



# VALUE OF SHORT-RUN DEMAND RESPONSE FOR INTEGRATING WIND: UNIT COMMITMENT & GENERATION EXPANSION MODELING WITH PRICE RESPONSIVE LOAD

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Thanks to Electricity Policy Research Group of Cambridge University and NSF



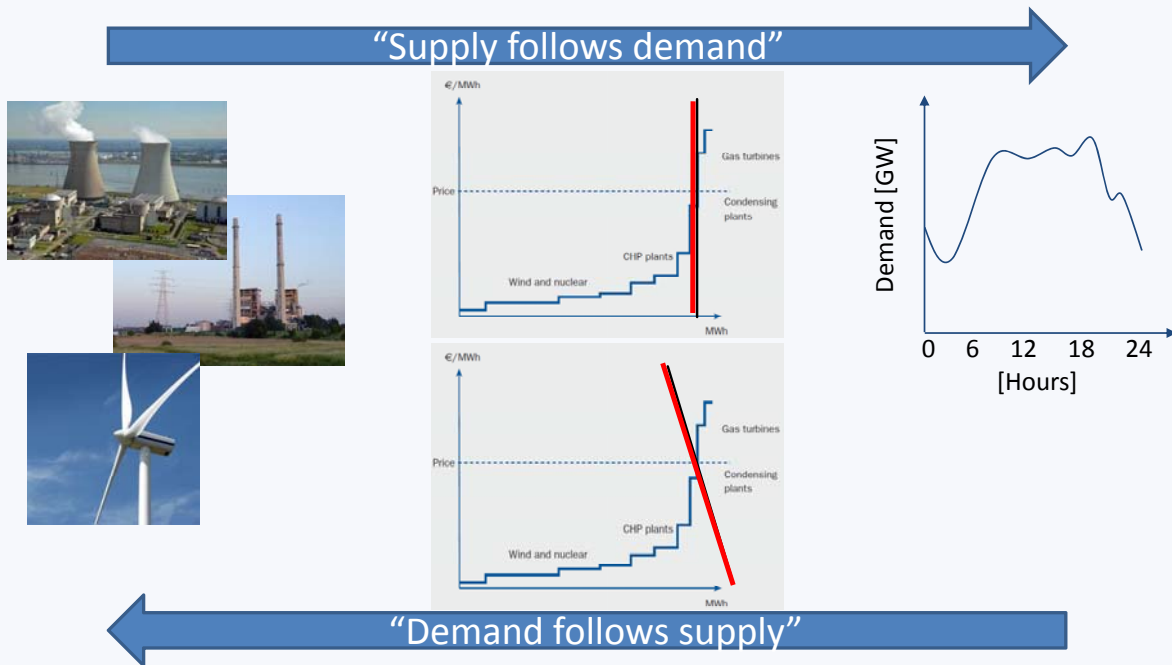
## Overview

- *Problem:* Lack of demand response in operations & planning models
- Representing price responsive consumers
- *Operations:* Unit commitment
  - Effect of DR on dispatch
  - Effect of wind ‘must take’ requirements
    - » Neither economically nor environmentally desirable
- *Investment:* Capacity expansion
  - Effect of DR on optimal wind investment
  - Effect of X-price elasticity



# General context

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## What is the problem?

*Unit commitment & generation investment models assume **fixed short-run loads***

*They neglect opportunities for:*

- *improved dispatch & investment*
- *renewables integration*



## What do we need?

*Models accounting for price responsive consumers*

*We quantify:*

- *changes in decisions*
- *efficiency benefits*

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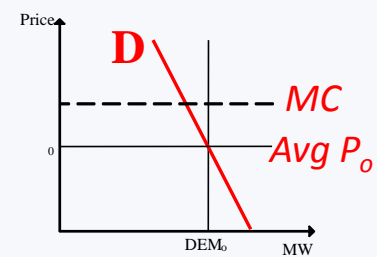
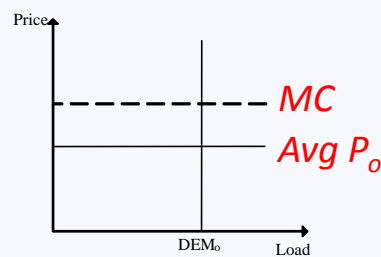
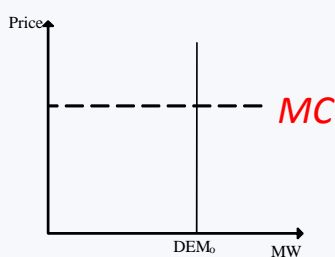


## Representing behavior of price responsive consumers

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Constructing an elastic short-term demand curve:

1. Solve cost minimizing model, given initial demand levels  $DEM_0$
2. Obtain weighted average electricity price  $P_0$
3. Add own-price elasticity to  $(P_0, DEM_0)$ 
  - Direct response
4. Add X-price elasticity
  - Load shifting



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# Demand functions in optimization models

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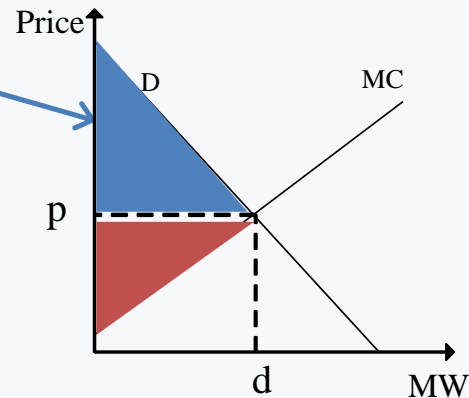
If we have symmetry in X-effects:

Welfare maximization model

**Objective:** MAX welfare

= **consumer** + **producer** surplus  
= demand curve integral - cost

**Subject to:** system power balance  
operational constraints  
(installed reserve margin)



Three computational methods tested

1. Quadratic program (Samuelson, 1952)
  - Symmetry required of X-elasticity effects
2. Complementarity (Cottle, Pang, Stone, 1992)
  - Doesn't require symmetry
  - Cannot readily handle binary variables
3. PIES iterative piecewise linearization (Hogan, 1975)
  - Can handle asymmetry & binary variables

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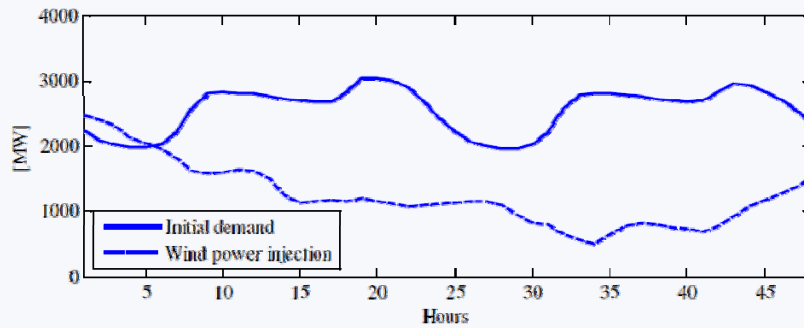
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# Unit commitment model for wind dominated system

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Min Cost = Cost of fuel + emissions + startups + wind curtailment

Or Max Welfare = Demand curve integral – Cost (own elasticity only)

s.t. System power balance

Ramping constraints

Capacity restrictions

Minimum run levels

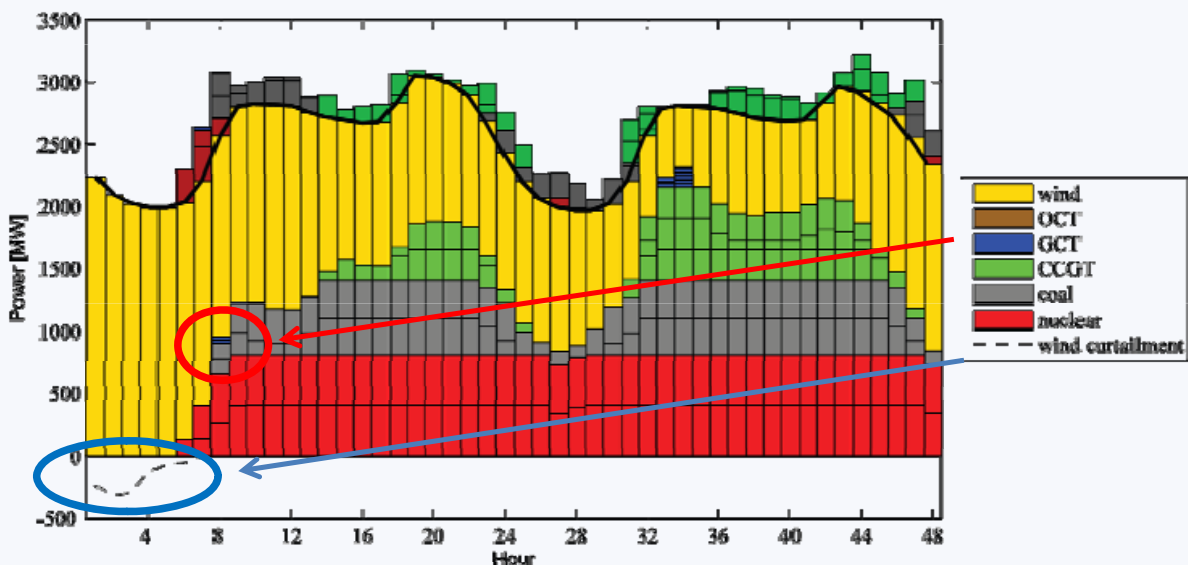
Start-up

Minimum on- and down-time



# Unit commitment results: Uniform price, fixed demand

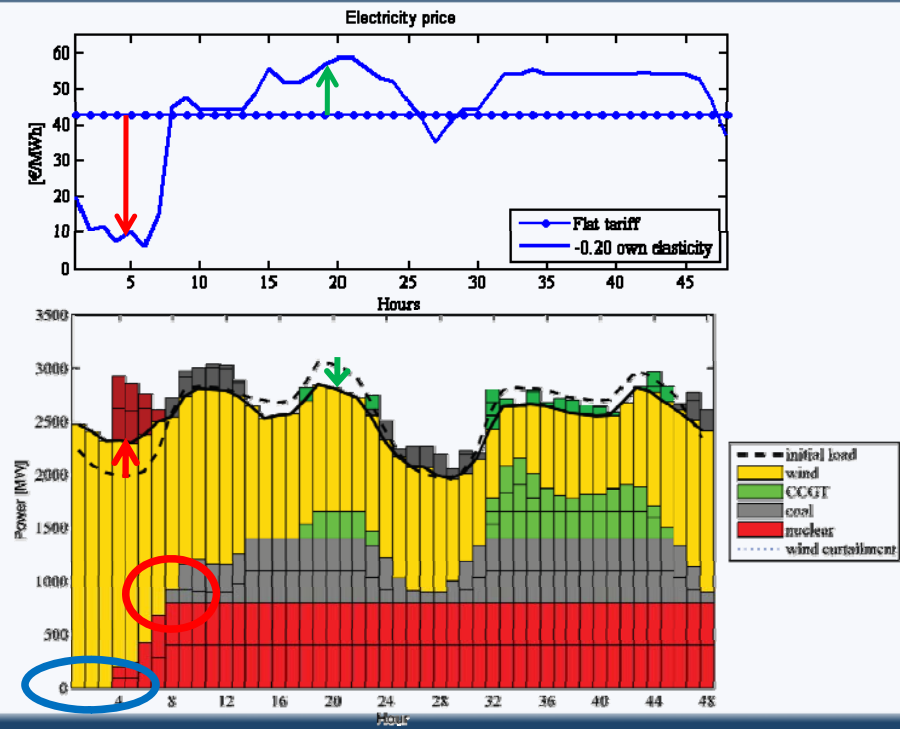
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# Unit commitment results: Demand response (own elasticity = -0.2)

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# Net effect of demand response @ $\epsilon=-0.2$

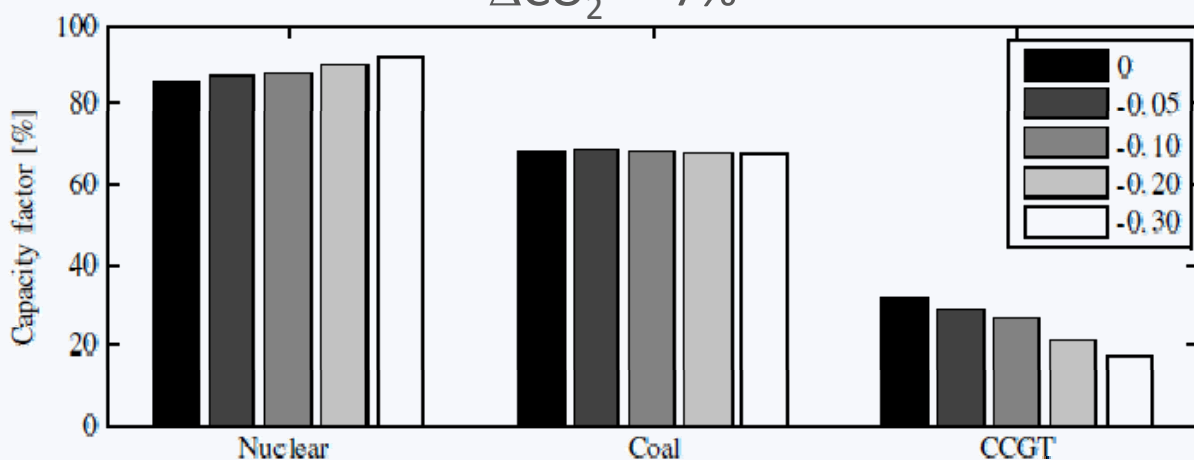
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$\Delta$ Cost = -14% (more if forecasts uncertain)

$\Delta$ Welfare = +1.4% (as fraction of cost)

$\Delta$ Wind spill = -100%

$\Delta$ CO<sub>2</sub> = -7%



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## Giving wind absolute priority makes neither economic nor environmental sense

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- EU 'must take' rules; -\$150 bids (or lower) likely in US CAISO
  - Can increase *both* costs and emissions
- Minimizing wind spill increases fuel costs & CO<sub>2</sub> (relative to dispatch under 0€/MWh wind bid)
  - 17% reduction in spill possible
  - Per MWh of spill reduction:
    - 0.71 ton CO<sub>2</sub> increase (+1.5% total CO<sub>2</sub>)
    - 49 € cost increase (+1.3% total cost)
- Assumes:
  - No demand elasticity
  - Fuel dominates startup costs

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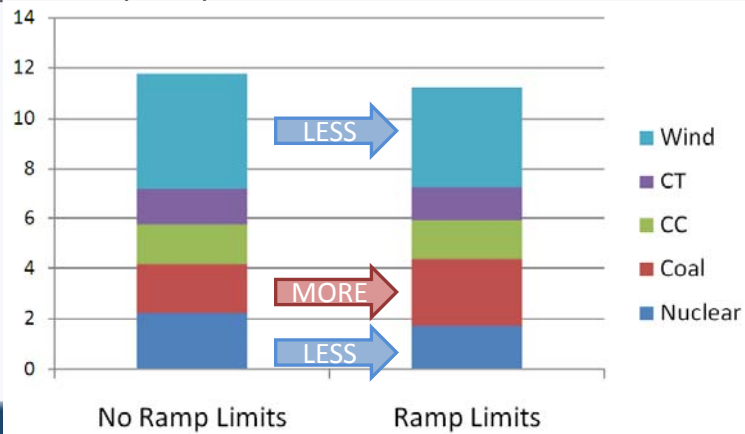
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# Generation capacity expansion

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- Key tradeoffs:
  - More wind penetration requires more ramp capability
  - Baseload capacity less rampable
  - Demand response could provide
- Gen expansion models: often lack ramp and demand-response
  - Need these features to optimally integrate renewables
  - Effect of adding ramp limits upon optimal mix:



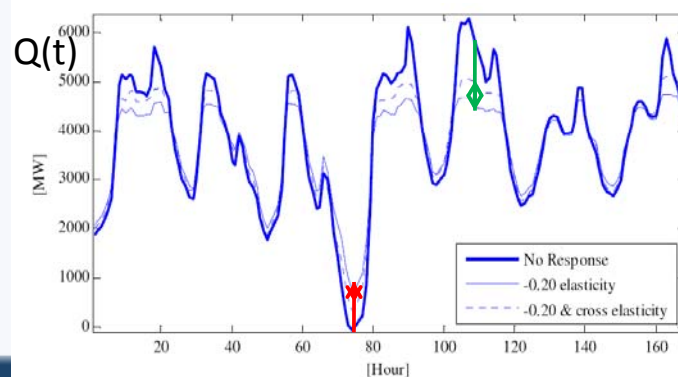
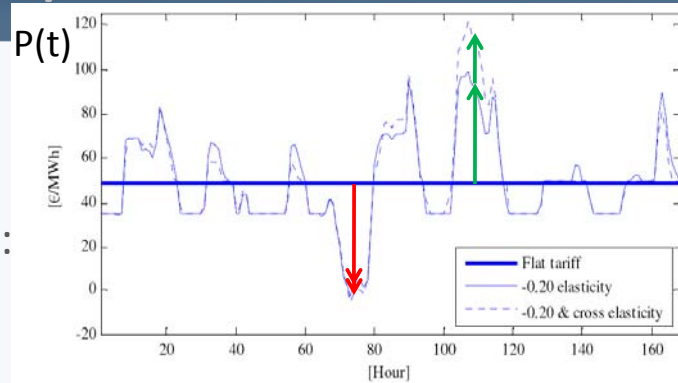
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# P & Q effects of own- and X-price elasticities

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- Valley fill & peak reduction effects
- X-price elasticities yield:
  - less load response
  - more price volatility



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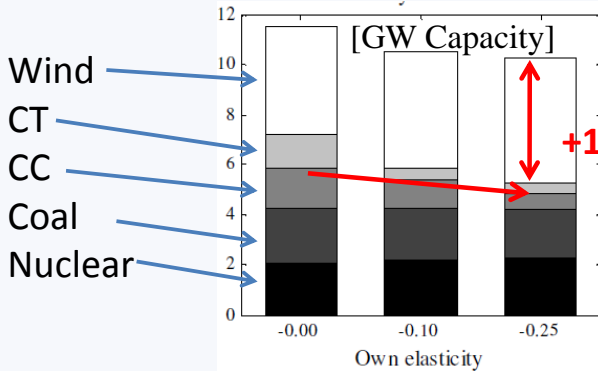
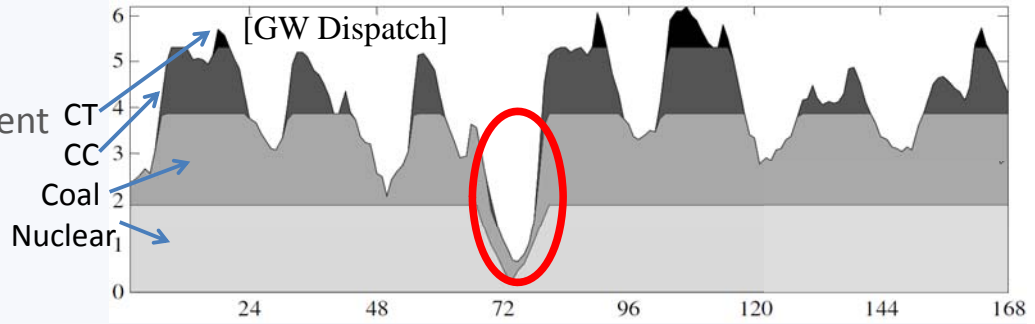




# Demand response in investment planning

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Example Dispatch & Investment Mix



Effect of elasticity on gen mix

- Less cycling capacity
- More wind

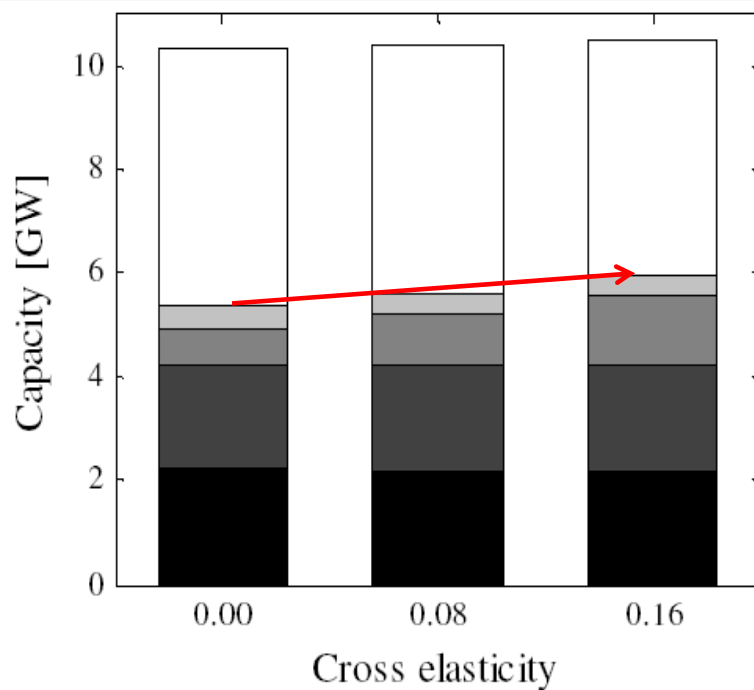
Welfare improvements:

- +1%/3% for  $\epsilon = -0.1/-0.25$
- Expressed as % of supply cost



# Effect of X-elasticity upon investment mix

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## Conclusion

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- Models should account for responsive consumers
  - Ideally: both own- and X-elasticities
  - Welfare max or equilibrium calculation rather than cost minimization
- Short-term response yields
  - Reduced gen investment + operation costs
  - Enhanced value for variable wind power
- Future work:
  - Account for both long- and short-run elasticity
  - Account for uncertain forecasts, lags between commitments and outcomes



## Bibliography

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- For more information:
  - C. De Jonghe, B.F. Hobbs, and R. Belmans, "Optimal Generation Mix with Short-term Demand Response and Wind Penetration," *IEEE Transactions on Power Systems*, accepted.
  - \_\_\_\_\_, "Value of Demand Response for Wind Integration in Daily Power Generation Scheduling: Unit Commitment Modeling with Price Responsive Load," *IAEE North American Meeting*, Washington DC, Oct. 2011
- Cited literature:
  - R.W. Cottle, J. S. Pang, R. E. Stone. 1992. *The Linear Complementarity Problem*, Academic Press, Cambridge, MA.
  - W.W. Hogan, "Energy policy models for Project Independence," *Computers & Operations Research*, vol. 2, Dec. 1975, pp. 251-271.
  - P.A. Samuelson, "Spatial Price Equilibrium and Linear Programming," *The American Economic Review*, vol. 42, 1952, pp. 283-303.