

# Cartel Dating

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joint work with Peter Boswijk and Maurice Bun

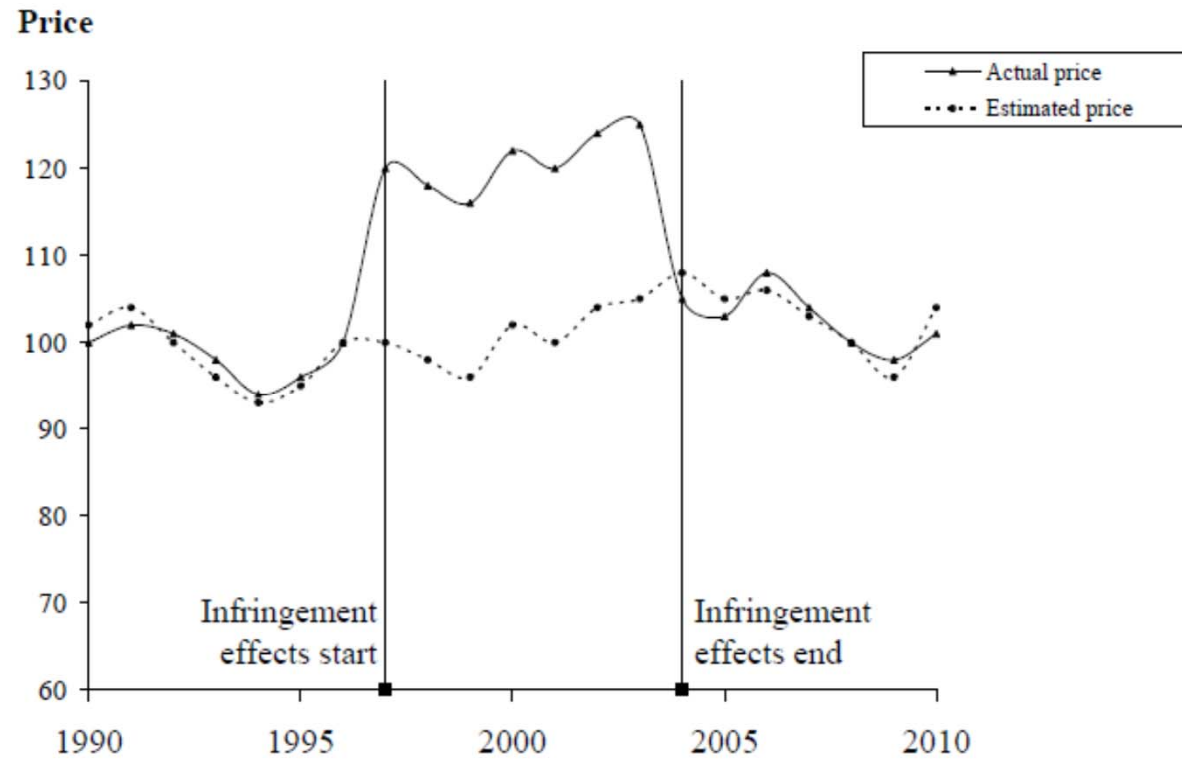
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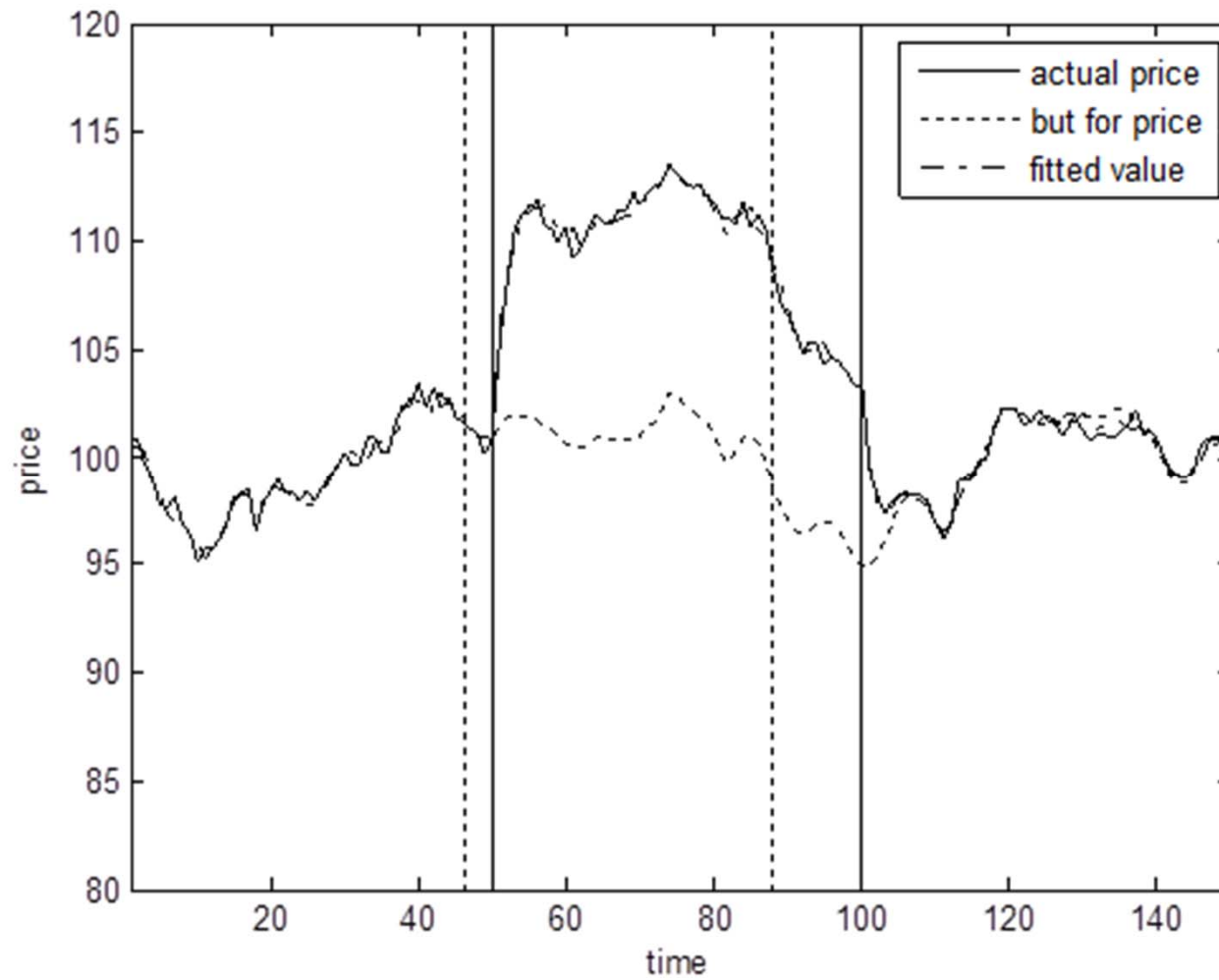


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Source: Practical Guide *Quantifying Harm* (2013)





$$y_t = \alpha_1 + \alpha_2 d_t + \gamma_1 y_{t-1} + \gamma_2 y_{t-2} + \beta' x_t + u_t$$

$$bfp_t = \hat{\alpha}_1 + \hat{\gamma}_1 bfp_{t-1} + \hat{\gamma}_2 bfp_{t-2} + \hat{\beta}' x_t$$



## Formal versus Effective Dates

- Begin and end dates, intermittent price wars – fines, damages
- European Commission dates cartels to the day – evidence, negotiated:
  - “... *at least* from dd-mm-yyyy and until *at least* dd-mm-yyyy,”
  - “Single and continuous cartel infringement”
- In practice, dates are ambiguous: gradual entry and exit, delay in taking effect, post-cartel effects – ignorant buyers, long-term contracts, capacity build up, sophisticated former cartel members
- Formal and effective cartel dates need not coincide
- “Econometric analysis of observed data can be a way to identify when the infringement’s effects started or ceased.” Practical Guide *Quantifying Harm* (2013), recital 43



## Wrong Dates Lead to an Underestimation of Harm

- Exogenous break dates introduce a specification error, that leads to attenuation bias – Aigner (1973)
- Using the formal cartel dates biases the dummy coefficient(s) downwards, irrespective of the direction of the misspecification
- Cartel dating materially affects estimation of the harm:
  - Length of the period(s)
  - Size of the overcharges – lower but-for prices



## Simplest Model with Unit Price, No Controls and Two Breaks

$$y_t = \alpha_1 + \alpha_2 d_t + u_t,$$

$$d_t = 0, \quad t \leq T_E,$$

$$d_t = 1, \quad T_E < t \leq T_F,$$

$$d_t = 0, \quad t > T_F,$$

OLS:  $\hat{\alpha}_2 = \frac{s_{dy}}{s_d^2},$

$$\hat{\alpha}_1 = \bar{y} - \hat{\alpha}_2 \bar{d},$$

What if:  $T_E \neq T_B$  and/or  $T_F \neq T_C$



**Proposition 6:** *Let  $T_E \neq T_B$  and/or  $T_F \neq T_C$ . Then the expected values of the OLS estimators of model (3.1) are such that:*

$$E[\hat{\alpha}_2] < \alpha_2, \quad \forall T_B, T_C, T_E, T_F,$$

$$E[\hat{\alpha}_1] = \alpha_1, \quad T_E < T_B, T_F > T_C,$$

$$E[\hat{\alpha}_1] > \alpha_1, \quad \text{otherwise.}$$

**Proof:** see the Appendix. ■





$$CD = \sum_{t=T_B+1}^{T_C} Q_t \alpha_2,$$

$$\widehat{CD} = \sum_{t=T_E+1}^{T_F} Q_t (y_t - \hat{\alpha}_1)$$

**Proposition 7:** *Let  $T_E \neq T_B$  and/or  $T_F \neq T_C$ . Assume that quantities sold  $Q_1, \dots, Q_T$  are not affected by the cartel. Then the expected value of the estimated damage is such that:*

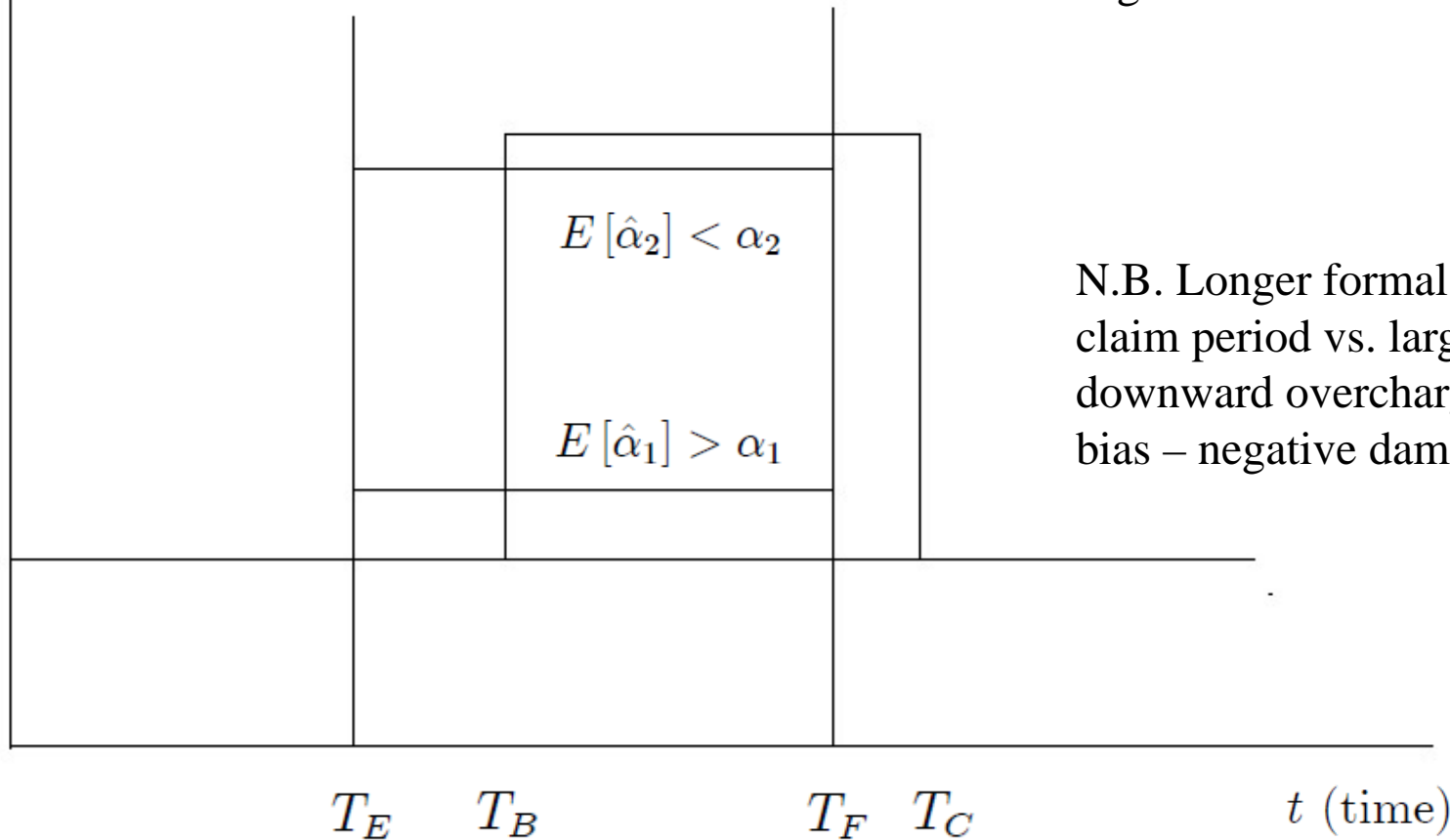
$$E[\widehat{CD}] = E[CD], \quad T_E < T_B, T_F > T_C,$$

$$E[\widehat{CD}] < E[CD], \quad \text{otherwise.}$$

**Proof:** see the Appendix. ■



$y_t$  (price)



$$\hat{\alpha}_1 = \bar{y}_{nc},$$

$$\hat{\alpha}_2 = \bar{y}_c - \bar{y}_{nc},$$

using formal dates

N.B. Longer formal claim period vs. larger downward overcharge bias – negative damages



## Econometric Methods for determining Cartel Break Dates

- Chow (1960) for known dates, Quandt (1960) for unknown dates – Harrington (2008)
- Quandt-Andrews (1994) finds single break. Bai and Perron (1998, 2003) finds multiple breaks, including the number of breaks
- Relies on dummy-variables approach – disputed: White et al. (2006), Marshall and Marx (2012), McCrary and Rubinfeld (2014)
- Alternative: hold out data from cartel period – often inferior



## Bai-Perron for Cartel Dates

- Divide sample period in  $m+1$  intervals for OLSs

$$y_t = z_t' \delta_j + u_t, \quad t = T_{j-1} + 1, \dots, T_j,$$

$$S_T(T_1, \dots, T_m) = \sum_{i=1}^{m+1} \sum_{t=T_{i-1}+1}^{T_i} (y_t - z_t' \delta_j)^2$$

$$\left( \hat{T}_1, \dots, \hat{T}_m \right) = \operatorname{argmin}_{T_1, \dots, T_m} S_T(T_1, \dots, T_m)$$

- Sup F-test: the maximum of all possible F-tests
- Sequential: test  $m$  breaks against  $m+1$  breaks
- Null hypothesis of  $m$  breaks is rejected if minimum value decreases
- Extra information: breaking parameters, trimming  $h$ , cartel is on/off,  $m$  even



## Underestimation with Controls

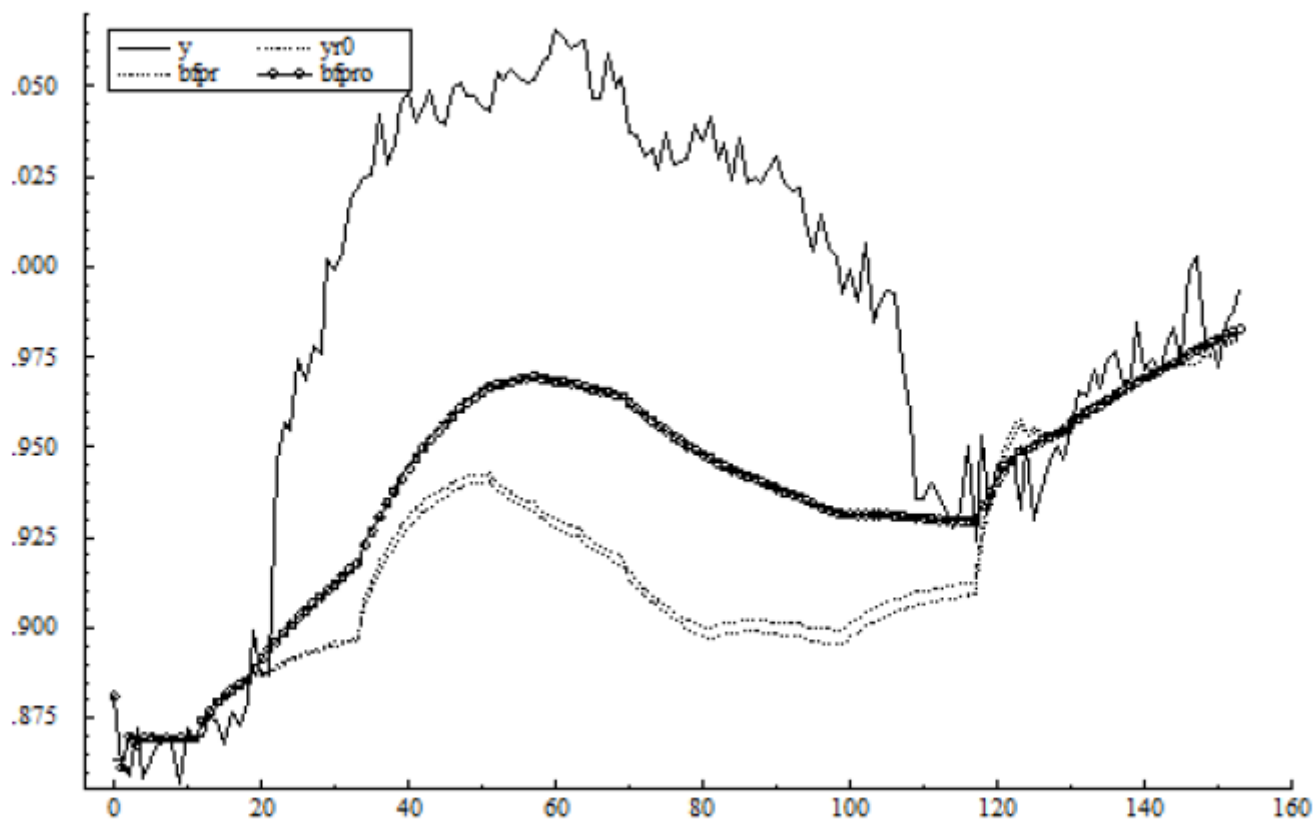
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- Results remain for stationary AR(1) processes
- Always underestimation for trend-stationary processes
- Monte Carlo experiment based on actual case: 27% higher but-for price



Figure 4: simulated and estimated but-for prices



Note:  $y$  is original price and  $yr0$  is simulated but-for price;  $bfpr$  and  $bfpro$  are estimated but-for prices using effective and official car respectively; based on 10,000 Monte Carlo replications.



## Concluding Remarks

- Cartel dating essential to do – or (weak) underestimation of harm
  - Suitable standard methods are available – *A Primer in Cartel Dating*
  - Main D-v concern is the but-for simulation when explanatory variables are tainted
  - Econometrics should be fitting to the cartel story
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- Commission's wording "at least" is better, but not good enough
  - Practical Guide leaves plenty of room for further developments
  - "Lingering effect" – acknowledged German Federal Court of Justice

