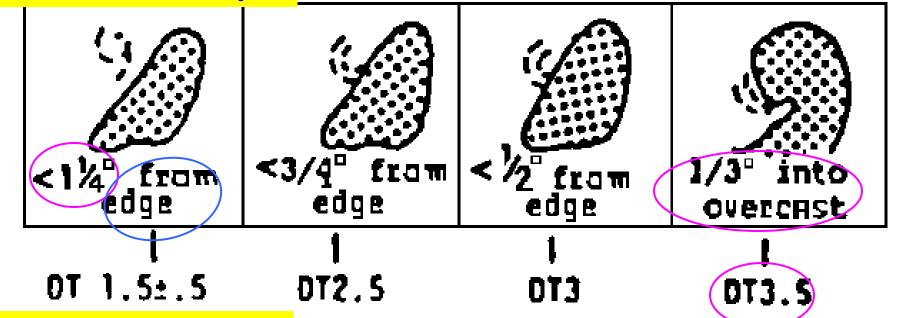
➢Due to strong vertical wind shear convective cloud mass associated with weak vortex are moved away from the CSC.

> We measure the distance between convective cloud mass and CSC. This distance gives intensity of vortex directly.





Rules for VIS analysis



Rules for EIR analysis

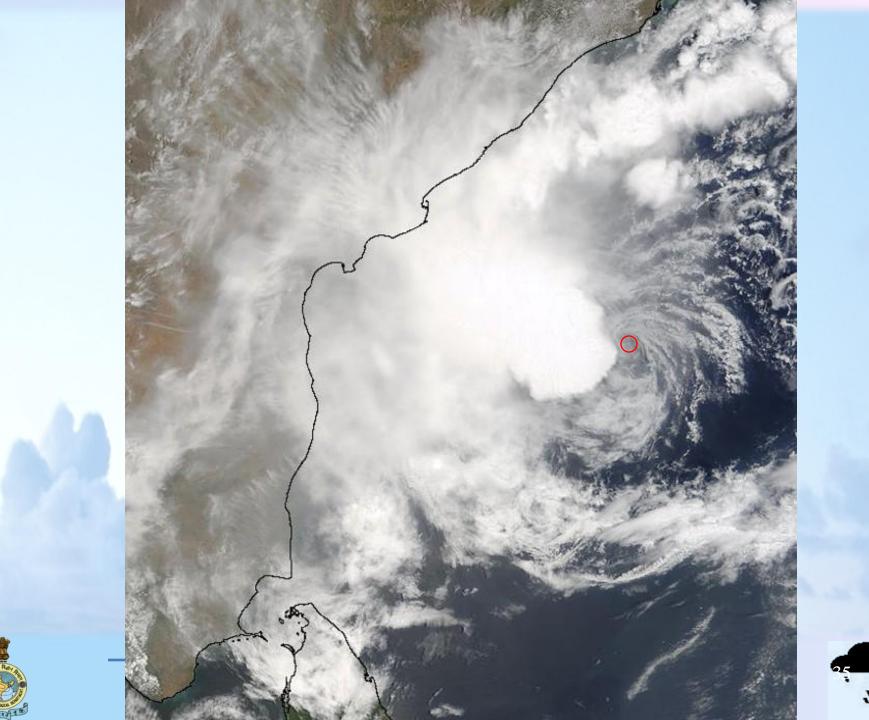
1)	4	(1)	
<1} from DG	<3/4 from DG	<'3° from DG	1/3 into DG
DT1.5±.5	DT2.5	ots	DT3.5

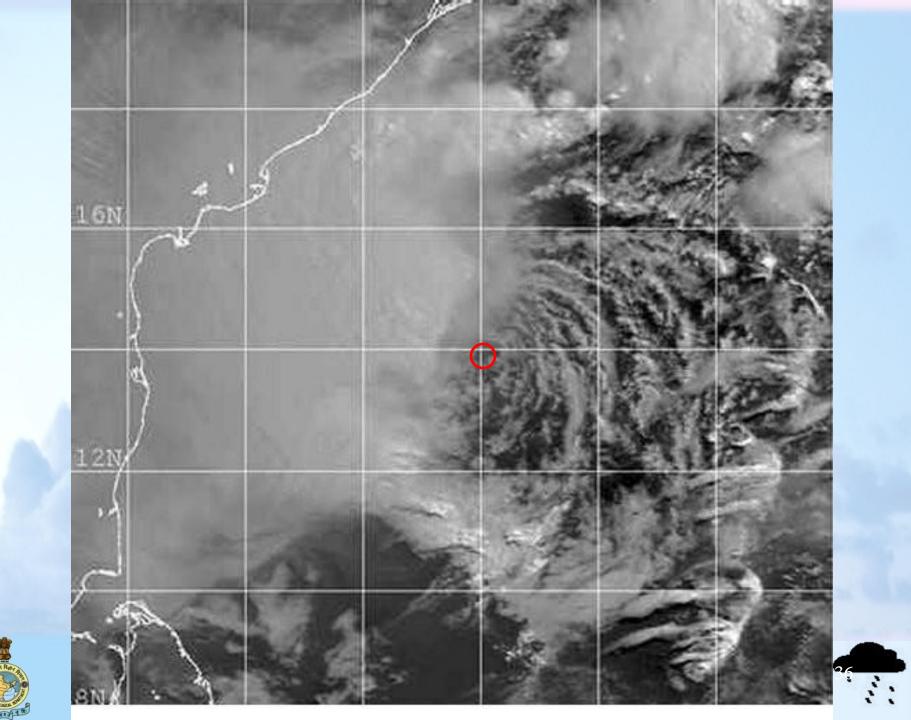
Kalpana-1 ^{5th} June'08 VIS 0500UTC Center distance from edge=0.8° So, DT=1.5

-20N

0N-

 $^{\circ}$





Covered Centre Patterns

In VIS these patterns are called Central Dense Overcast (CDO)

> In IR these patterns are called Embedded Centre (EC)





CDO PATTERN

> This type of pattern is analysed only with VIS imagery.

➤ The CDO is a dense overcast mass of clouds that appears within the curve of the curve band axis and covers the cloud system center.

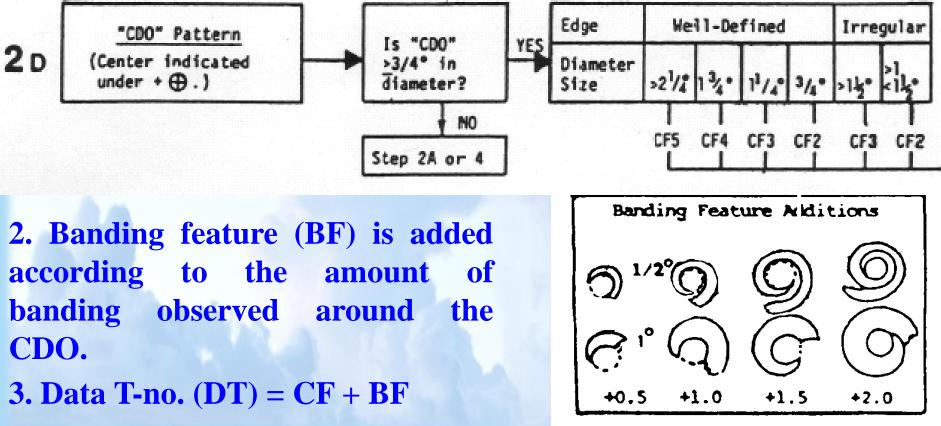




CDO PATTERN

Rules for measurement of T no. :

1.The boundary definition of the CDO and its size (diameter across narrowest width) provides the central feature (CF).







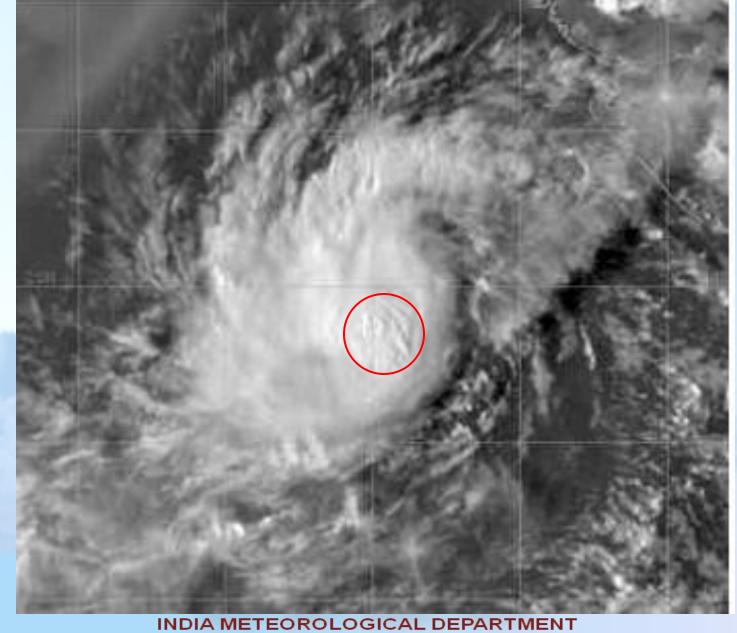
Kalpana-1 30th April'08 VIS 0800UTC CDO diameter=1.2° So, CF=3.0 BF=0.5 DT=3.0+0.5=3.5

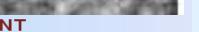
1.2°

12. A. 19.0

a the state

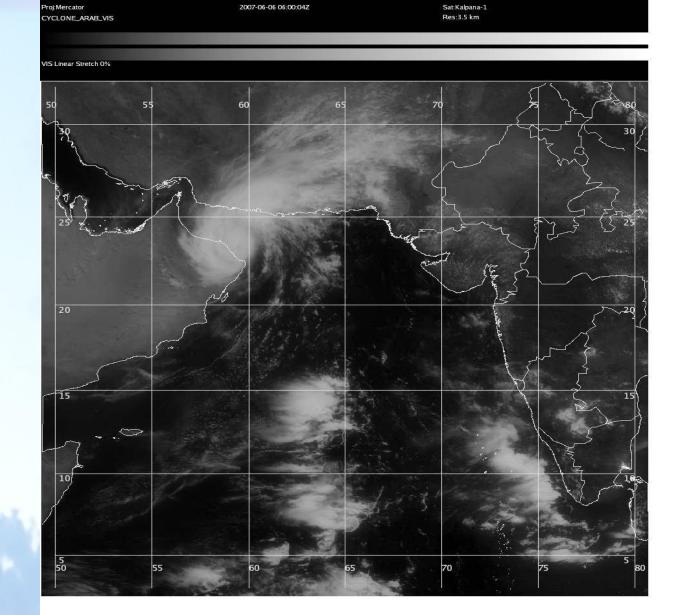
CDO PATTERN





2:

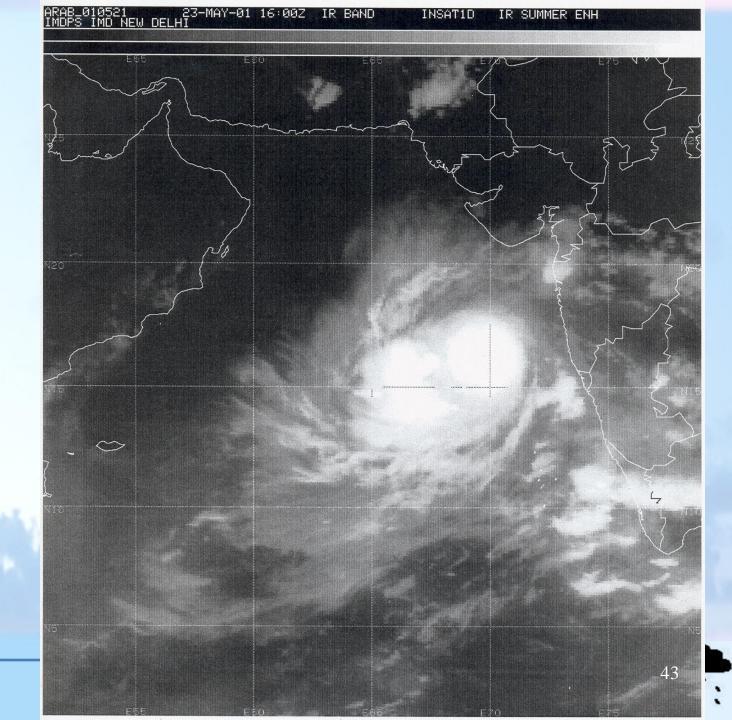
CDO Pattern







CDO Pattern





EMBEDDED CENTRE PATTERN

This pattern is only used with the EIR imagery when

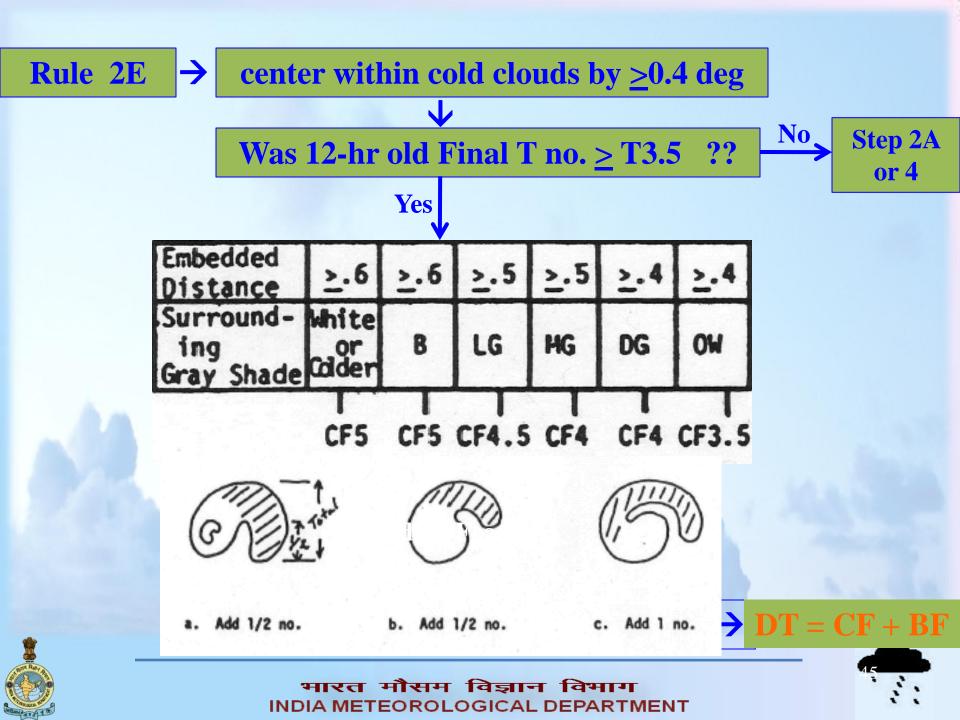
(1) the cloud system center clearly falls within the central overcast of the pattern ; and also

(2) the 12-hrs-old Final T no. was \geq 3.5.

EIR is used for measurements of covered center pattern to measure the CDO size and embedded distance measurements because in IR imageries thin Cirrus covers the boundaries of cloud features.







Kalpana-1 1st May'08 EIR 1500UTC Embedded distance =0.4° So, CF=3.5 BF=0.5 DT=4.0

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10

Kalpana-1 30th April'08 EIR 0900UTC Embedded distance =0.4° So, CF=3.5 BF=0 DT=3.5

Eye Pattern

>This pattern is the most complex of the five pattern types.

> Eye pattern appears only when intensity is greater than T2.0.

Intensity analysis for this pattern can be carried out by using both EIR and VIS imageries.

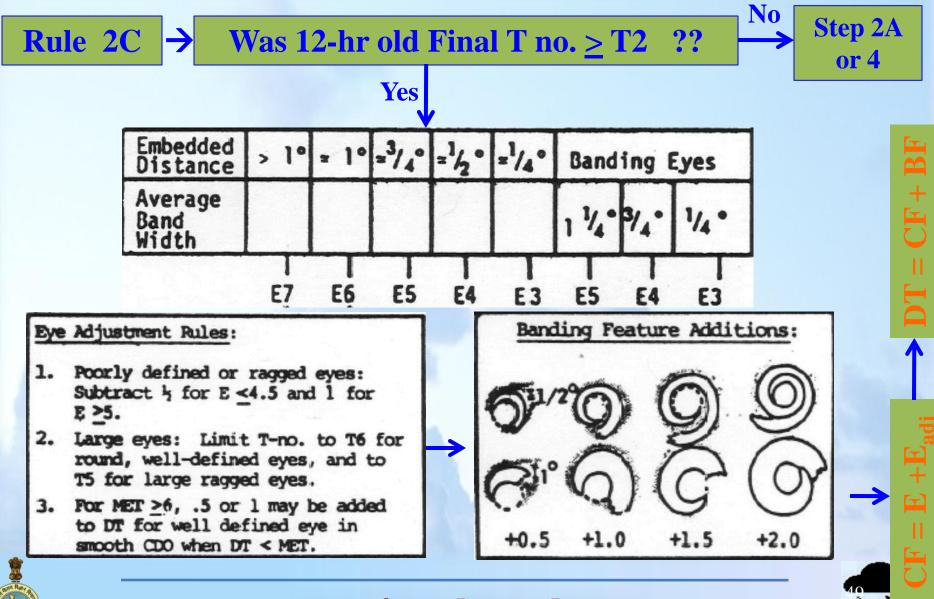
Eye Pattern Analysis by using VIS Imagery

For small eye (<0.6° diameter): Embedded distance is measured from the center of the eye, otherwise from the inner wall of the eye.





EYE Pattern Analysis by using VIS Imagery



<u>hancement</u>

90 Kalpana-1 11th Nov'07 VIS 0600UTC T6.0 19.5N/89.0E Pattern: Eye 0.9° **Embedded Distance=0.9** $E_{no} = 6.0$ E_{Adj}= 0 $CF = E_{no} + E_{Adj} = 6.0$ **BF= 0** DT=CF+BF=6.0 3

Kalpana-1 4th Jun'07 VIS 1100UTC

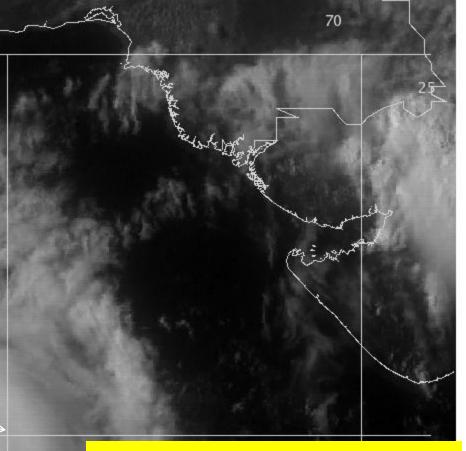
+60mmet

25

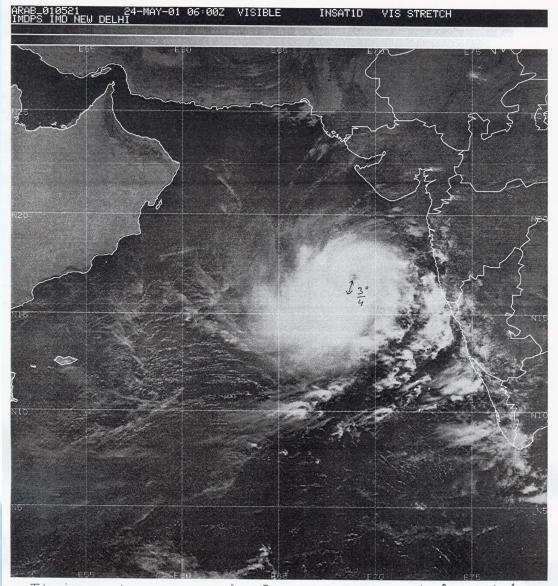
20



65



Embedded Distance = 1° So, E no.=6 E_{adj} rule \rightarrow Limit T6 BF=+0.5 So, DT=6+0.5=6.5



It is an "eye pattern". Embedded distance is $3|_{4}^{0}$ and is least in SW sector. So $E.Mo = \mathbf{f}$. Eye Adj = $-\frac{1}{2}$. B.F = 1.0. Hence $DT = \mathbf{f} - \frac{1}{2} + 1 = 5.5$





EYE Pattern by EIR Analysis

> If 24 hrs old T number ≥ 2 then we use this EIR analysis.

>We measure the narrowest width of the surrounding gray shade (which surround the cloud system center).

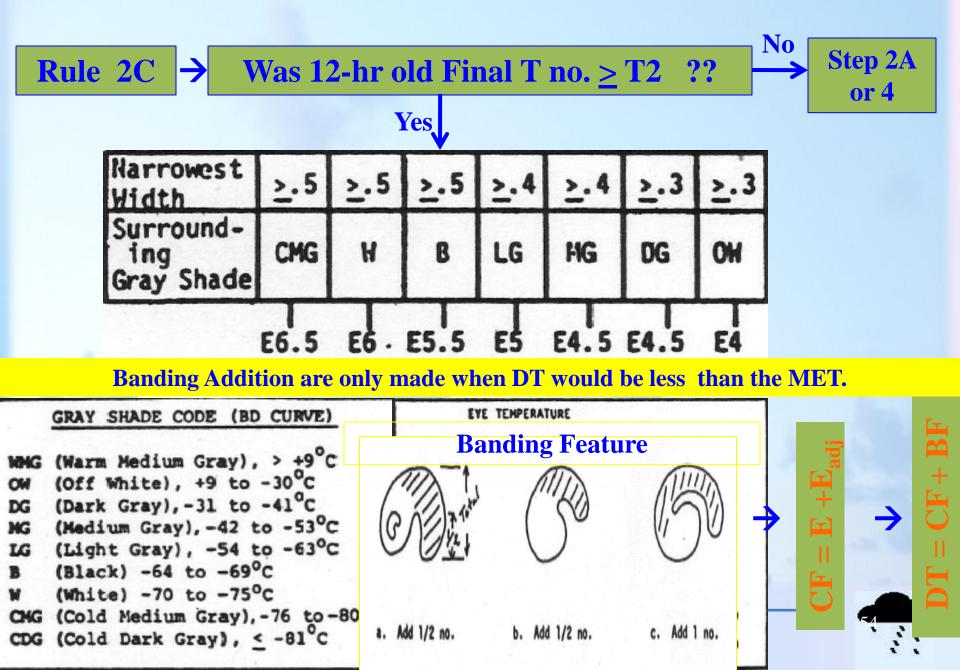
≻The gray shade which fulfill the minimum width criteria is considered to assign E Number.

➢If surrounding gray shade doesn't fulfill the criteria of minimum width then we consider outer gray shades, which fulfill the criteria of minimum width.





EYE Pattern Analysis by using EIR Imagery



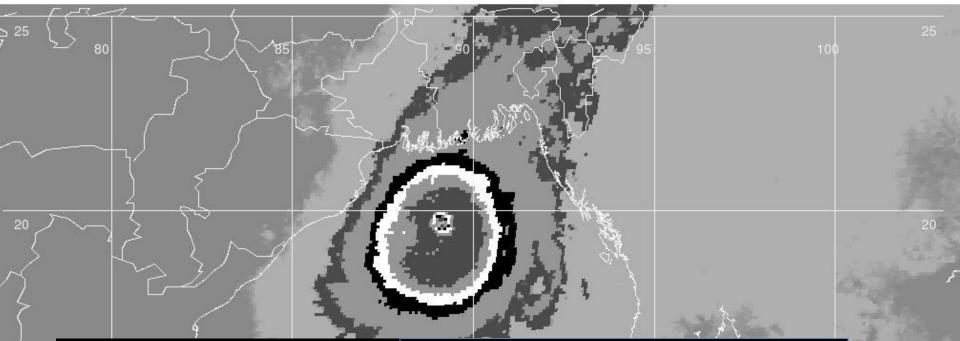
roj:Mercator YCLONE_BAY_IR

2007-11-15 06:00:04

Sat:Kalpana-1

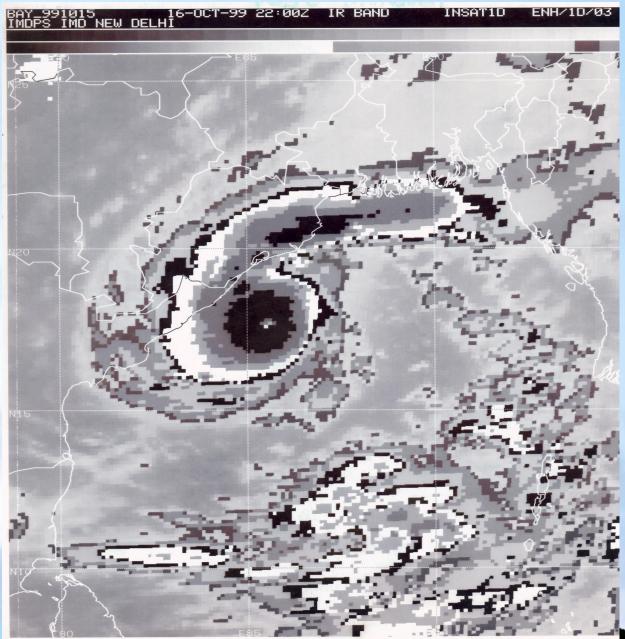
'IR dvorak180905

T6.0 19.5N/89.0E



Pattern: Eye Narrowest width= $\geq 0.5^{\circ}$ E_{no}= 5.5 Eye Temp = -38° Surr. Ring Temp= -80° So, E_{Adi}= 0.5 $CF = E_{no} + E_{Adj} = 5.5 + 0.5 = 6.0$ BF=0 DT=CF+BF=6.0

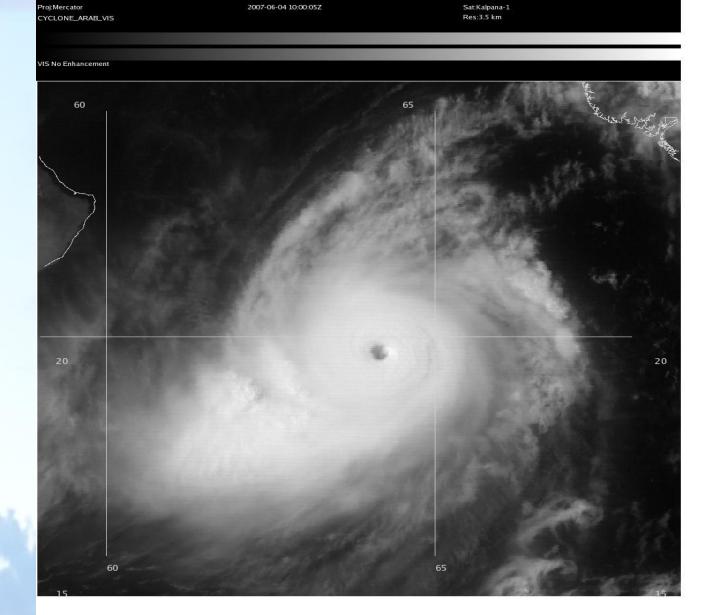
<u>Eye Pattern</u> <u>IR Enhancement</u>







Eye Pattern

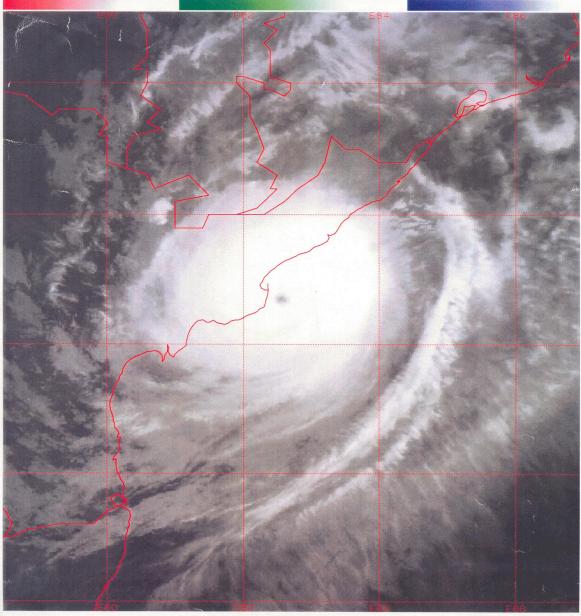






Eye Pattern

06-NOV-96 13:26Z CH4 CH4 CH4 NOAA12 TIROSN TIROSN TIROS IMD NEW DELHI BAY⊹CYCLONE NOV. 1996







Step No. 3: Central Cold Cover (CCC) Pattern

Rule 3:

(1)When past T-no \leq 3, maintained model trend for 12 hours; then hold same. (2)When past T-no \geq 3, hold T no. same and use as Final T no.

In this case all the cloud features related to its intensity are obscured by cirrus clouds. Also very little change in intensity occurs when this happens or we can say that this pattern is an indicates "arrested development" – and has immediate implications for the FT (DT can not be derived) and the ongoing rate of development.





Step No. 4: Past 24 hours trend (D, S, W)

Past 24 hours trend is determined by comparing the current and 24 hours past cloud features.

Development (D)

Development is generally associated with increased organization and better defined central features

a. Curve band pattern: curved band coils further around the CSC.
b. CDO: CDO becomes larger or an increasing in banding features.
c. Shearing Pattern: CSC become more tightly defined in curved cloud lines or appears closer to the dense overcast.

d. Eye Pattern: Eye is more embedded, more distinct (warmer) and less ragged or is surrounded by colder clouds or more banding features.
e. No significant (non-diurnal) warming of the cloud system is noted.







When we observe features opposite to the development a. to e.

Steady State

- a. A central cold cover (CCC) appears in T3.5 or greater tropical cyclones or has persisted for more than 12 hours in weaker systems.
- b. CSC relationship to the cold clouds has not changed significantly.
- c. There are conflicting indications of both development and weakening.





Step No. 5 & 6: Model expected T no. (MET) and the Pattern T no. (PAT)

In step 5, 6, second (MET) and third (PAT) estimates of intensity are determined for all cloud patterns other than CCC pattern.





Step No. 5: Model Expected T number (MET)

- The MET is determined for practically all clouds patterns no matter how clear-cut or how poorly defined.
- The MET is reasonable "first guess" intensity estimate that provides guidance when indications are vague, non-existence, or not within the limits of climatology.

MET determination:

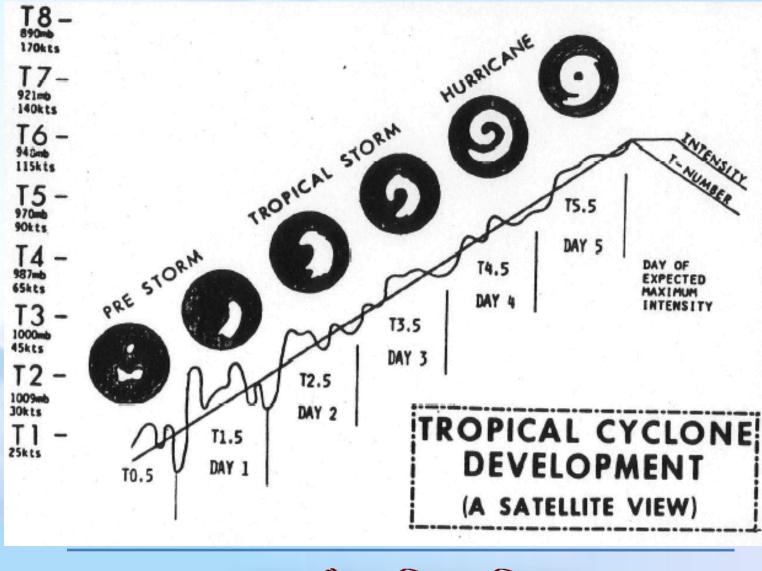
- Ist: compare today and yesterday (24 hour old) images apart and decide whether the storm has deepened(D), weakened(W) or remained steady(S).
- 2nd : add or subtract between 0 and 1.5 from 24 hour old final T no.





Model of tropical cyclone development used in intensity

analysis (curved band pattern type).



Step No. 6: Pattern T number (PT)

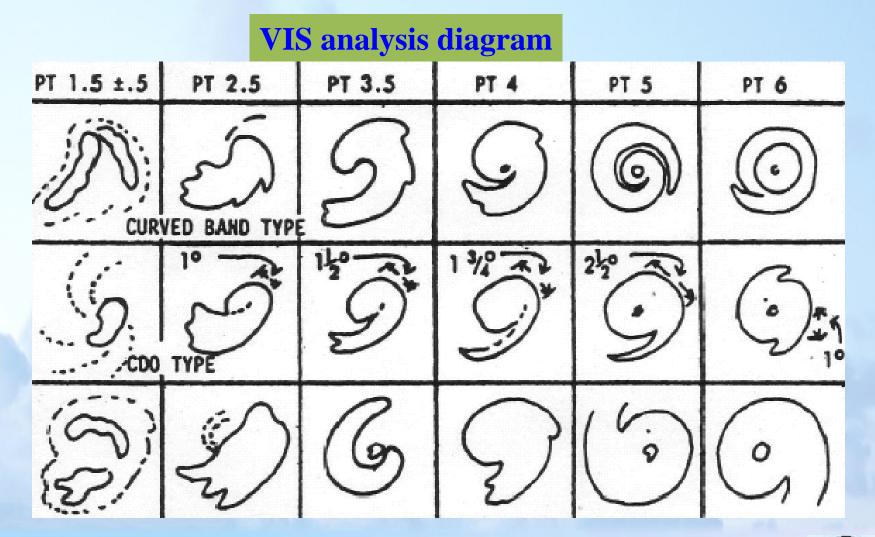
The Pattern T-No (PT) is not independent of the MET – it is an adjustment to the MET.

The PT is determined by first establishing the MET, then determining whether the pattern in the current imagery looks "obviously stronger or weaker" than the corresponding pattern indicated at step 6 on the flow chart.

The MET can then be adjusted by ± 0.5 (no greater adjustment can be made) and the resulting T-No is called the PT (so we can call it the "*adjusted-MET*").



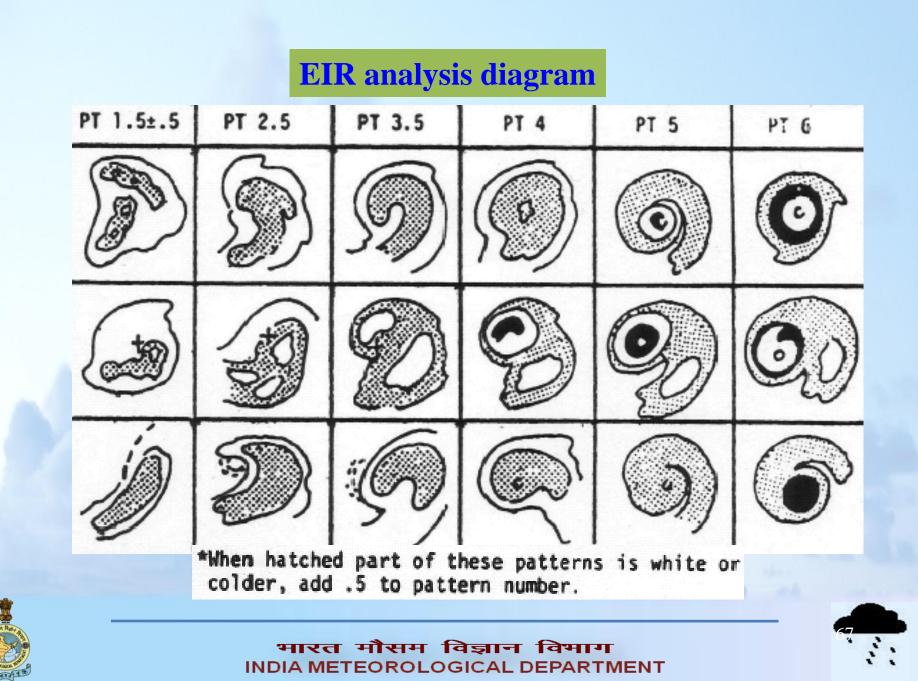












Step No. 7 and Step No 8: Final T number Determination

Step No. 7 : Rules for choosing between the DT, PAT, and MET numbers

Step No. 8 : Rules which constrain the Final T-number under specific circumstances.





Step No. 7 and Step No 8:

- ➢Use Data T-number (DT) from step 2 when cloud features are clear enough.
- >Use pattern T number when DT is not clear and
- >Use the MET for all other cases.
- The above rules are subject to the following constraints:
- •Initial classification must be T 1 or T 1.5.
- •During first 48 hours of development T number cannot be lowered at night.
- •24 hours after initial T 1, storm T number must be less than T 2.5
 •Final T number limits < T 4 change of ½ over 6 hours

≥ T 4 change of 1.0 over 6 hrs, 1.5 over 12 hrs, 2.0 over 18 hrs 2.5 over 24 hrs.





Step No. 9: Rules to determine Current intensity (CI) number

Each analysis results in a Final T-number as well as a CI number.

Rules:

- For developing cyclones: CI no is the same as final T no.
- For weakening cyclone: CI no. is higher than final T-no as storm continue to weaken.
- For redeveloping Cyclone: CI no remains same until the T-no rises to existing CI no.





Step No. 10: The 24 hours intensity forecast and track <u>forecast</u>

➢Winds at 200 mb can be used to forecast the direction in which the vortex is likely to move.

>If the vortex remained stationary, then it is an indication for further intensification or recurving.

If the vortex is near to the COL region then system remain stationary.





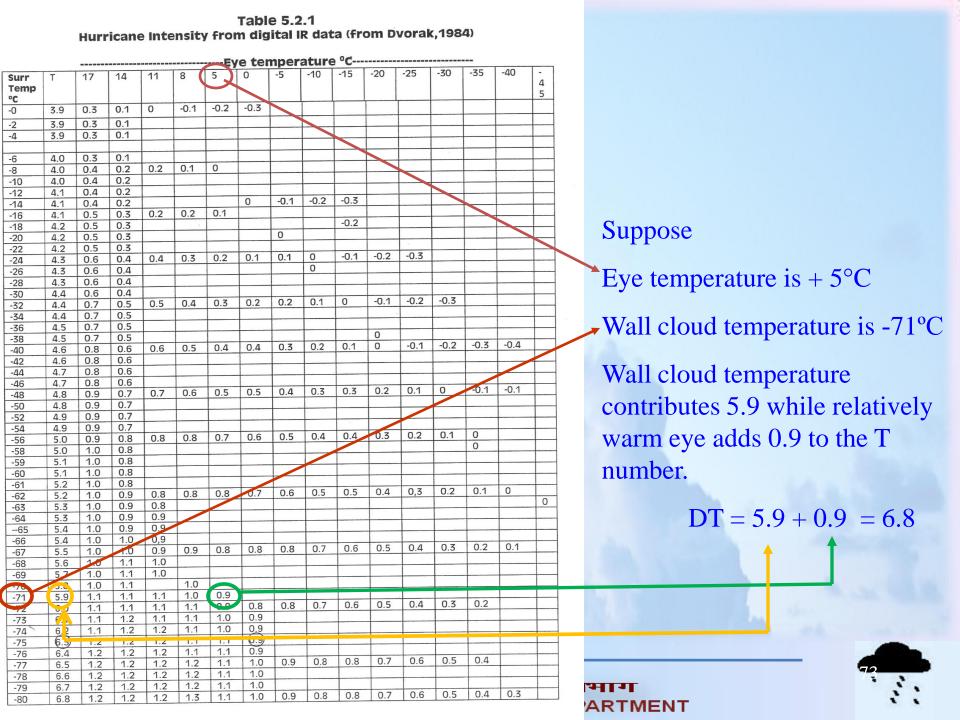
Digital IR Technique

In this method only two values of temperatures are required.

Temperature of the eye (the warmest pixel)
Coldest surrounding (wall clouds) temperature.





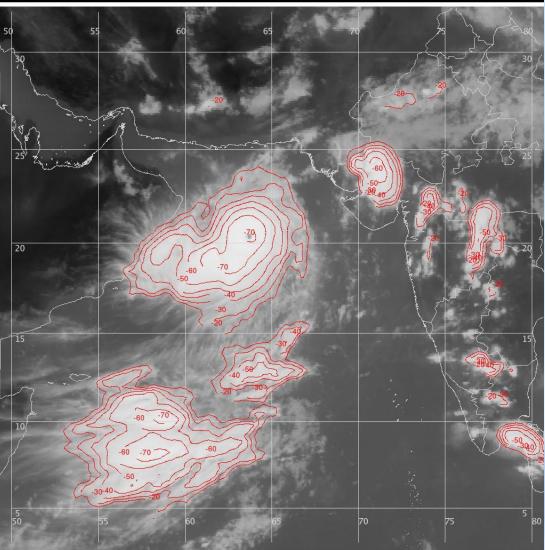


2007-06-04 12:00:05

Sat:Kalpana-1

Proj:Mercator CYCLONE_ARAB_IR

TIR No Enhancement

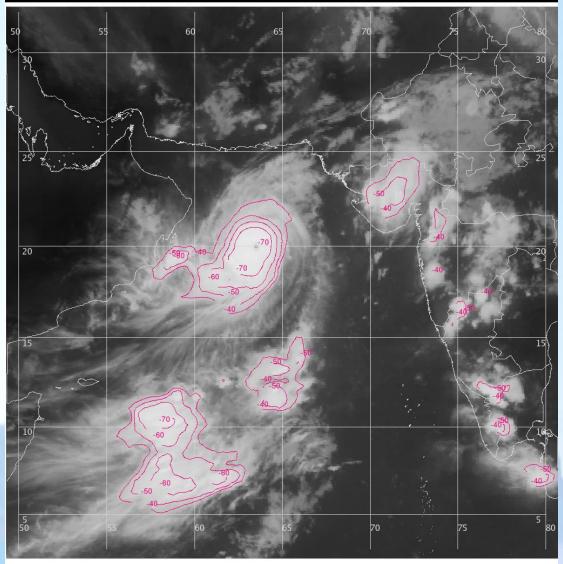






Proj:Mercator 2007-06-04 15:00:05 Sat:Kalpana-1 CYCLONE_ARAB_IR

TIR No Enhancement









Limitations of Dvorak Technique

- 1. Dvorak Tech does not directly measure wind, pressure, or any other quantity associated with TC intensity.
- 2. The method is subject to analyst interpretation
- **3.** Dvorak has expressed his views that analysis of weak system (T<2.5) is more complex and more subjective.





Limitations of Dvorak Technique

- 4. These weak systems are also more prone to diurnal and non-period oscillations in convection which have no relationship to the slowly varying circulation. Therefore we don't lower the T number at night during first 24 hours of development.
- 5. The technique is physically restricted due to natural variability between the remotely sensed cloud patterns and the wind speed.
- 6. The most limiting factor of the technique is dependence on IR imagery during night in which cirrus can obscure TC organisation.





Automation of Dvorak Technique and Recent Developments





Intensity Measurement Algorithms

ODT -- (Velden/Olander) 1995-2001
 AODT -- (Olander/Velden) 2001-2004

ADT-(Olander/Velden) 2004-present





ODT : Objective Dvorak Technique, CIMSS, Olander / Velden

Velden, C.S., T.L. Olander, and R.M. Zehr, 1998: Development of an objective scheme to estimate tropical cyclone intensity from digital geostationary satellite infrared imagery. *Wea. and Forecasting*, **13**, 172-186

>Documented and validated objective algorithm and showed it to be competitive with the operational Dvorak technique.

Applicable only for Intense System (Hurricane/Typhone Strength).

Required manual selection of Storm Centre.





AODT: Advanced Objective Dvorak Technique, CIMSS, Olander / Velden

Technique developed for tropical_depression and storm stages.

- implemented several additional rules and methodologies.
- Incorporated an automated storm center determination methodology.





ADT: Advanced Dvorak Technique, CIMSS, Olander / Velden

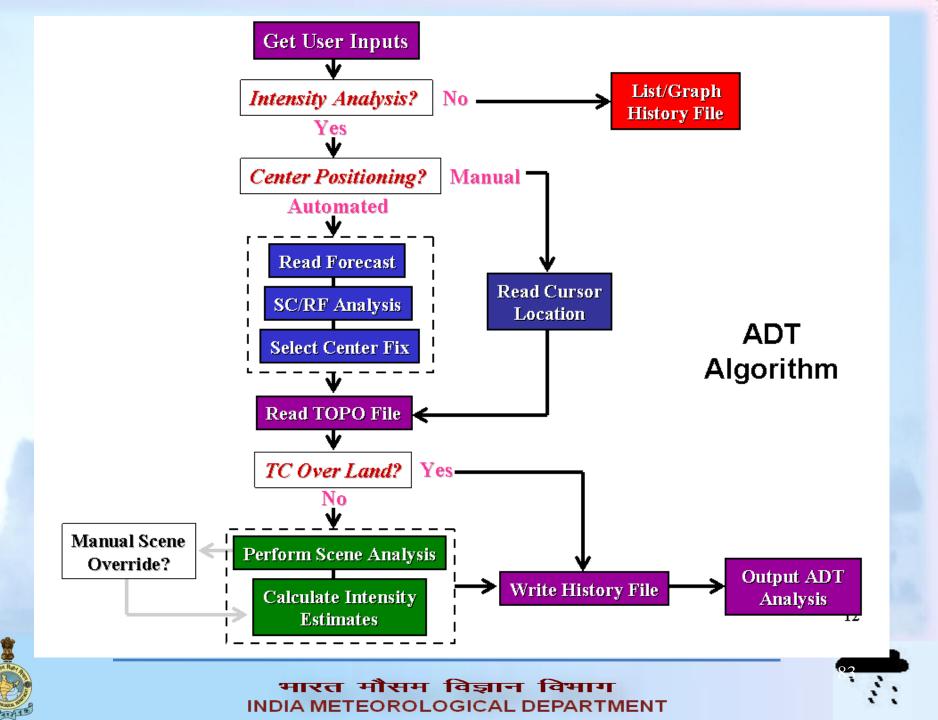
Velden, C.S., and T.L.Olander, 2006: The Advanced Dvorak Technique (ADT) – continued development of an objective scheme to estimate tropical cyclone intensity using geostationary infrared satellite imagery. Submitted, *Wea. and Forecasting*

Implemented operationally at:

1.TPC / NHC 2. JTWC







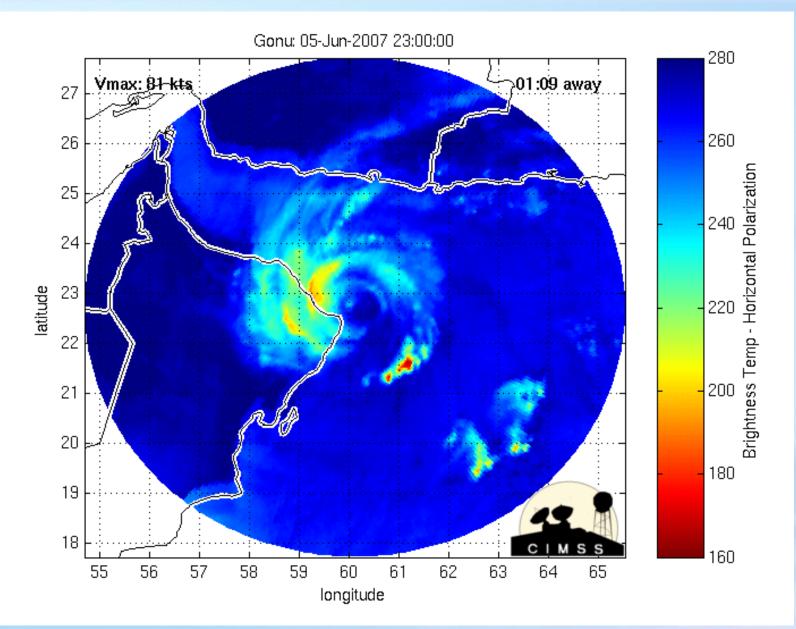
Use of advance Satellite Products in TC analysis

> QSCAT
> ASCAT
> WVW
> SSMI
> TMI
> AMSU

Morphed integrated microwave imageries



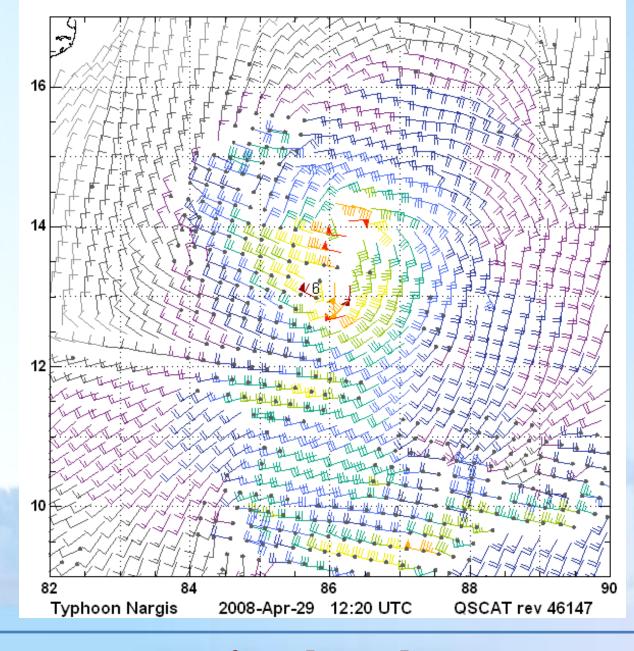
















- 1. When available use VIS-IR pairs. Perform at least two VIS analysis per day to check agreement between VIS and IR analysis.
- 2. When an image can be analysed using more than one pattern perform both analysis and compare the results (Dvorak 1984).
- 3. Always try to analyse more than one image leading up to the analysis time, then average the resulting DT numbers (Dvorak 1984,1995). This is particularly applicable to shear patterns that often go through a cyclic pattern of convection blow-up near the low-level centre followed by increasing separation of the overcast from the low-level centre. This can lead to rapidly varying DT numbers over several hours.





4. It is good practice to perform a reanalysis of earlier imagery whenever a TC reaches a stage of welldefined intensity (for example when an eye first appears). The dependency of the Dvorak technique on the MET can lead to situations where it appears that model constraints have to be broken, when in fact a reanalysis of previous day's data shows that earlier FTs could have been higher and the analyst(s) has (have) 'got behind the power curve'.





- Recognise the limitations of the Dvorak technique it was not designed for monsoon depressions, subtropical systems or systems undergoing extratropical transition (Dvorak 1995). A separate technique exists for the classification of subtropical systems (Herbert and Poteat 1975).
- 6. The Dvorak technique does not adjust for the effects of system translation on surface winds. It was initially derived using a set of cyclones with an average speed of around 3-12 knots (Brown and Franklin 2004). For systems with close to average translation speeds the error from this will generally be much less than that inherent in the technique itself. For systems with rapid translation speeds the error may be significant, however the effect of translation on surface wind speeds is complex and non-linear and there is no systematic way of incorporating these effects into warning policy.





- There can be times in a TC's life cycle when no DT can be determined do not force a DT when no pattern can be applied – use the MET or other observations (e.g. scatterometer data) to help estimate intensity in these circumstances.
- 8. The winds experienced at the surface vary depending on the presence of deep convection. Thus a weak system that is going through a diurnal maximum in convection will generally have larger areas of more damaging winds than a weak system that is going through a diurnal minimum in convection. This can make the difference between a Category 2 (Australian scale) impact and a Category 1 or weaker impact.
- 9. Midget cyclones (gale radius < 60 nm) present problems for analysis. Although Dvorak states 'It is the pattern formed by the clouds of a tropical cyclone that is related to the cyclone's intensity and not the amount of clouds in the pattern'(Dvorak 1984), several parts of the technique rely on measurements of size (most noticeably in the CDO pattern, but also when determining BFs). Midget storms tend to intensify and decay more rapidly than larger storms.





- 10. Whenever Dvorak talks about the 'model' he is referring to the Dvorak model of TC development wherein a cyclone intensifies by one T-number per day.
- 11. It is a common mistake amongst inexperienced analysts to assume that the MET is the same as the 'Forecast Intensity Number' from 24 hours ago. The first step in determining the MET is to qualitatively compare images 24 hours apart (remove diurnal influences) and decide whether the storm has deepened (D), weakened (W) or remained steady (S). The second step is to add or subtract between 0 and 1.5 from the 24-hourold FT (not the DT or CI) based on the D, S, W determination (Dvorak 1984, 1995).
- 12. The pattern T-number (PT) is not independent of the MET it is an adjustment to the MET (Dvorak 1984). The PT is determined by first establishing the MET, then determining whether the pattern in the current imagery looks 'obviously stronger or weaker' (Dvorak 1984) than the corresponding pattern indicated at step six on the flow chart. The MET can then be adjusted by ±0.5 (no greater adjustment can be made (Dvorak 1995)) and the resulting T-number is called the PT (we could have called it the 'adjusted-MET').





15. Recent comparisons of reconnaissancebased best-track data (Atlantic basin) with Dvorak intensity estimates found that Dvorak intensity estimates of weakening storms showed an overestimation bias. This bias could be virtually removed by using a sixhour rule for holding the CI number during initial weakening rather than the existing 12hour rule (Brown and Franklin 2004).





16. The same study (Brown and Franklin 2004) found that:

- (a) Dvorak intensity estimates had an RMS error of 11.0 knots;
- (b) 50 per cent of Dvorak intensity estimates were within 5 knots;
- (c) 75 per cent of Dvorak intensity estimates were within 12 knots;
- (d) 90 per cent of Dvorak intensity estimates were within 18 knots;
- (e) for storms moving faster than 12 knots there was a slight underestimation bias.
- 17. The advent of frequent passive microwave imagery has given tropical cyclone forecasters greater insight into structural and intensity changes in tropical cyclones than can be obtained through IR and VIS imagery alone. The Dvorak technique cannot be validly applied to microwave imagery, however forecasters should use microwave imagery to assist in determining the centre position. Trends in intensity that are evident in sequences of microwave imagery can also inform the analysis process.





Lank you



