## Scanner Data, Time Aggregation and the Construction of Price Indexes

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## Time aggregation and scanner data

- □ Scanner data increasingly available
  - Contains highly detailed information on consumer purchases
  - Statistical agencies in Netherlands, Norway and Switzerland currently using scanner data
- □ Increasing number of ways data can be aggregated
- Existing literature shows time aggregation likely to be important (Reinsdorf (1999), Bradley et al (1997), de Haan and Opperdoes (1997), Dalen (1997))
- Limitation of existing studies: small number of product categories
  - Difficult to make generalisations about findings

## Scanner data set

- Data collected by A.C. Nielsen
- □ Period covered: 02/02/97 26/04/98 (65 weeks)
- 111 stores located within the Brisbane area
- □ Item categories include:

| Biscuits | Detergent   | Margarine   | Sugar        |
|----------|-------------|-------------|--------------|
| Bread    | Frozen peas | Oil         | Spreads      |
| Butter   | Honey       | Pasta       | Tin tomatoes |
| Cereal   | Jams        | Pet food    | Toilet paper |
| Coffee   | Juices      | Soft drinks |              |

- Data aggregated to weekly data
- Additional information: description, EANAPN (unique identifier for each item)

## Index number estimation

- Direct and chained indexes estimated
- Two types of chained indexes:
  - Flexible chained: basket of goods allowed to change
  - Fixed chain: basket of goods same as direct indexes
- □ Types of indexes estimated:
  - Laspeyres, Paasche, Fisher, Törnqvist and Walsh

## Aggregation methods

- □ Average price and total quantities aggregated at:
  - weekly,
  - monthly; and
  - quarterly intervals.
- □ Items treated as:
  - different goods if they were not located in the same store (ie. *no* item aggregation over stores); and
  - the same good no matter which store they were in (ie. item aggregation over stores).
- In total 6 different aggregation methods

#### Index number results: Laspeyres flexible chained indexes (Base = 100)

|             | Quart  | Week    |              | Quart  | Week     |
|-------------|--------|---------|--------------|--------|----------|
| Biscuits    | 100.65 | 318.33  | Margarine    | 111.94 | 13897.59 |
| Bread       | 106.16 | 3146.25 | Oil          | 94.10  | 132.41   |
| Butter      | 102.80 | 193.00  | Pasta        | 101.97 | 790.75   |
| Cereal      | 102.36 | 361.49  | Pet food     | 102.53 | 263.49   |
| Coffee      | 113.72 | 543.34  | Soft drinks  | 111.82 | 46575.10 |
| Detergent   | 103.50 | 227.96  | Spreads      | 105.51 | 140.14   |
| Frozen Peas | 101.92 | 300.51  | Sugar        | 107.20 | 176.18   |
| Honey       | 105.05 | 128.45  | Tin tomatoes | 103.15 | 212.26   |
| Jams        | 101.40 | 294.13  | Toilet paper | 107.31 | 11955.97 |
| Juices      | 103.51 | 821.30  |              |        |          |

#### Index number results: Fisher flexible chained indexes (Base = 100)

|             | Week   | Quart. |              | Week  | Quart. |
|-------------|--------|--------|--------------|-------|--------|
| Biscuits    | 79.86  | 97.91  | Margarine    | 79.35 | 104.06 |
| Bread       | 99.32  | 104.00 | Oil          | 80.89 | 91.33  |
| Butter      | 96.53  | 100.83 | Pasta        | 77.68 | 100.11 |
| Cereal      | 84.47  | 100.18 | Pet food     | 95.04 | 100.49 |
| Coffee      | 87.79  | 110.30 | Soft drinks  | 74.28 | 104.01 |
| Detergent   | 91.99  | 102.06 | Spreads      | 99.66 | 104.39 |
| Frozen Peas | 89.48  | 100.55 | Sugar        | 89.90 | 106.14 |
| Honey       | 101.29 | 104.21 | Tin tomatoes | 88.12 | 101.32 |
| Jams        | 81.48  | 99.93  | Toilet paper | 79.86 | 100.43 |
| Juices      | 90.94  | 100.76 |              |       |        |

# Index number results: Fisher direct indexes (Base=100)

|             | Week   | Quart. |              | Week   | Quart. |
|-------------|--------|--------|--------------|--------|--------|
| Biscuits    | 101.01 | 99.01  | Margarine    | 103.88 | 103.85 |
| Bread       | 105.27 | 103.72 | Oil          | 86.16  | 91.95  |
| Butter      | 99.64  | 100.63 | Pasta        | 102.78 | 100.88 |
| Cereal      | 103.22 | 100.41 | Pet food     | 102.84 | 100.88 |
| Coffee      | 113.67 | 110.41 | Soft drinks  | 107.09 | 104.04 |
| Detergent   | 104.14 | 102.68 | Spreads      | 106.29 | 104.29 |
| Frozen Peas | 101.42 | 100.82 | Sugar        | 106.97 | 106.56 |
| Honey       | 105.06 | 104.52 | Tin tomatoes | 100.47 | 101.70 |
| Jams        | 101.53 | 101.18 | Toilet paper | 94.45  | 99.86  |
| Juices      | 101.55 | 101.45 |              |        |        |

## Index number results: summary

- Time aggregation has huge impact on all index number estimates
  - Expect this for chained or non-superlative BUT
  - Even direct and/or superlative indexes affected
- Weekly chained indexes often unreasonable and exhibit large amount of chain index drift
- Unclear how much of quarterly and monthly chained indexes is drift and how much is actual price change
- Want drift free estimate of price change may get us closer to 'truth'

## **GEKS** method

- Multilateral index typically used for cross country comparisons
  - Satisfies circularity or transitivity
- GEKS: geometric mean of all ratios of bilateral Fisher indexes where each entity is taken in turn as base

$$\text{GEKS}_{jk} = \prod_{l=1}^{M} \left[ P_{jl} / P_{kl} \right]^{1/N}$$

- $P_{jl}$  = Fisher index between country j and l, l=1...m
- P<sub>kl</sub> = Fisher index between country k and l, l=1...m
- GEKS satisfies multiperiod identity test and is free of chain index drift
- Modify formula: replace countries with time periods

## **Calculating GEKS**

- □ Example: for monthly index:
  - Compute Fisher ideal indexes that compare all n months with the base month
    - Use data on all items which appears in both periods for Fisher indexes (maximise matching across time)
    - □ From this we obtain *n* separate monthly time series
  - Take the geometric average of the *n* time series
  - Resulting price series is free of drift

## **GEKS** estimation method

- GEKS indexes estimated for 2 item categories:
  - toilet paper and butter
- □ GEKS indexes estimated between periods:
  - Quarterly: 1-2, 1-3, 1-4 and 1-5
  - Monthly: 1-2, 1-3 ...1-14 and 1-15
- □ Aggregation methods:
  - quarterly and monthly time aggregation
  - item aggregation over stores and no item aggregation over stores

## Quarterly comparisons



## Quarterly comparisons



## Monthly comparisons



## Monthly comparisons



## Rolling window GEKS

- Drawback GEKS: when new period of data available all previous parities are recomputed
  - Unacceptable for statistical agency
- Propose Rolling Window GEKS (RWGEKS)
  - Use rolling window to continuously update price series
  - No need to revise previous period parities
  - 'Natural' choice for window: 13 months
  - 13 month window → Rolling Year GEKS (RYGEKS)

## Calculating RYGEKS

#### □ For monthly RYGEKS index:

- Compute GEKS index between month 1 13 as done previously (GEKS<sub>1-13</sub>)
- For next entry (chain link) in price series, month 1 is dropped form rolling window and month 14 is added to our rolling window
- GEKS index is then calculated between periods 13-14 using all data from months 2-14 (GEKS<sub>13-14</sub>)
- □ To obtain RYGEKS index for month 14:
  - RYGEKS (14) =  $GEKS_{1-13} \times GEKS_{13-14}$

## **GEKS and RYGEKS: Toilet paper**



#### **GEKS and RYGEKS: Butter**



## GEKS and official CPI figures

- □ Australian CPI: quarterly CPI estimates
- □ GEKS indexes :
  - Scanner data for Brisbane (Official CPI: Australia)
  - Match 6 scanner data item categories with official CPI sub heading groups
  - 4 quarters of scanner data matched with official series
  - Calculate quarterly GEKS indexes (series too short for RYGEKS)
  - 2 aggregation methods:
    - □ Item aggregation over stores
    - □ No item aggregation over stores

## ABS CPI and GEKS indexes (April 97 – March 98)

|             | GEKS I                          | Official CPI figures                  |        |
|-------------|---------------------------------|---------------------------------------|--------|
|             | Item aggregation<br>over stores | No item<br>aggregation over<br>stores |        |
| Cereal      | 100.09                          | 100.21                                | 97.51  |
| Bread       | 101.47                          | 101.40                                | 102.41 |
| Butter      | 99.25                           | 99.86                                 | 99.89  |
| Juices      | 100.10                          | 100.30                                | 100.99 |
| Sugar       | 98.08                           | 98.34                                 | 105.35 |
| Soft drinks | 99.43 99.64                     |                                       | 103.43 |
| Geomean     | 99.73                           | 99.95                                 | 101.56 |

#### Results: ABS CPI and GEKS indexes

- Very little difference between 2 GEKS series
- Five out of six item categories: GEKS less than official CPI figures
- Some differences between official series and GEKS quite large, eg. soft drinks: approx 4%.
- □ Difference in Geomean of official CPI and GEKS:
  - No item agg. over stores:1.61 percentage points
  - Item agg. over stores: 1.83 percentage points
- Results indicate may be substantial amount of substitution bias in official figures

## Country Product Dummy (CPD) Method

- Another multilateral index method
- CPD method is transitive
- CPD: obtain standard errors on coefficients
- Standard CPD model:

$$\ln P_{ic} = \sum_{i=1}^{I} \pi_{i} D_{i} + \sum_{c=1}^{C} \eta_{c} D_{c} + \varepsilon_{ic}$$

Where:  $InP_{ic}$  = natural logarithm of price item i in country c  $D_i$  = dummy variable for item I, where i=1...I  $D_c$  = dummy variable for country c, where c =1...C

## CPD method (cont.)

- We estimate CPD models for two item categories:
  - butter and toilet paper
- □ Weights included in our model
  - observations weighted by expenditure share
- Sample size varies across time so new items allowed to enter sample
- □ Aggregation methods:
  - monthly time aggregation
  - item aggregation over stores; and NO item aggregation over stores

#### CPD and GEKS: Toilet paper



#### **CPD and GEKS: Butter**



#### **Results CPD and GEKS**

- Results very similar for GEKS and CPD methods
- CPD appears to be a good alternative to GEKS if standard errors are required

## Conclusions

- Weekly aggregation not appropriate when scanner data is used
- GEKS method can provide us with drift free estimate of price change
  - Possible benchmark estimate of price change
- Initial results suggest quarterly or monthly time aggregation may be appropriate
- GEKS results suggest possible bias in official CPI figures may not be negligable