#### Towards better macroeconomic measurement

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#### How do we measure the business cycles?

- Employment
- Personal income
- Production
- Sales

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#### What we have achieved?

- Employment
- Personal income
- Production
- Sales

3 + 4 = +

#### Two steps towards better measurement

For production: GDP excluding agriculture and excluding government: Output of individuals and firms in industry and services

- Fluctuations in agriculture do not reflect business cycle conditions.
- Spending by Government does not reflect business cycle conditions.
- Using firm data:
  - We look at the sales of non-finance, non-oil companies
  - For each pair of quarters, we work out the percentage change in sum of sales across all the firms
  - Construct a net sales index

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## Part I

## Seasonal adjustment

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### Why seasonal adjustment?

- Large seasonal movements can obscure important features of a time series:
  - Direction
  - 2 Turning points
  - Onsistency between indicators
- Bell and Hillmer (1984) "Seasonal adjustment is done to simplify the data so that they may be more easily interpreted....without a significant loss of information"
- Seasonal adjustment is the first step towards a meaningful business cycle measurement.

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#### Seasonal adjustment in India

- No statistical agency in India releases seasonally adjusted data
- This acts as roadblock
- We have set up a framework to carefully monitor key macroeconomic series and adjust for seasonality through X-12-ARIMA program.

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### Steps in seasonal adjustment

#### Pre-adjustment analysis

- Visual inspection
- Additive vs multiplicative seasonality
- User defined regressors-Diwali effect

#### X-12-ARIMA run

- X-12-ARIMA diagnostics
- Outlier detection and adjustment
- Freezing model for subsequent adjustment

#### Seasonal fluctuations in IIP



### IIP: Adjusting for seasonality



#### IIP: Adjusting for seasonality and outliers



#### Our testing framework

| List of candidate series for seasonal adjustment   |                               |                             |
|--|-------------------------------|-----------------------------|
| GDP  | Non-agri GDP                  | Non-agri, non Govt GDP      |
| Net sales  | Index of export income        | Operating profits           |
| IIP  | IIP (Manufacturing)           | IIP (Capital goods)         |
| IIP (Consumer goods)                               | IIP (Mining)                  | Car production              |
| Car sales  | Exports                       | Non-oil exports             |
| CPI (IW)   | WPI (Food articles)           | WPI (Fruits and vegetables) |
| M1   | M3                            | Non-oil imports             |
| WPI (Non-food, non-fuel), Non-oil non gold imports | Profit margin                 |                             |
| Announced projects                                 | Under implementation projects | Total outstanding           |

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## Part II

## Business cycle turning points

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#### Selection of series

| List of candidate series for coincident indicator |                               |                              |  |
|---|-------------------------------|------------------------------|--|
| Exports   | Cars and vans production      | Cars and vans sales          |  |
| Imports   | Non-oil imports               | Govt manufacturing announced |  |
| Pvt manufacturing announced                       | Govt infrastructure announced | Pvt infrastructure announced |  |
| Govt announced                                    | Pvt announced                 | Govt manufacturing UI        |  |
| Govt infrastructure UI                            | Pvt infrastructure UI         | All industries govt          |  |
| All industries pvt                                | All industries all ownership  | Non-food credit              |  |
| IIP (Manufacturing)                               | IIP (Consumer goods)          | IIP (Capital goods)          |  |
| CPI-IW  | WPI (Food articles)           | WPI (Fruits n vegetables)    |  |
| REER  | Corporation sales             | Total expenses               |  |
| Operating profit                                  | Export income                 | PAT to Sales                 |  |
| PBDIT to Sales                                    | INR/USD                       | FDI                          |  |
| M3  | Cospi-PE                      | Cospi closing                |  |
| Pvt manufacturing UI                              | Non-oil exports               | Non-oil, non gold imports    |  |

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#### Reference series and data

- Non-agri Non-govt Gross Domestic Product (Constant prices SA).
- Data is available from 1999 (July-Sep) to 2013 (Apr-Jun).
- Variables are adjusted for seasonality and deflated with CPI-IW.
- Trade variables are deflated using WPI.

## Part III

## Methodology

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### Growth Cycle Approach

- Growth cycle approach to identify the turning points in Indian business cycle.
- The series is adjusted for seasonal fluctuations.
- Following Mintz, (1969,72,74) the identification of turning points is based on cyclical component.

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### Growth Cycle Approach

- The approach involves the choice of a filter to isolate the trend and the cyclical component.
- We use the HP filter to extract the cyclical component
- The standardised cyclical component forms the reference series to apply the business cycle dating algorithm.

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## Part IV

# Turning points

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#### Identification of Business Cycle Turning Points

- The identification of turning points dates back to the dating algorithm used by Bry and Boschan (1971).
- The algorithm was improved and extended to quarterly series by Harding and Pagan, (2002) and (2006).

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#### GDP Non-agri Non-gov: Cyclical characteristics

| CF-I    | Filter  | HP-I    | Filter  |
|---------|---------|---------|---------|
| Peak    | Trough  | Peak    | Trough  |
| 2000 Q4 | 2001 Q3 | 2000 Q1 | 2003 Q2 |
| 2002 Q2 | 2005 Q2 | 2003 Q4 | 2004 Q4 |
| 2007 Q2 | 2009 Q2 | 2007 Q1 | 2008 Q4 |
| 2011 Q1 | 2011 Q4 | 2011 Q1 |         |

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# GDP Non-agri Non-gov: Cyclical characteristics with HP filter



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# Cyclical characteristics of some key variables using HP filter

| Net S   | Sales   | IIP Manu | Ifacturing | Exp     | orts    |
|---------|---------|----------|------------|---------|---------|
| Peak    | Trough  | Peak     | Trough     | Peak    | Trough  |
| 2000 Q3 | 2002 Q4 | 2000 Q4  | 2003 Q4    | 2000 Q2 | 2002 Q1 |
| 2004 Q3 | 2005 Q3 | 2005 Q1  | 2006 Q1    | 2002 Q3 | 2003 Q2 |
| 2007 Q4 | 2009 Q4 | 2007 Q4  | 2009 Q2    | 2005 Q1 | 2005 Q3 |
| 2011 Q3 |         | 2011 Q1  | 2011 Q4    | 2008 Q2 | 2009 Q2 |
|         |         | 2012 Q3  |            | 2010 Q1 | 2010 Q3 |
|         |         |          |            | 2011 Q1 |         |

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#### Net sales: Turning points



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## IIP (Manufacturing): Turning points



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#### Exports: Turning points



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## Part V

## **Coincident indicators**

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#### Cross-correlation analysis

- It is a complement to the peaks and trough analysis.
- Gives an idea of the extent to which the cyclical component of reference series and candidate series are related.
- We find the lag at which the correlation is maximum and greater than 0.45.
- For coincident indicators, the correlation should be maximum and greater than 0.5 at lag=0 (current quarter)
- On the basis of this principle the chosen variables are:
  - non-oil exports
  - 2 non-oil non-gold imports
  - Car sales
  - private manufacturing under-implementation
  - non-food credit
  - IIP (Manufacturing)
  - 🗿 net sales
  - operating profit

#### Coincident indicators: Alternative criteria

- We choose those variables whose correlation is greater than 0.45 at t=0 but not at the previous two quarters.
- This is done to exclude the possibility of a leading indicator being chosen as a coincident indicator.
- The variables chosen on the basis of this criteria are:
  - non-oil exports
    - 2 non-oil non gold imports
    - 3 all industries under-implementation
    - government announced projects
  - outstanding government projects
  - non-food credit
- We use these variables to construct a coincident index

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#### Construction of coincident index

- Conference Board (NBER) inverse standard deviation methodology
- Robust principal component analysis

# Coincident index using the Conference Board methodology

- Calculate point-on-point changes
- Adjust point-on-point changes by component's standardisation factor (inverse of standard deviation),
- Add the adjusted point-on-point changes across the components for each month
- Convert the series into index
- Repeat this procedure for reference series
- Plot the cyclical component of the reference index and the coincident index

#### Coincident index and reference series



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### Principal component analysis

- Find the cyclical components of the chosen coincident variables
- The robust principal components of the cyclical variables are regressed on the cyclical component of the reference variable
- The predicted series is the coincident index
- Compare this with the cyclical component of reference series

# Proportion of variance explained by the principal components

| PC  | Proportion of variance (cumulative) |
|-----|-------------------------------------|
| PC1 | 48.2                                |
| PC2 | 79.8                                |
| PC3 | 90.9                                |
| PC4 | 96.1                                |
| PC5 | 99.3                                |
| PC6 | 100                                 |

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#### Coincident index using robust PCA



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- Sensitivity of results to the choice of filter
- Leading indicator analysis

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#### Thank you

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