

# Modeling Technological Change in Energy Production and Use

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National Academy of Science  
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U.S. Energy Information Administration  
Independent Statistics and Analysis

# Overview

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- Key concepts in technological change
  - how economists define technological change
  - technology supply and demand
  - the innovation system
- Representing technological change in energy-economic models
  - examples from EIA's National Energy Modeling System (NEMS)
- Key drivers of technological change in energy modeling
  - examples from EIA-NEMS analysis
- Summary of modeling challenges

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# **Key concepts in the process of technological change**

# How do economists define technological change?

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- Technological change is the process by which the economy changes over time, in terms of the products produced and the processes used for production, so that a technological advance...
  - enables the production of greater or higher-quality outputs from a given amount of inputs as time proceeds
- Energy is an essential input into
  - intermediate production of goods and services
  - final consumption of household services (e.g., lighting, heating, personal mobility)
- Energy produces both desirable and undesirable outputs (e.g., pollution)

# Technology supply and demand

“Supply-push” policies

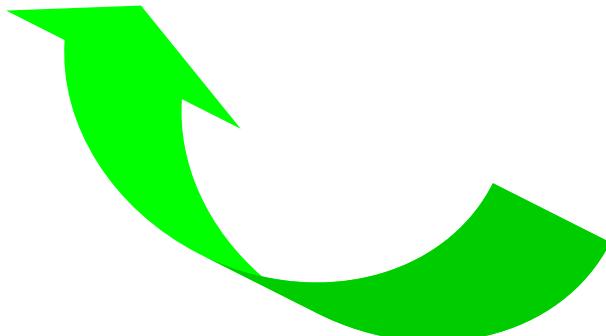


## Supply of innovations

- State of knowledge
- RD&D
- Learning-by-doing



Private and social value



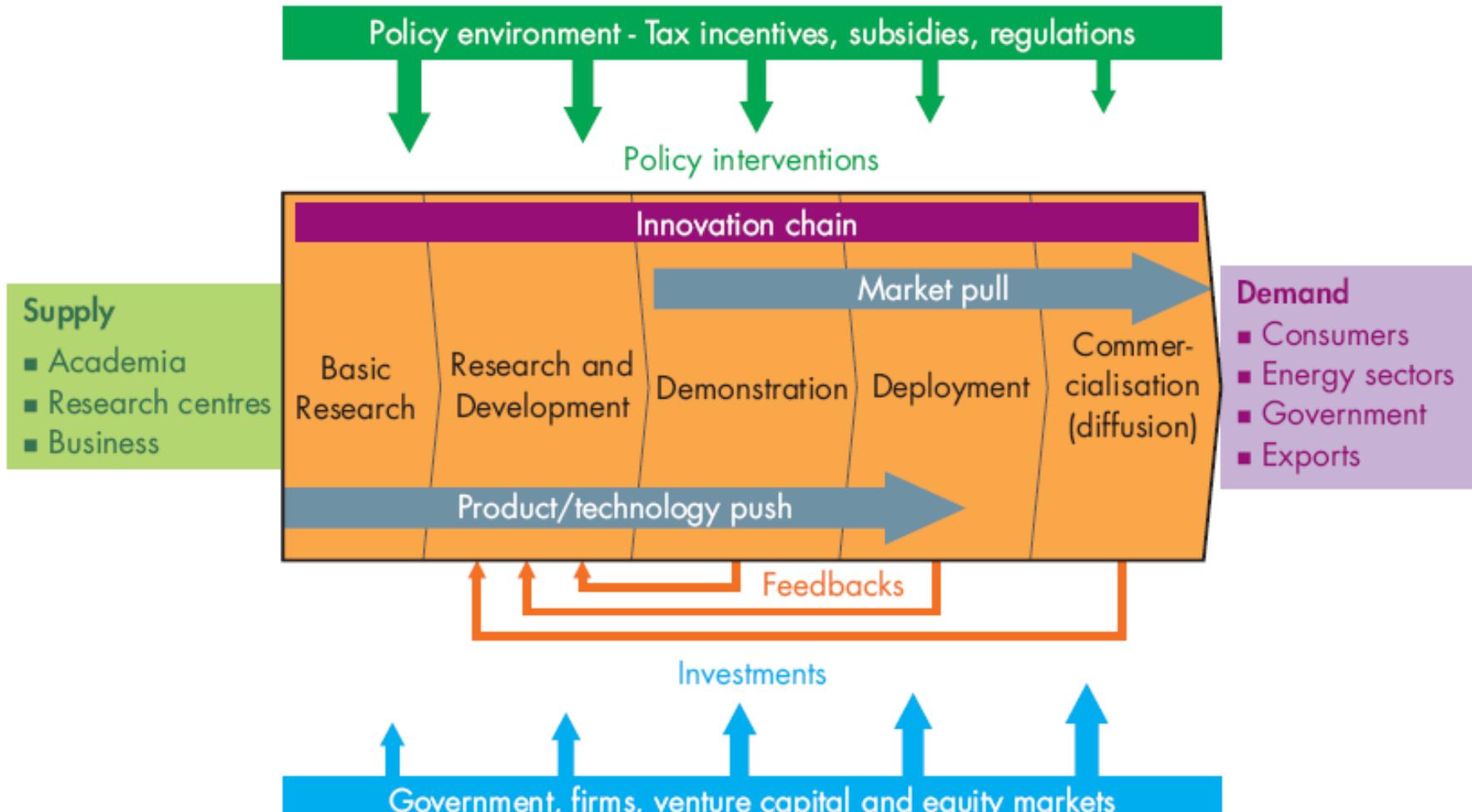
## Demand for technology

- Capital cost
- Operating cost
- Product qualities

“Demand-pull” policies



# Schematic of the innovation system



**Framework conditions:** macro economic stability, education and skills development, innovative business climate, IP protection etc.

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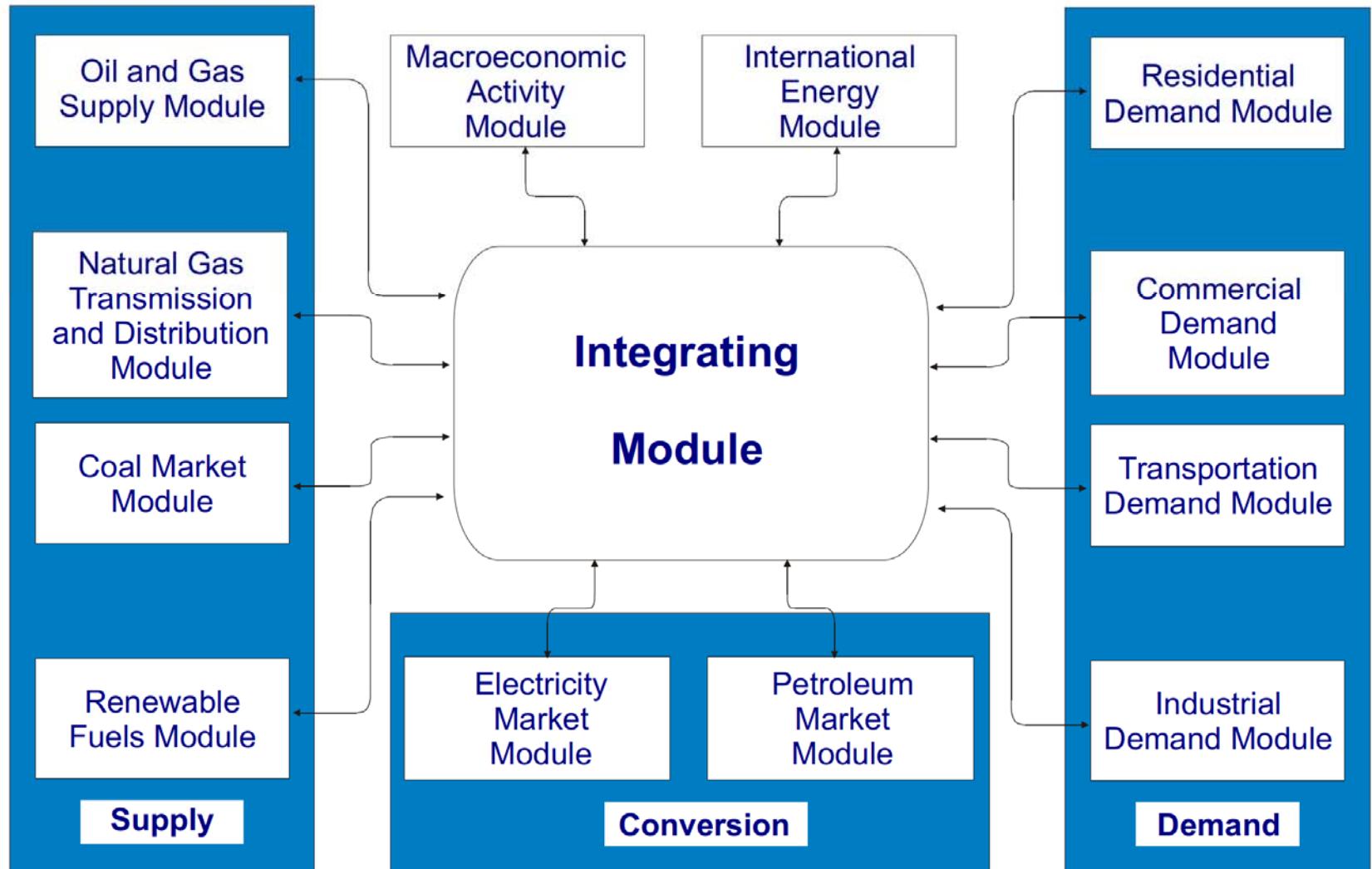
# **Representing technological change in energy-economic models**

# Technology change is modeled in many ways

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- Exogenous (function of time)
  - time profile of specified cost and performance characteristics for specific technologies
  - time trend in efficiency and/or cost improvements
- Endogenous (function of variables that respond to markets/policies)
  - learning-by-doing (costs fall with cumulative production)
  - price-induced (technologies can be accelerated by higher prices)
  - R&D-driven (R&D drives cost and performance improvements)
- Treatment of technological change depends in part on the overall structure of the model
  - highly aggregate models vs. those with rich technological detail

# National Energy Model System (NEMS)



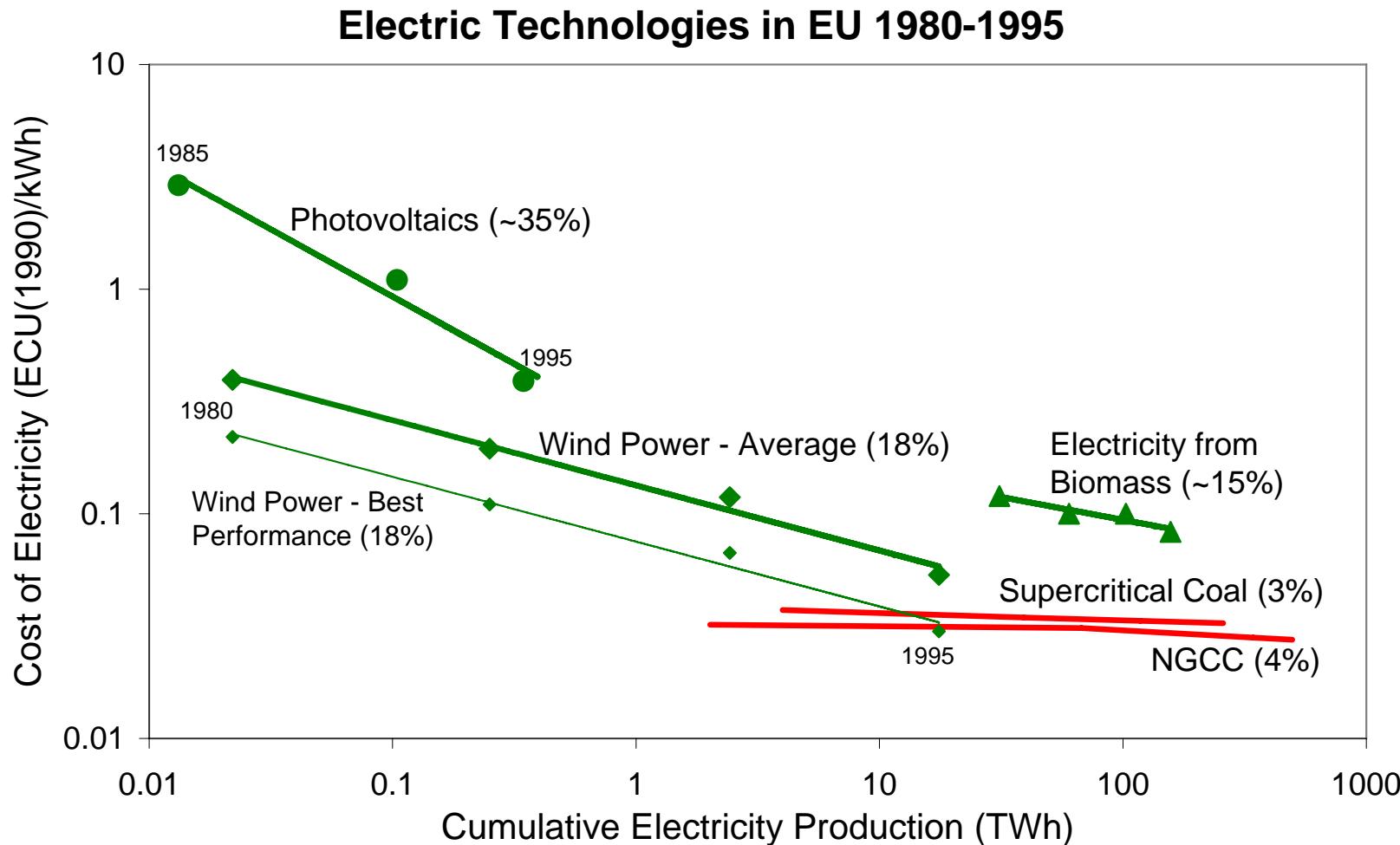
# Technology representation in NEMS

- Explicit technology representations (efficiencies, capital, and O&M costs, capacity factors, date commercial)
  - residential and commercial
  - transportation
  - electricity generation
  - natural gas transmission and distribution
  - refineries
- Indirect technology representation (time trend changes)
  - oil, gas and coal supply
  - industrial sector demand - except for new cogen & motors

# NEMS learning curves for electricity capacity expansion

- Literature largely uses simple curve
  - Overnight Cost (C) = a function of cumulative capacity (Q):  
$$C(Q) = a * Q^{-b}$$
- Progress Ratio (pr): defines speed of learning
  - $f$  = % cost decline with doubling of cumulative capacity
  - $pr = 2^{-b} = (1 - f)$
- Issues
  - revealed values are largely prices, not costs, so other missing factors can create potential bias in estimated relationships
  - confounding factors such as economies of scale, contemporaneous R&D, changes in market structure
  - greatest price / cost distortions occur during early commercialization

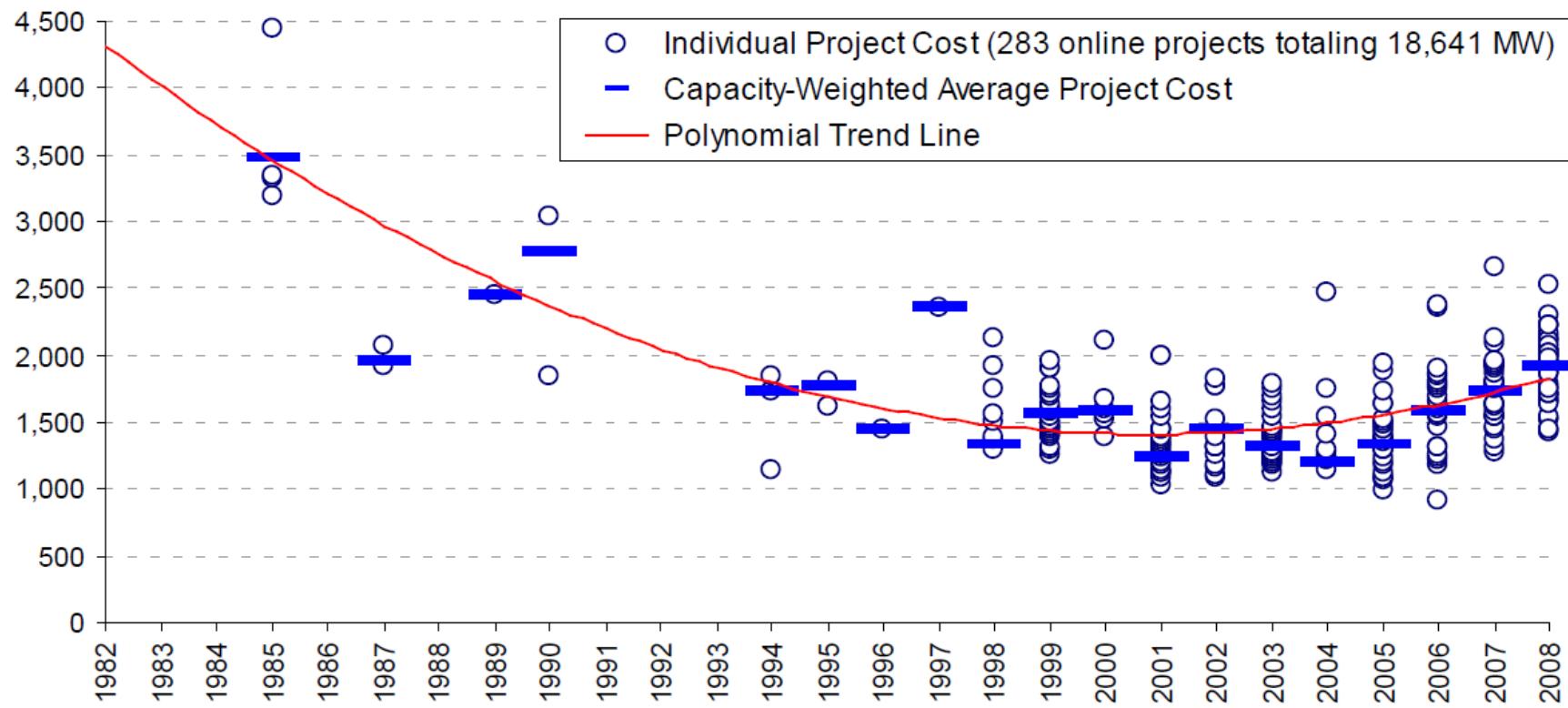
# New emerging technologies typically have larger learning rates than more mature technologies



Source: Experience Curves for Energy Technology Policy, IEA/OECD 2000

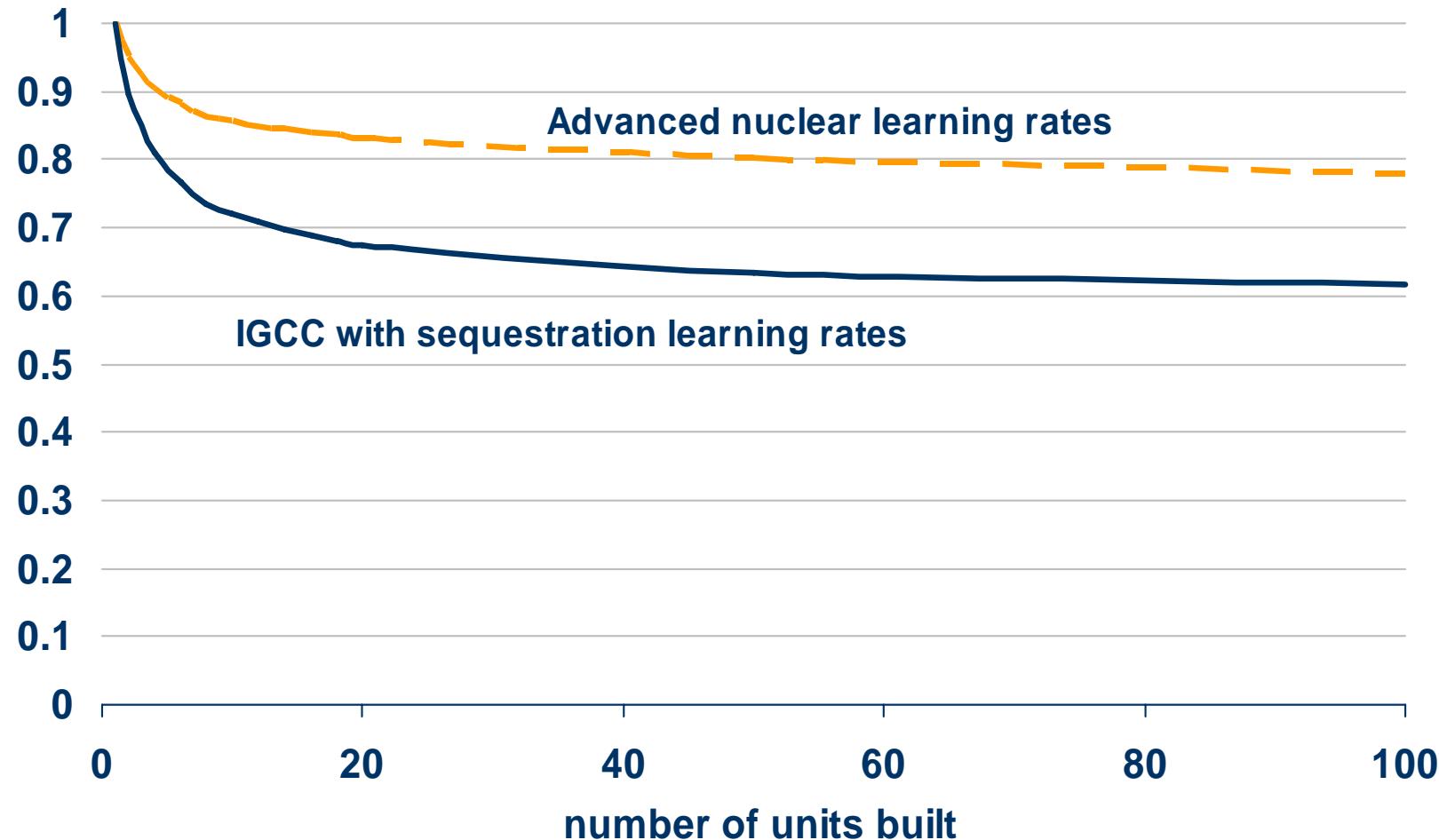
# Installed wind project costs have increased during past 10 years for reasons beyond technology learning

Installed project cost (2008 \$/kW)

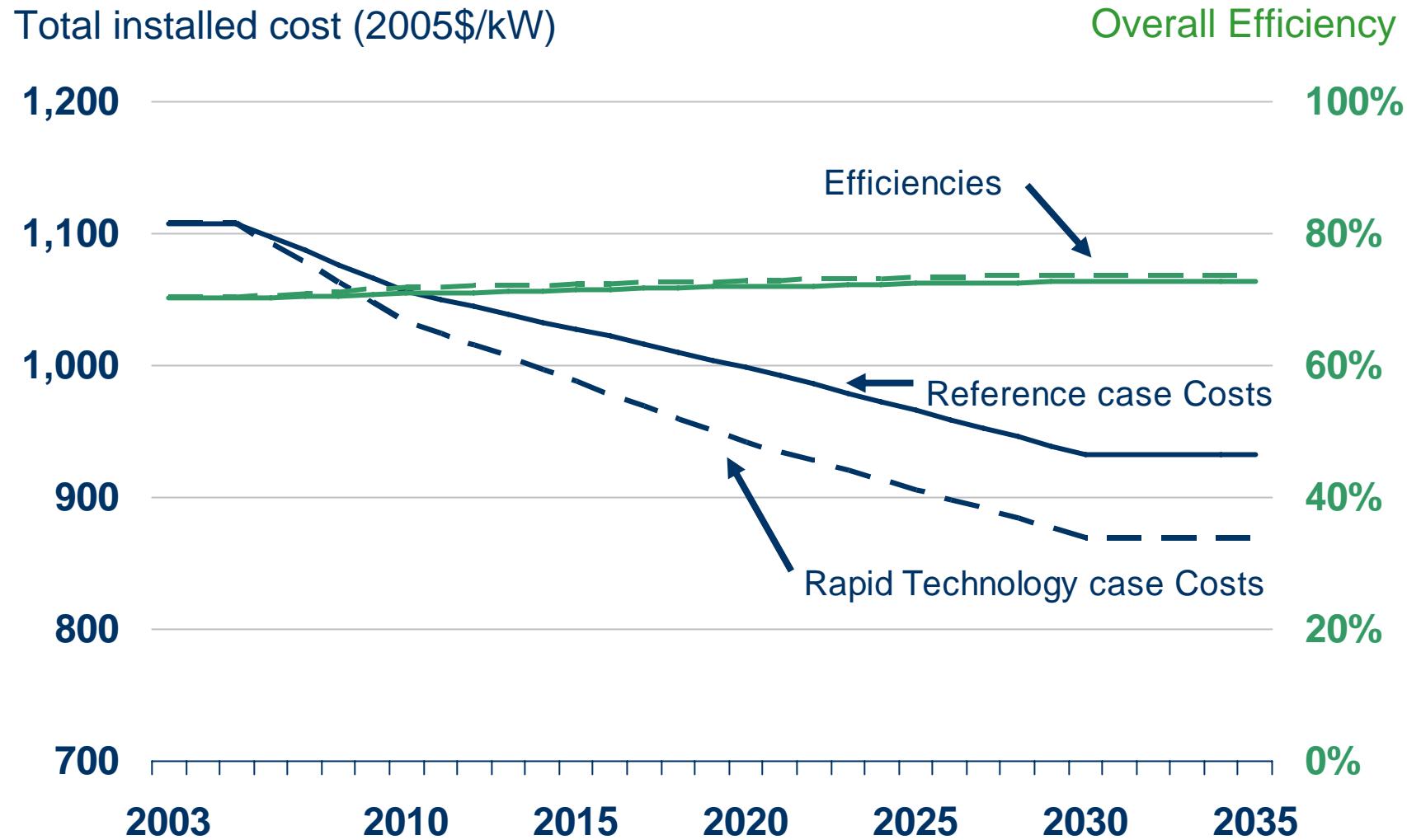


# Sample learning curves from NEMS

learning factor



# Combined heat and power costs decline, while additional efficiency gains are small



J3

talk with Elizabeth about what is driving costs for CHP down.

JS5, 5/3/2010

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## **Key drivers of technological change in energy modeling**

# Key drivers for energy technology change

- Market drivers
  - energy prices
  - technology costs
  - consumer and investor behavior
  - demand for energy services
- Government standards
  - fuel economy, appliance efficiency, and building standards
  - renewable fuel standards, renewable electricity portfolio standards
- Government financial incentives
  - production tax credits and investment tax credits
  - loan guarantees
- Emissions policies
  - cap-and-trade or emission fee policies
- Research and development effort by public and private sectors

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## Market drivers

# Success in the Barnett prompted companies to look at other shale formations in the U.S.

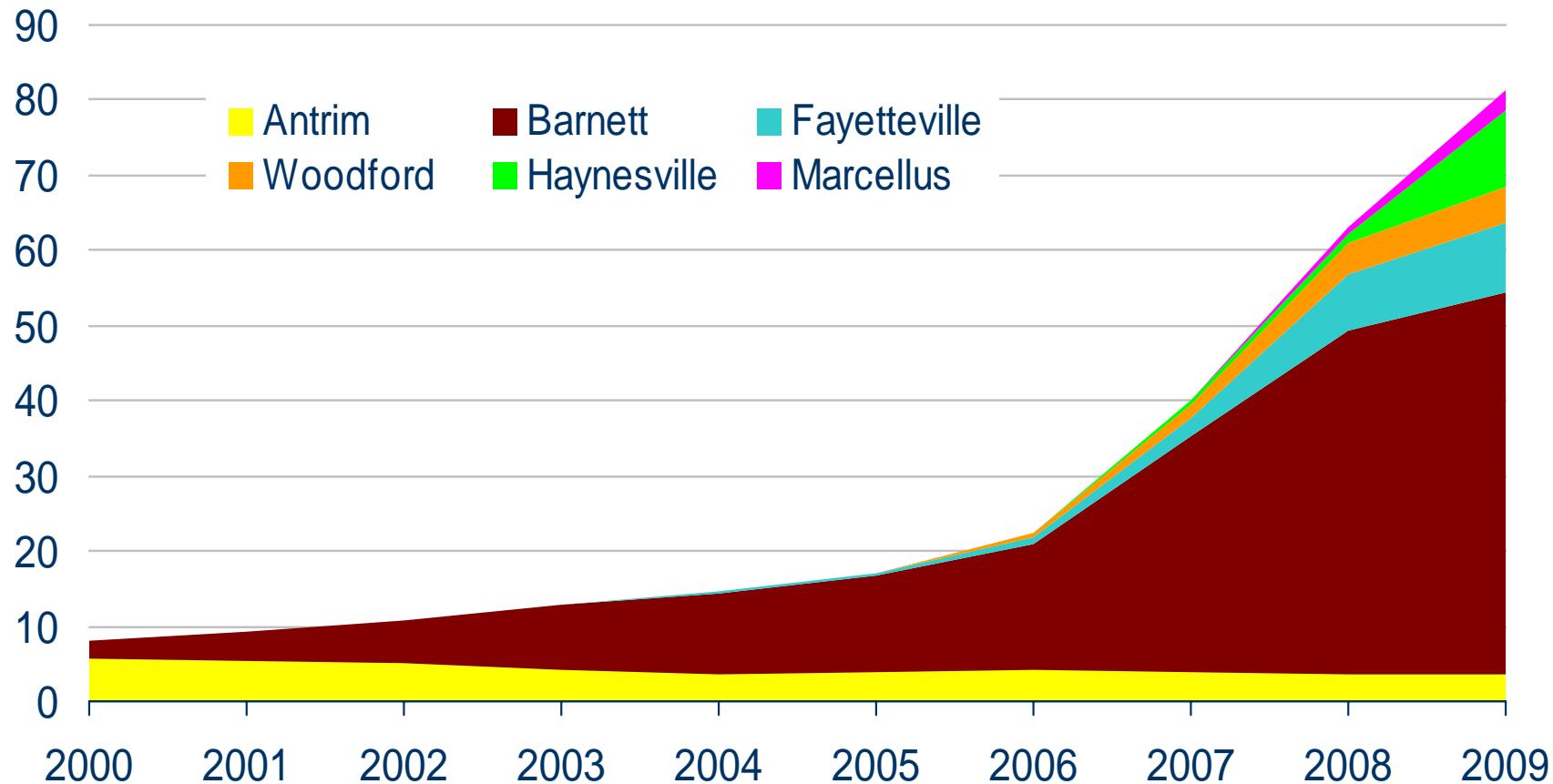
## U.S. shale gas plays



Source: Energy Information Administration based on data from various published studies  
Updated: May 28, 2009

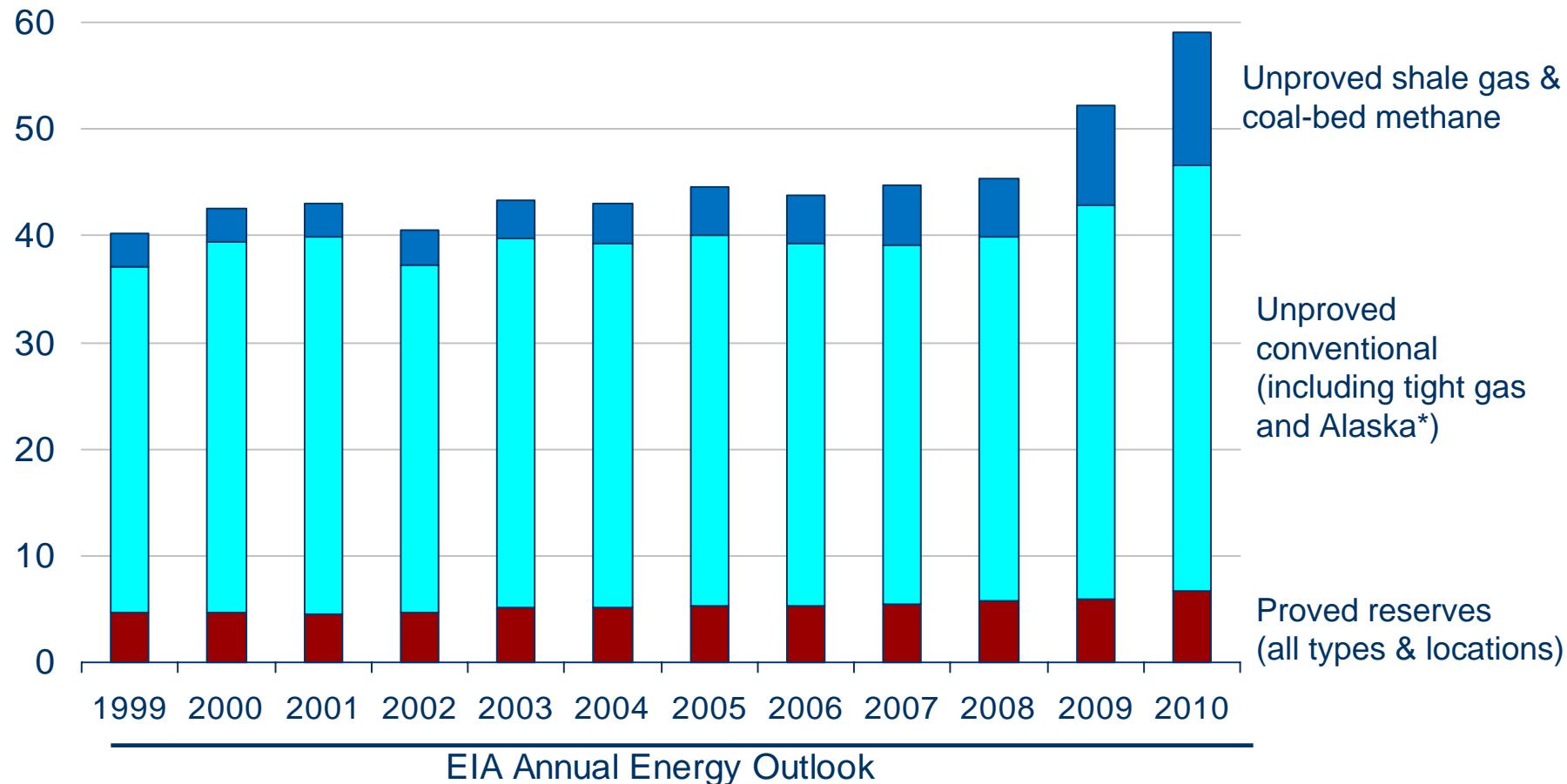
# Over the last decade, U.S. shale gas production has increased 8-fold

shale gas production  
billion cubic meters



# Shale gas has been the primary source of recent growth in U.S. technically recoverable natural gas resources

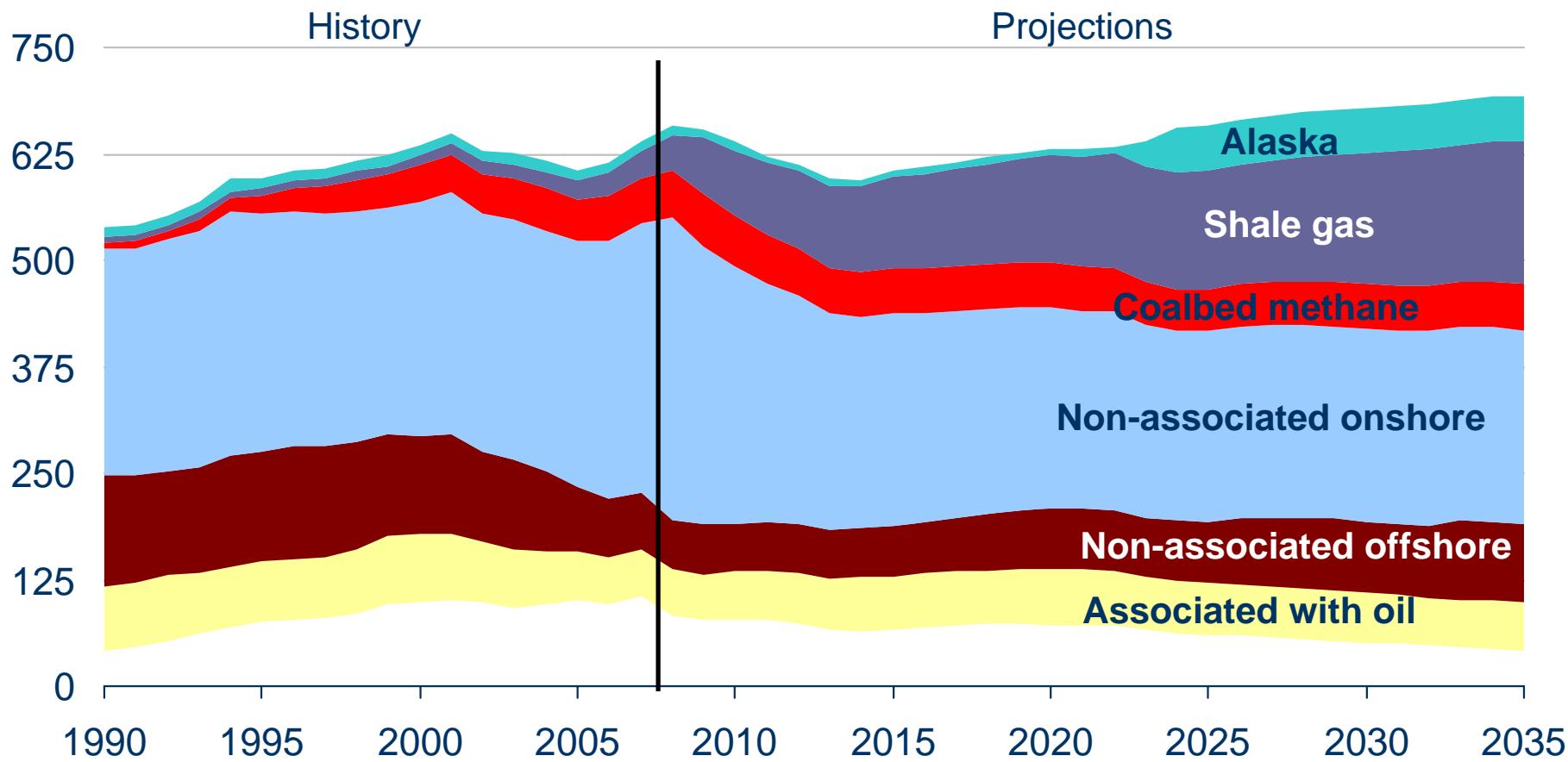
technically recoverable gas resources  
trillion cubic meters



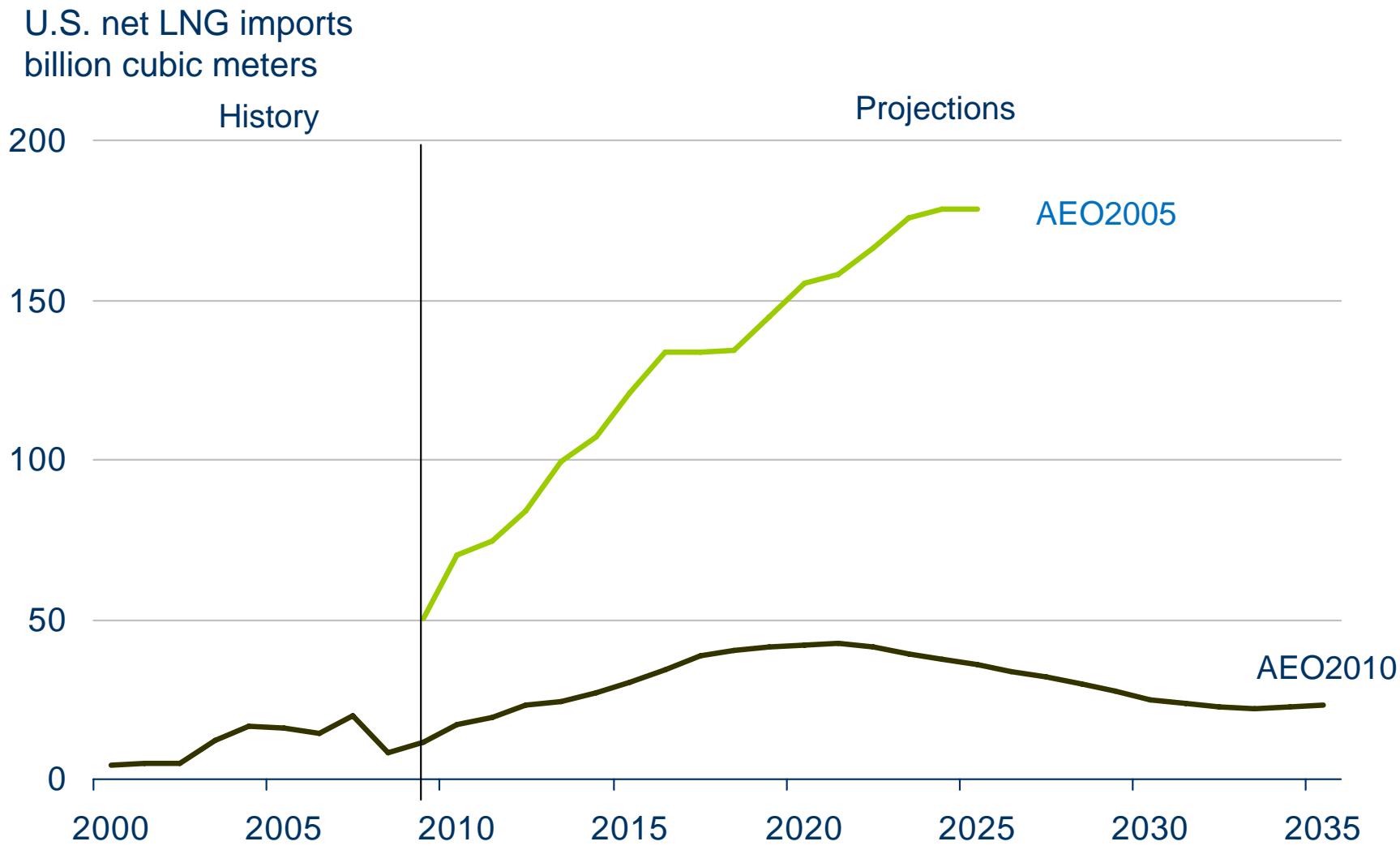
\* Alaska resource estimates prior to AEO2009 reflect North Slope resources not included in previously published documentation.

# EIA expects shale gas and Alaska production increases to more than offset declines in other supplies

U.S. gas production  
billion cubic meters



# Over the past 5 years, EIA has significantly lowered its projection of LNG imports into the U.S.

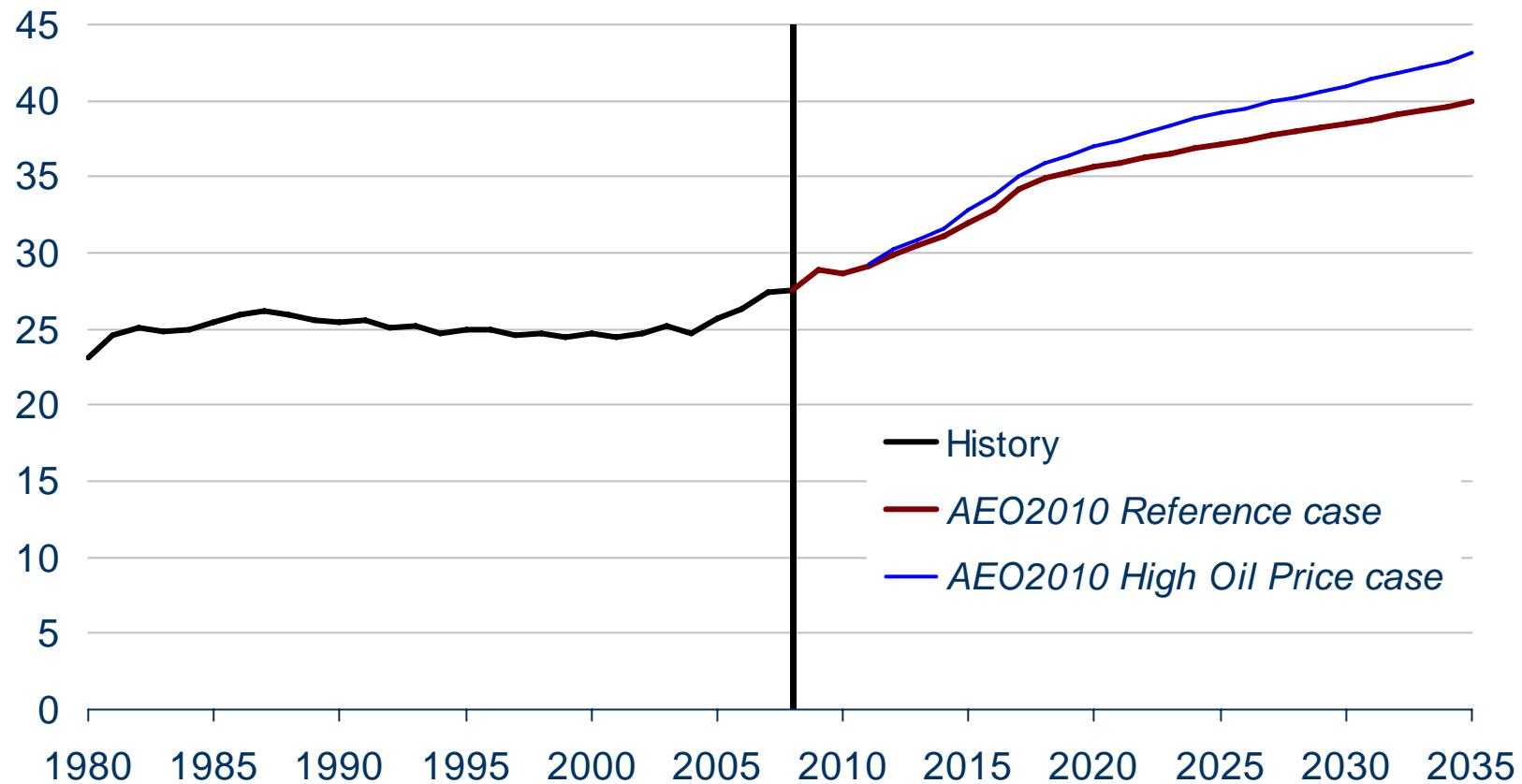


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# Government standards

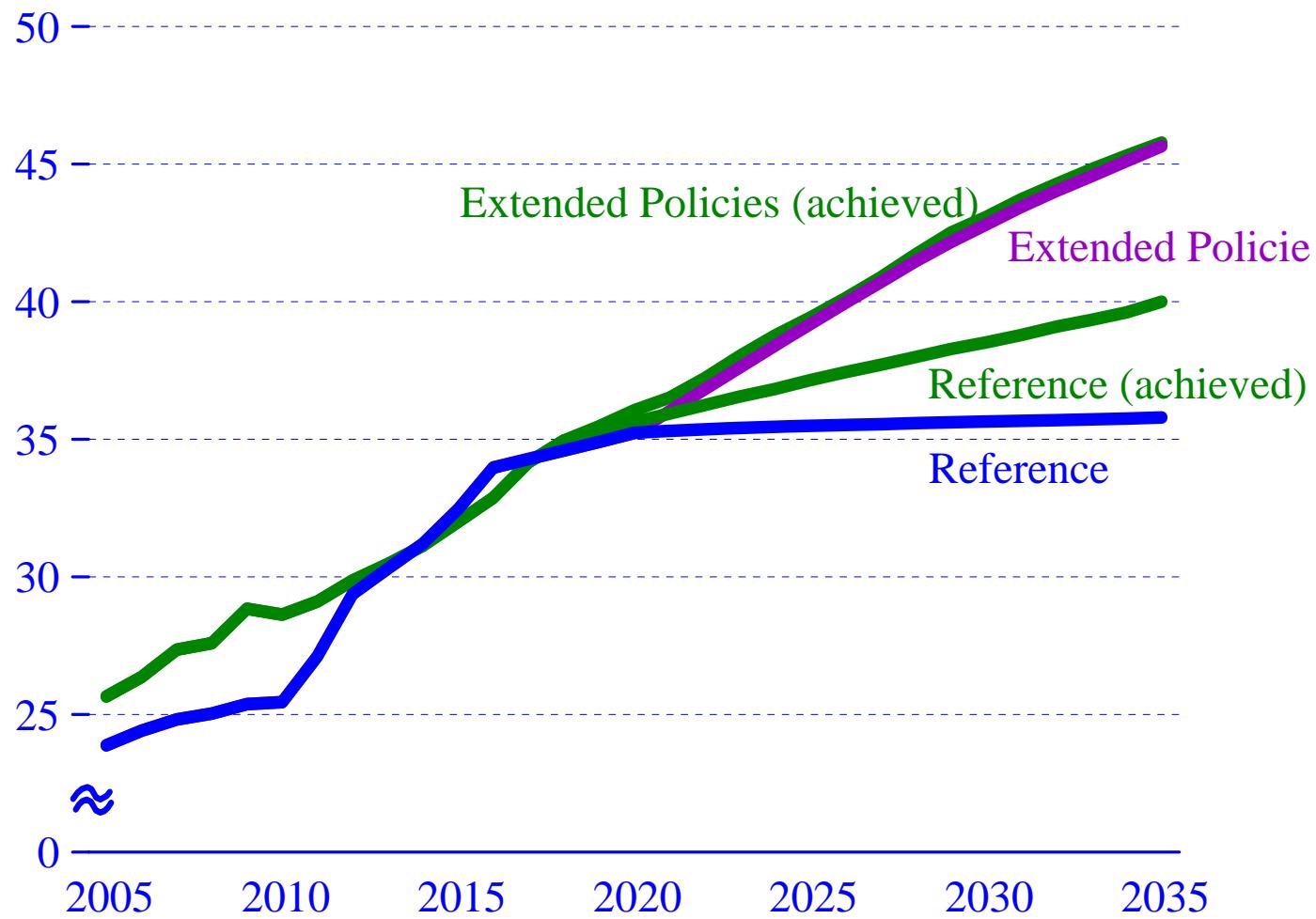
# New light duty vehicle efficiency reaches 40 mpg by 2035

miles per gallon



# The continuation of existing policies into the future would increase vehicle fuel economy

Figure 10. New light-duty vehicle fuel efficiency standards and fuel efficiency achieved in two cases, 2005-2035 (miles per gallon)



# Changes in the adoption of efficient residential and commercial technologies significantly affect projections; new uses play a key role in projected demand growth

Figure 42. Residential delivered energy consumption per capita in four cases, 1990-2035 (index, 1990 = 1)

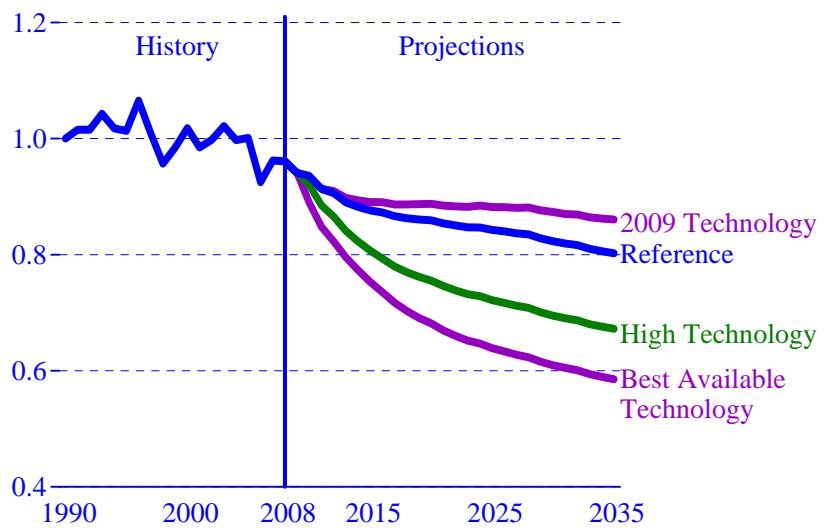
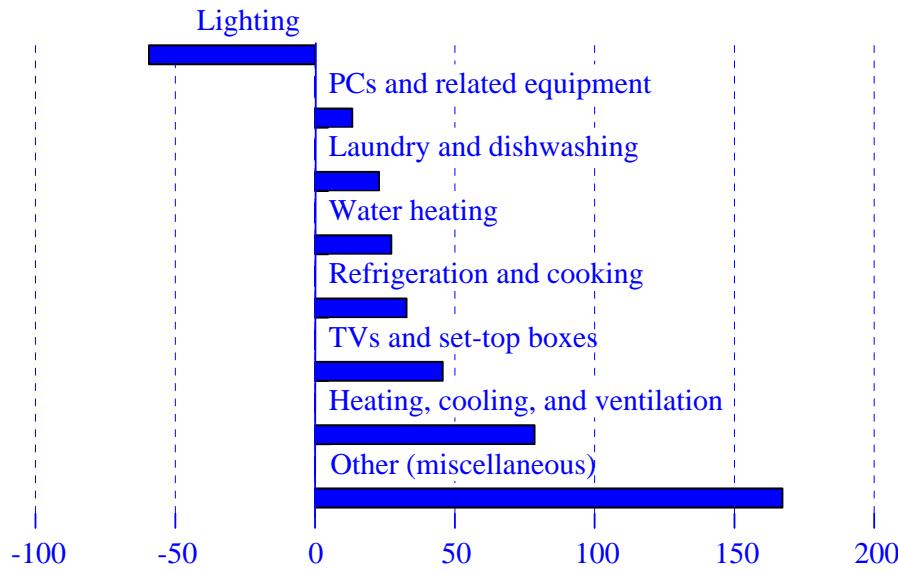
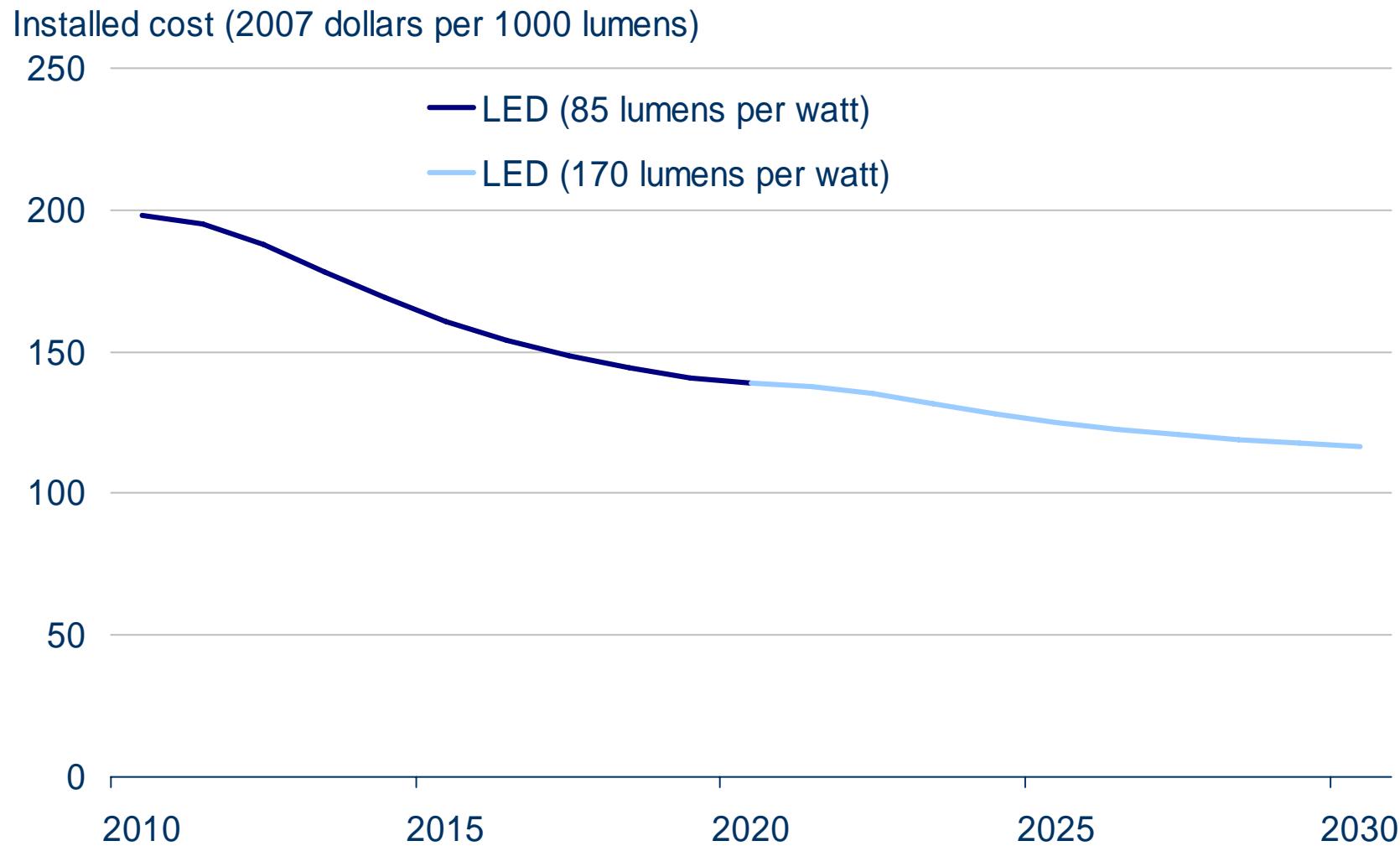


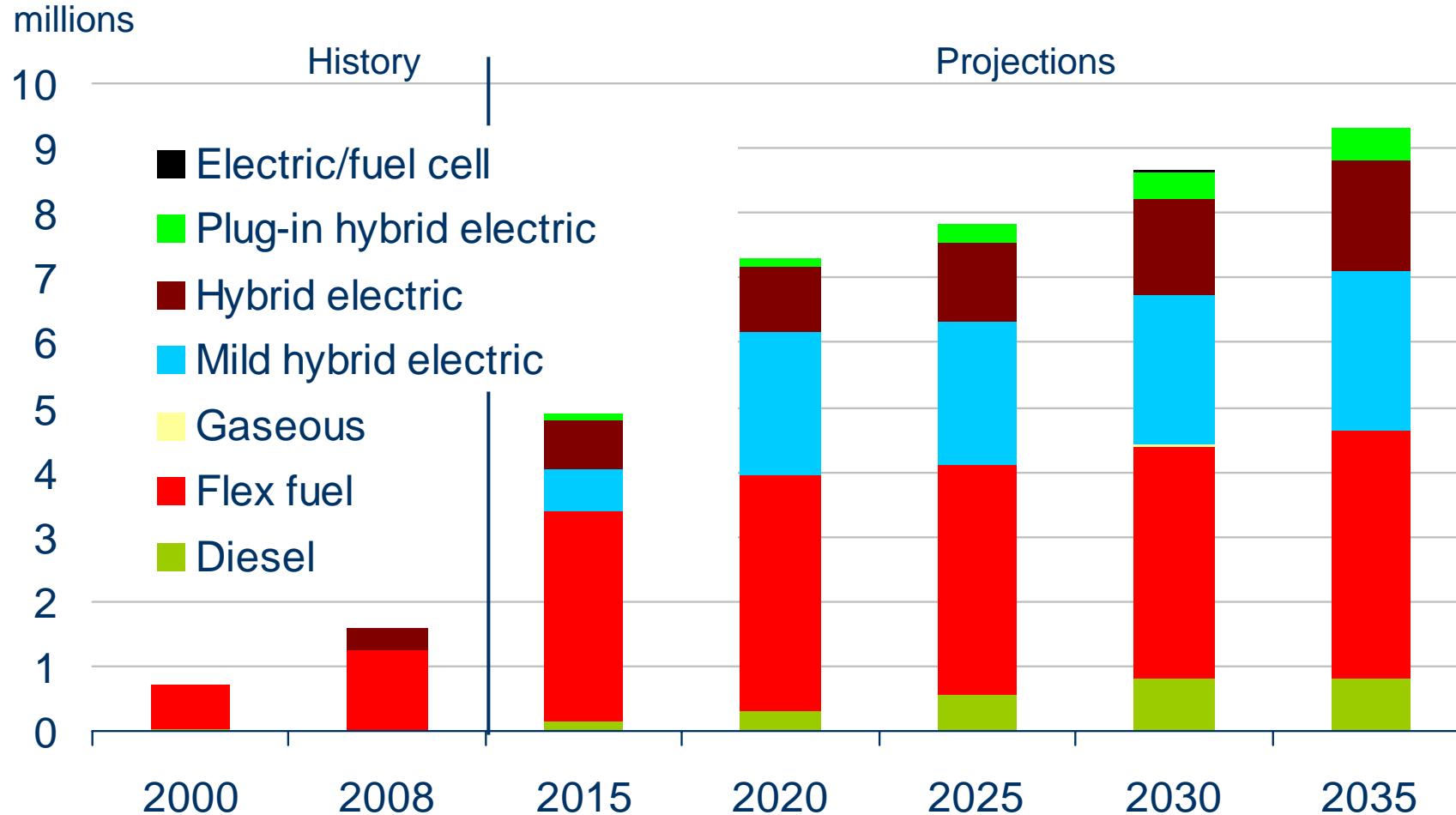
Figure 43. Change in residential electricity consumption for selected end uses in the Reference case, 2008-2035 (billion kilowatthours)



# Example of both market and regulatory induced technology change: commercial sector LED lighting



# Mild and full hybrid systems dominate new light-duty vehicle sales by 2035

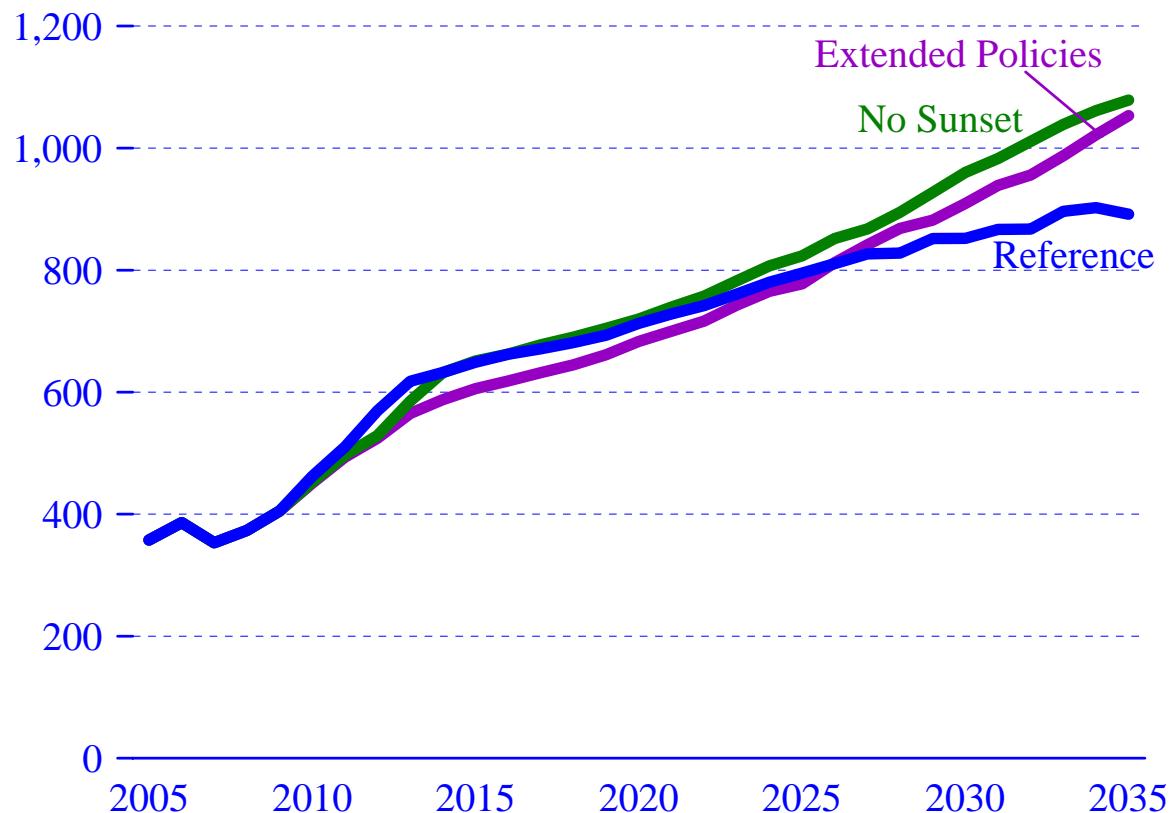


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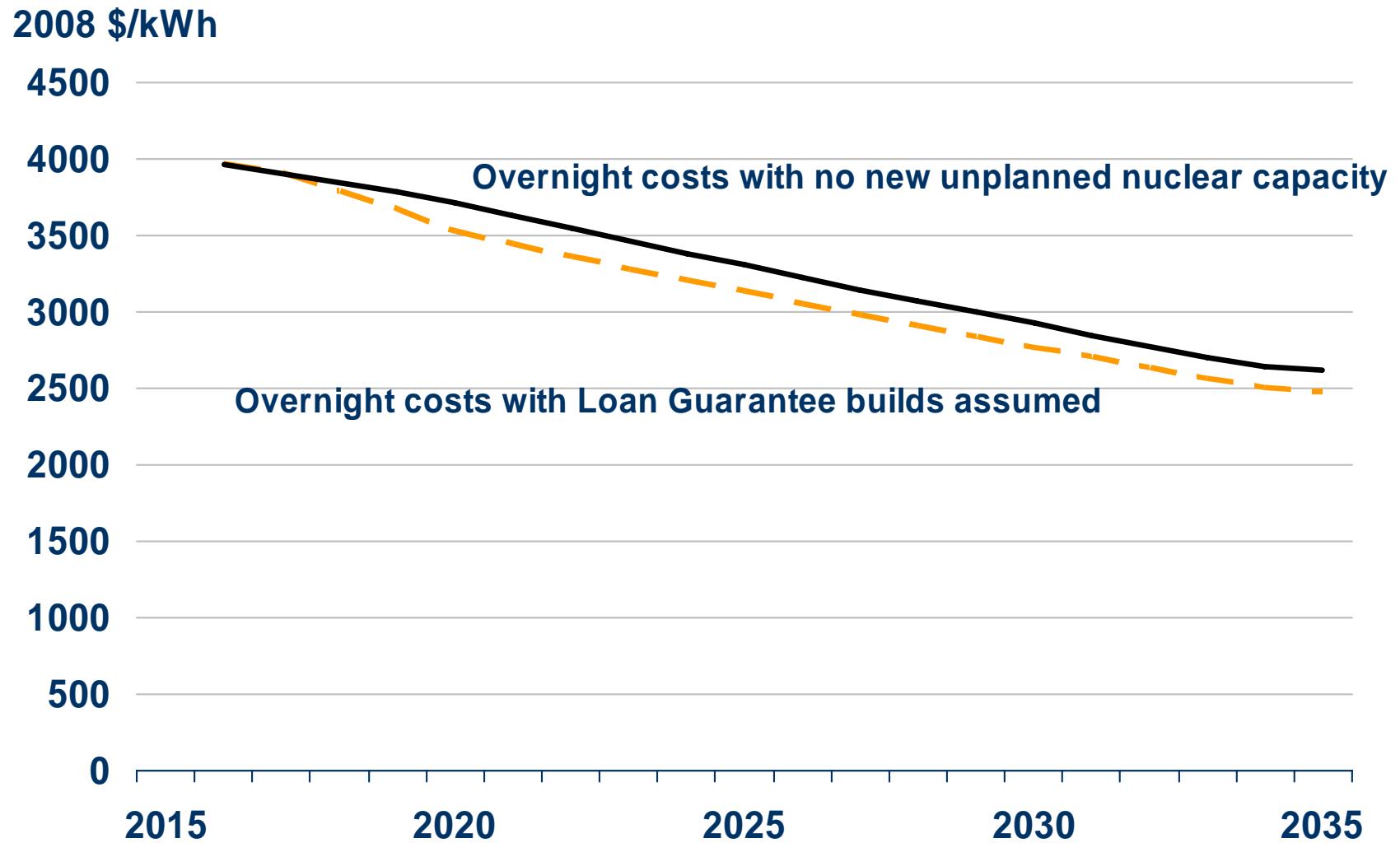
## Government financial incentives

# The continuation of existing policies into the future increases renewable generation

Figure 11. Renewable electricity generation in three cases, 2005-2035 (billion kilowatthours)



# Advanced nuclear overnight costs are lower with loan guarantees



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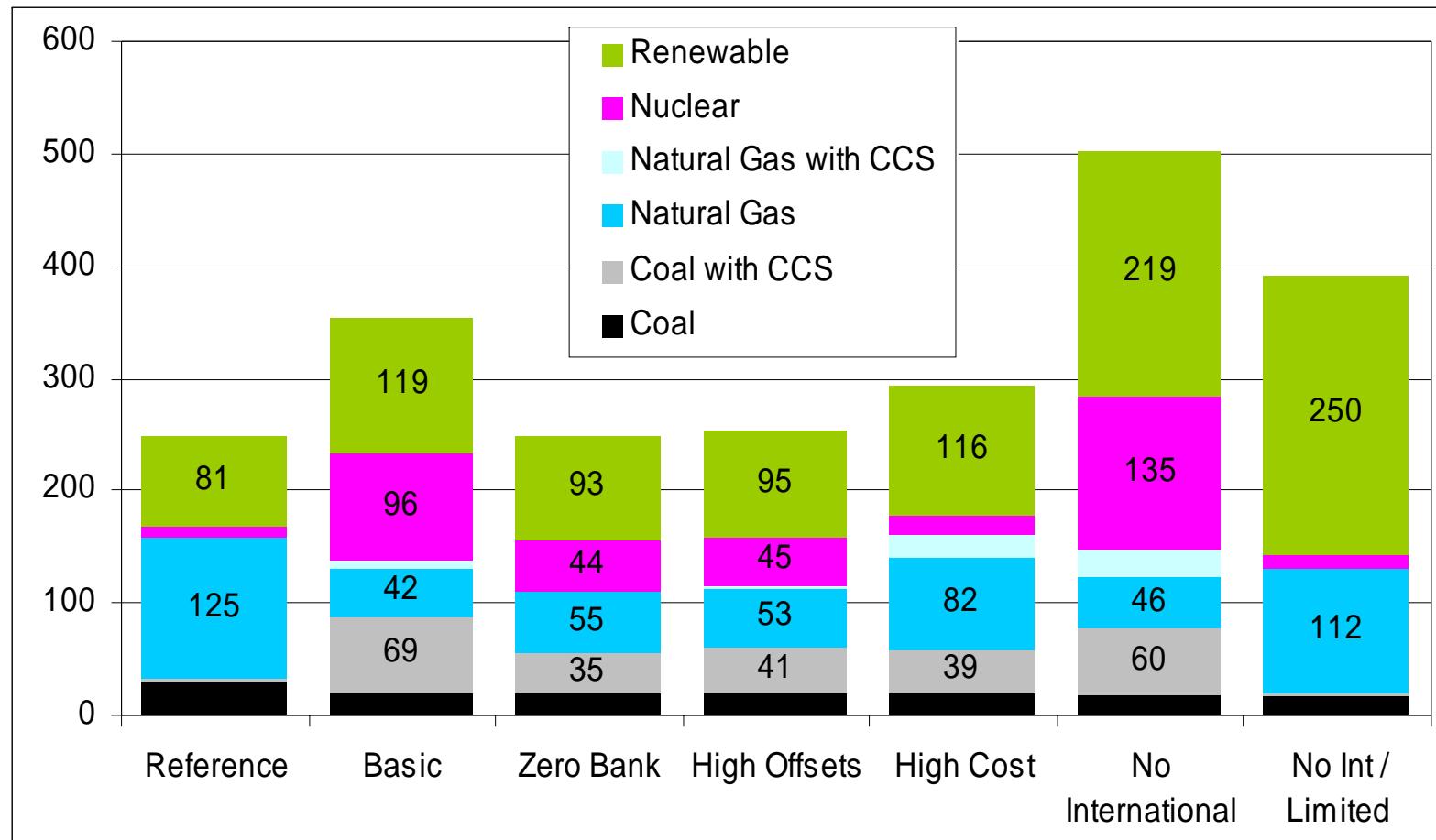
# Emissions policies

# A Carbon Policy: A Carbon Policy Example: Main Cases

Case Name	Assumptions
Reference	<i>Updated AEO2009 Reference Case, which includes the provisions of the American Recovery and Reinvestment Act (ARRA).</i>
Illustrative Policy Cases	
Basic	Integrated analysis of all of the modeled provisions of Hr. 2454(ACESA). Build allowance bank through 2030 to use thereafter.
No International Offsets	Same as Basic but assumes international offsets are too expensive or unable to meet the certification requirements for use.
No International / Limited Tech	Same as Basic but limits additions of new nuclear, fossil with CCS and biomass gen to reference case levels. Also no international offsets.

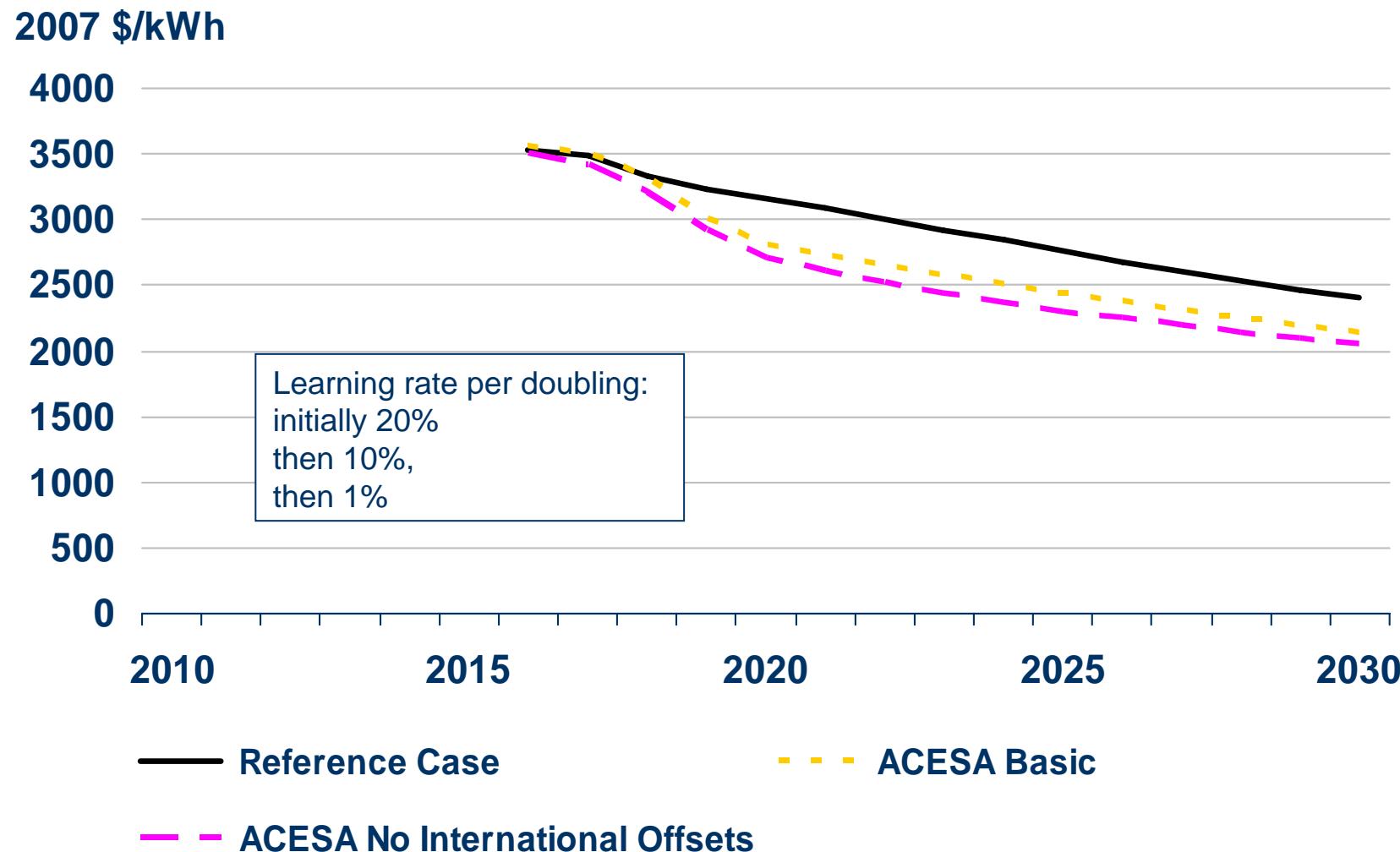
# Example of carbon policy impact on capacity additions, 2008 to 2030

(thousand megawatts)



Capacity additions parallel the behavior of the change in the fuel mix in generation.

# Overnight costs of new coal with sequestration plants (CCS) show learning over time



# AEO2010 includes 38 sensitivity cases

AEO2010 Case	# of cases	Description
Reference		EIA's starting point for projections through 2035
Economic Growth	2	Lower and higher economic growth scenarios. Average annual rate of GDP from 2008 to 2035 is 1.8 percent (Low case) or 3.0 percent (High case) compared to 2.4 percent in the Reference case
Oil Price	2	World light sweet crude prices in 2035 in 2008 dollars are \$51 per barrel (Low case) or \$210 per barrel (High case) compared to \$133 per barrel in the Reference case
Residential/Commercial Technology	6	A 2009 Technology case (freezes existing shell performance and equipment menu) that is less optimistic about efficiency than the Reference case and two cases (High Technology and Best Available Technology) that are more optimistic than the Reference case
Industrial technology	2	A 2010 Technology case and a High Technology case that are, respectively, less and more optimistic than the Reference case
Transport technology	2	Alternatives that lower and raise the projected cost of vehicle efficiency technologies
Electricity Technology	6	Alternatives that lower and raise the costs of fossil, renewable, and nuclear power technologies
Integrated Technology	2	Cases that apply either "High Technology" or "Low Technology" assumptions across all sectors
Natural Gas Heavy Truck Incentives	4	Vehicle, fuel, and refueling infrastructure tax credits are applied through 2019 or 2027 under "base" or "expanded" characterizations of the potential market
Availability of Shale Gas and other Low Perm Gas	3	Two cases that restrict new drilling for shale and other tight gas, and one that expands the size of the shale resource base.
High LNG supply	1	More gas is available from outside North America
Coal Price	2	Higher and lower coal prices
Oil and Gas Technology	2	Alternatives that lower and raise the pace of advances in drilling technology
No GHG concern	1	Removes risk premium on long-lived investments projects with a large GHG footprint that is included in the Reference case to reflect concern regarding future policies to limit GHGs
Existing nuclear plants retire at age 60	1	Examines impact if existing nuclear plants retire at age 60, a milestone that many units reach between 2030 and 2035.
Extended Policies and No Sunset Cases	2	Alternatives that modify the "current laws and regulations" assumption of the Reference Case

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**Thank you**

## For more information

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U.S. Energy Information Administration home page [www.eia.gov](http://www.eia.gov)

Short-Term Energy Outlook [www.eia.gov/emeu/steo/pub/contents.html](http://www.eia.gov/emeu/steo/pub/contents.html)

Annual Energy Outlook [www.eia.gov/oiaf/aoe/index.html](http://www.eia.gov/oiaf/aoe/index.html)

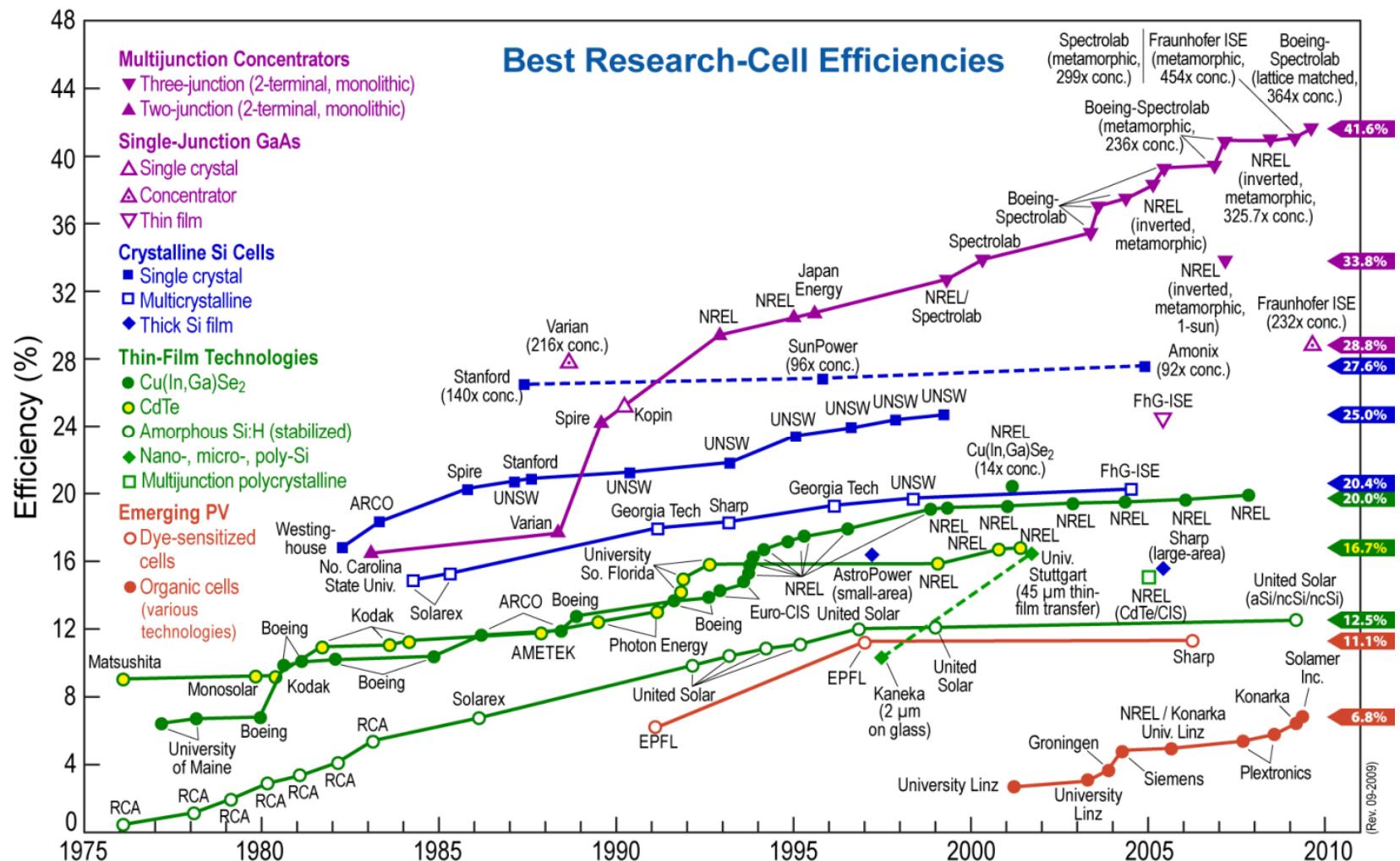
International Energy Outlook [www.eia.gov/oiaf/ieo/index.html](http://www.eia.gov/oiaf/ieo/index.html)

Monthly Energy Review [www.eia.gov/emeu/mer/contents.html](http://www.eia.gov/emeu/mer/contents.html)

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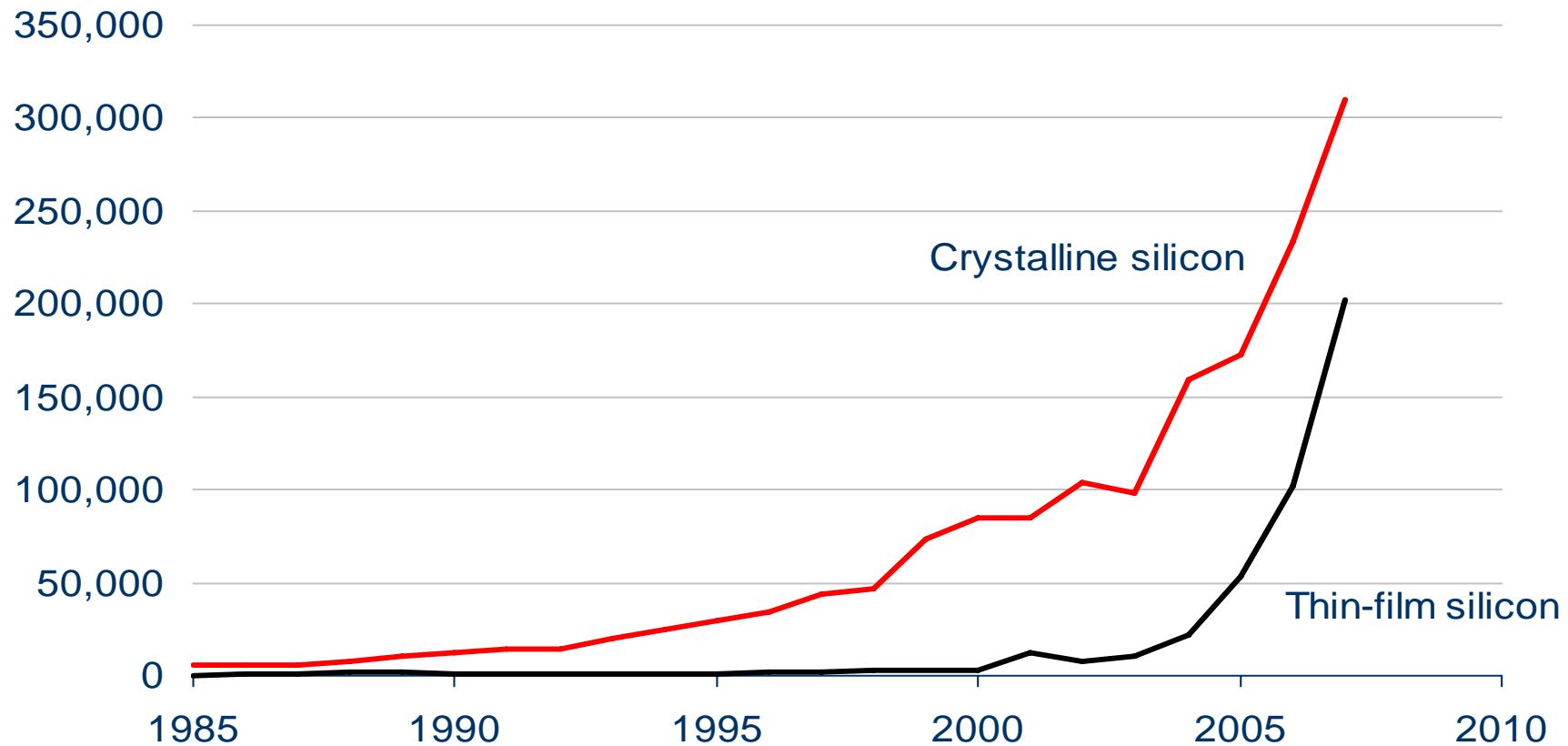
## The efficiencies of PV cells continue to increase



Source: Figure 3.6. Best research cell efficiencies 1975–2009 (Kazmerski 2009) NREL

# US PV shipments

Peak kilowatts

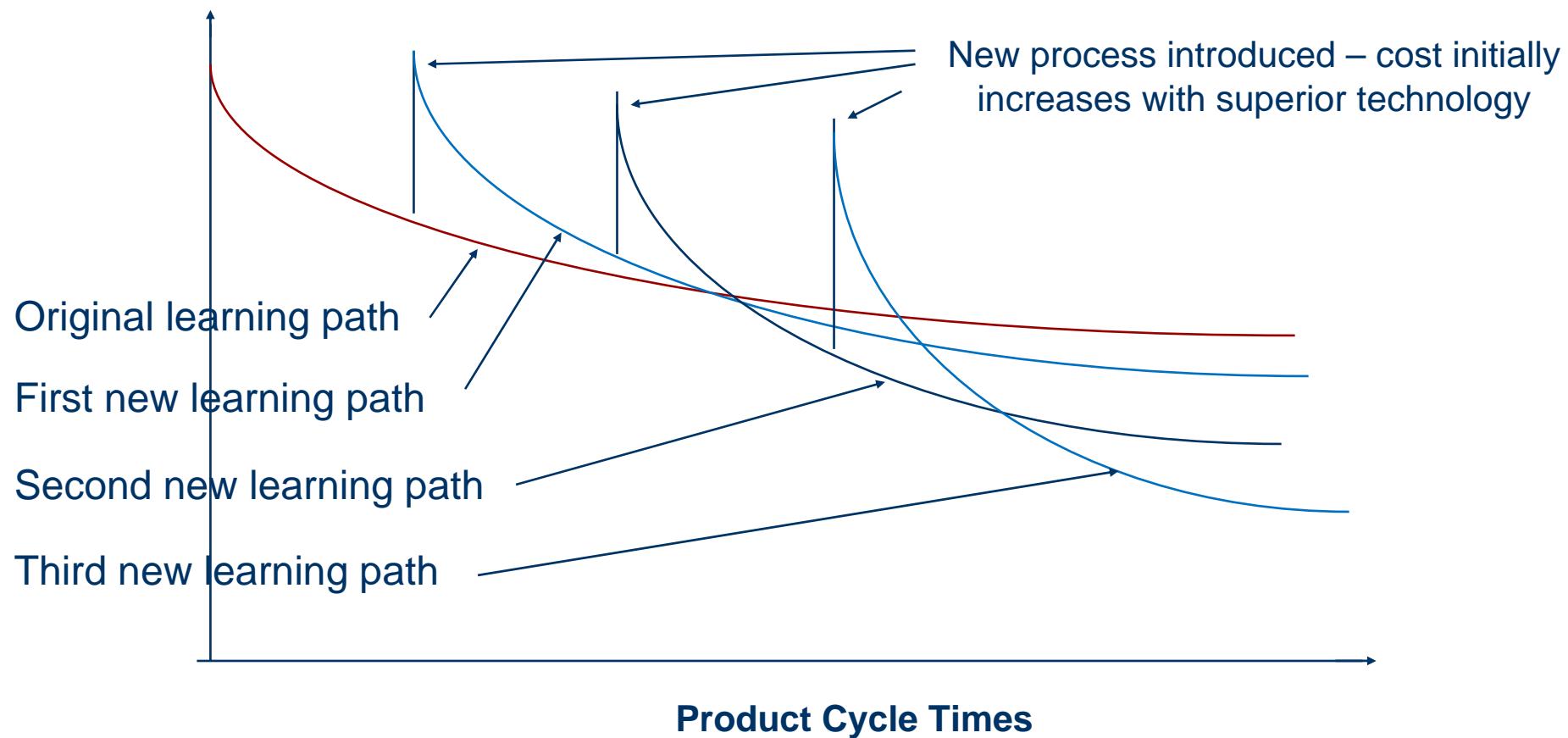


## Learning-by-doing: returns to adoption

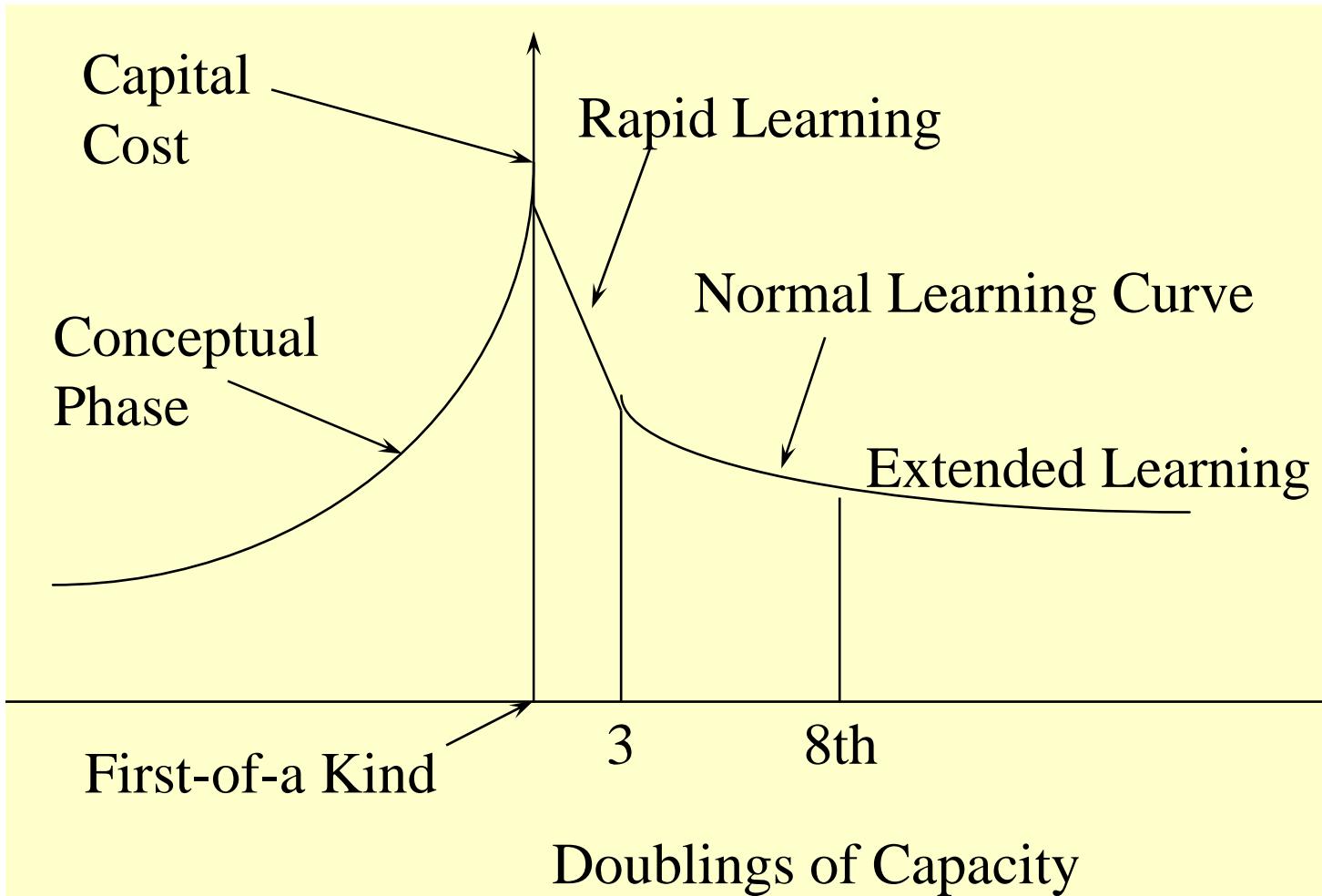
- Learning-by-doing – well documented since 1930's
- Wright (1936) – direct labor costs of manufacturing an airframe fell by 20% with every doubling of cumulative output
- Subsequent authors broadened analysis of learning to other costs and showed costs declined with experience
- Cumulative learning - combination of cumulative production plus cumulative engineering resources applied to the innovation (Hatch, Mowery 1998)
  - Always some loss of learning when transfer from R&D lab to manufacturing production line.

# Manufacturing production costs step down with new process introduction (Mowery)

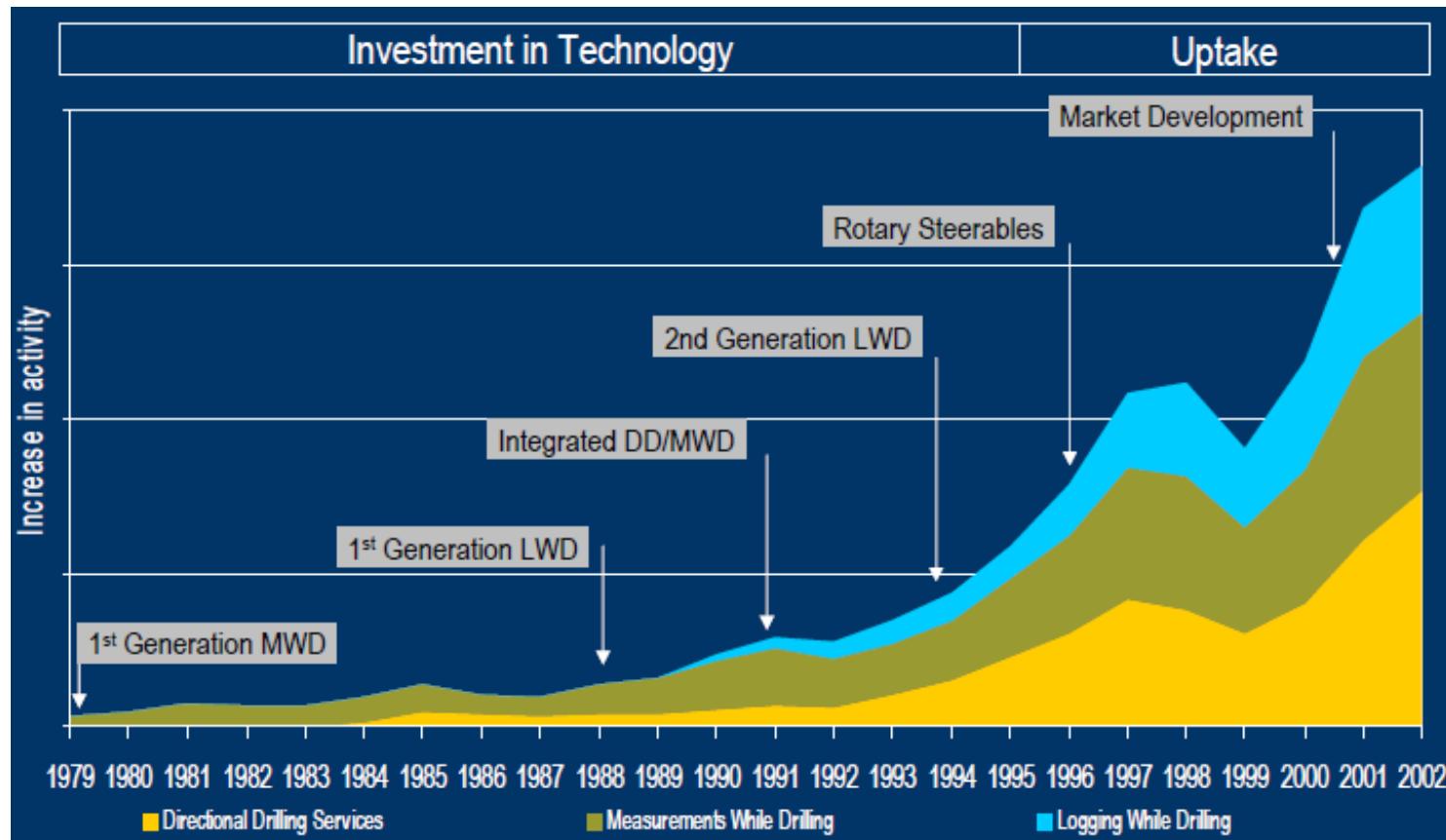
Unit Production Cost



# Endogenous technological learning by component – an illustrative example



# Technology change starts slow then accelerates. Example: historical uptake for directional drilling



# Data sources for learning assumptions

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- Model of Learning-By-Doing
  - (electricity capacity expansion) - various studies
- Specified cost and performance by year and end-use
  - (buildings and transportation) - engineering analysis, e.g., Navigant Consulting
- Time trends
  - (for oil, gas, coal, industrial sectors) - econometric / engineering analysis, e.g., Advanced Resource Int., Navigant Consulting and econometrics

# Modeling learning in the NEMS building modules

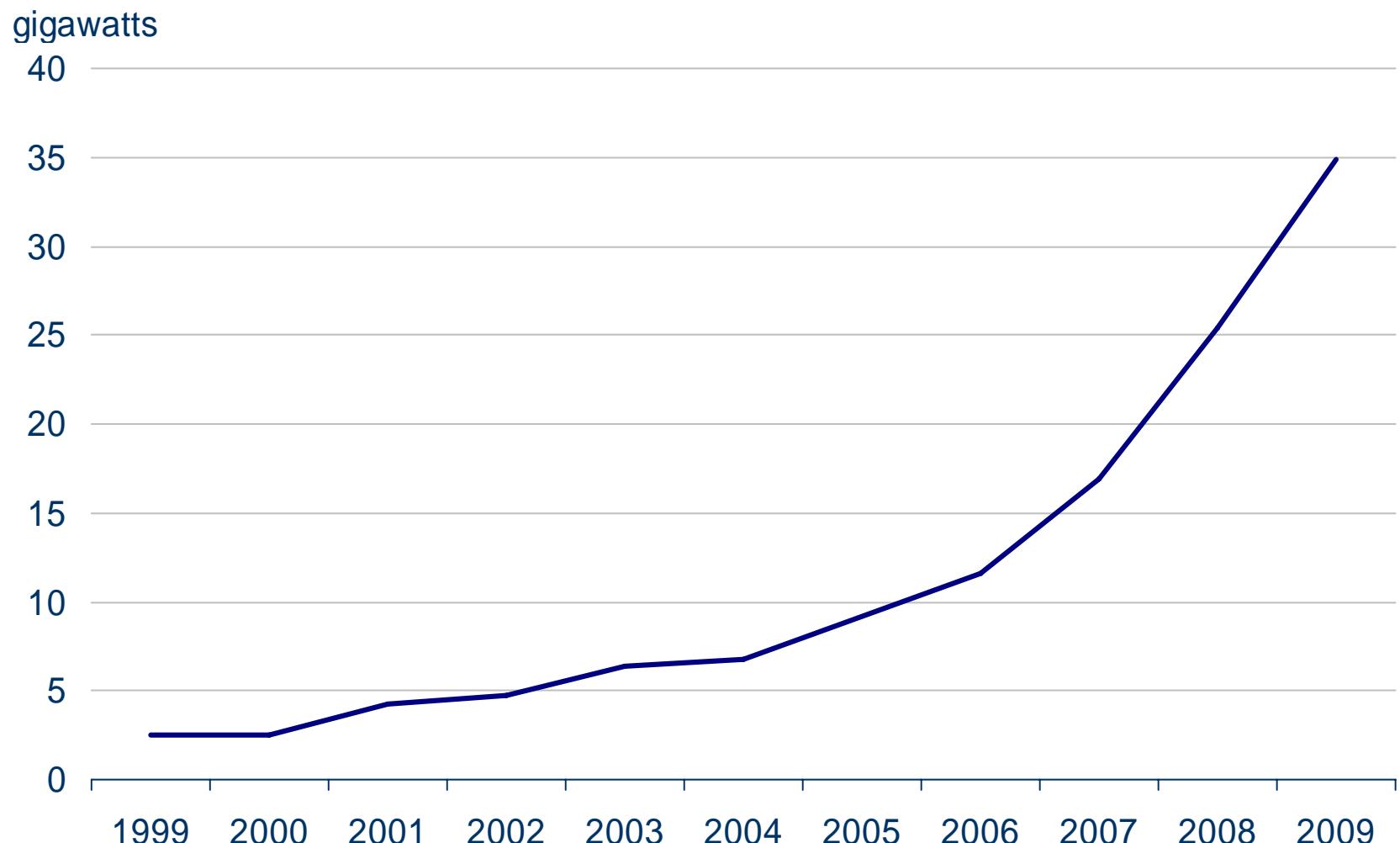
- Learning of conventional “mature” technologies (where shipments are a small fraction of cumulative sales) is exogenously specified by engineering/economic “menus” [1]
- CHP and distributed generation uses the same basic equation which is used for electricity capacity expansion [2]
- Costs for technologies designated as “infant” or “adolescent” decline from menu costs over time based on a logistic function specified by the curve’s inflection point, the ultimate price reduction, and the rate of price decline. [3]
- Potential enhancement to accelerate menu availability of advanced technologies when cumulative price changes exceeds thresholds [4]

# Technology learning features in the NEMS electricity module

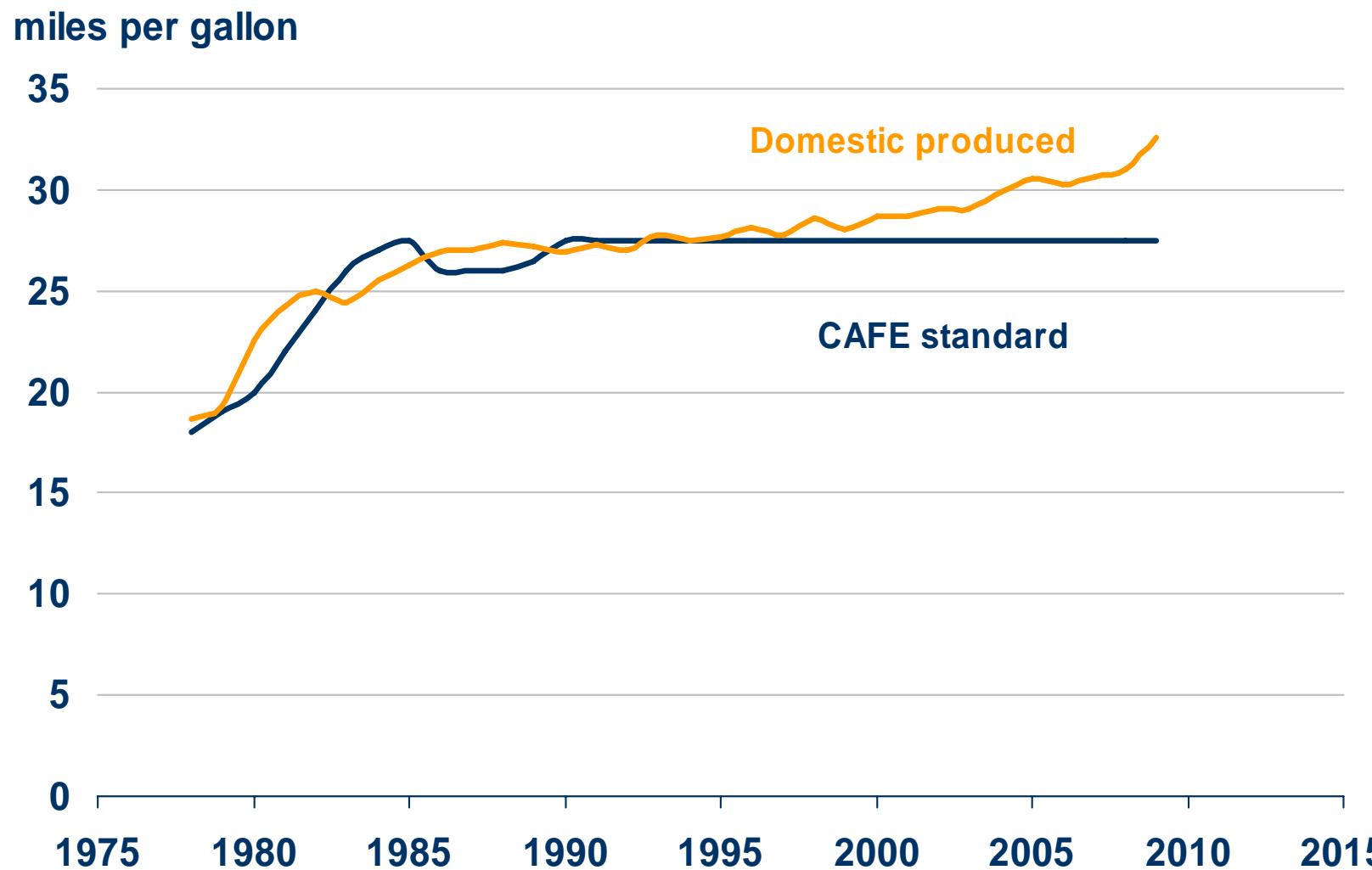
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- Capital costs and progress ratios reviewed regularly
- Autonomous minimum learning for international learning and R&D
- **Learning by Component:** Endogenously relate learning for common technologies
  - (e.g. capacity additions of advanced gas combined cycle results in component learning for IGCC, Adv Turbines and Advanced Biomass)

# Installed wind capacity



# CAFE standards for cars induced quick technology change in the 1970s and 1980s

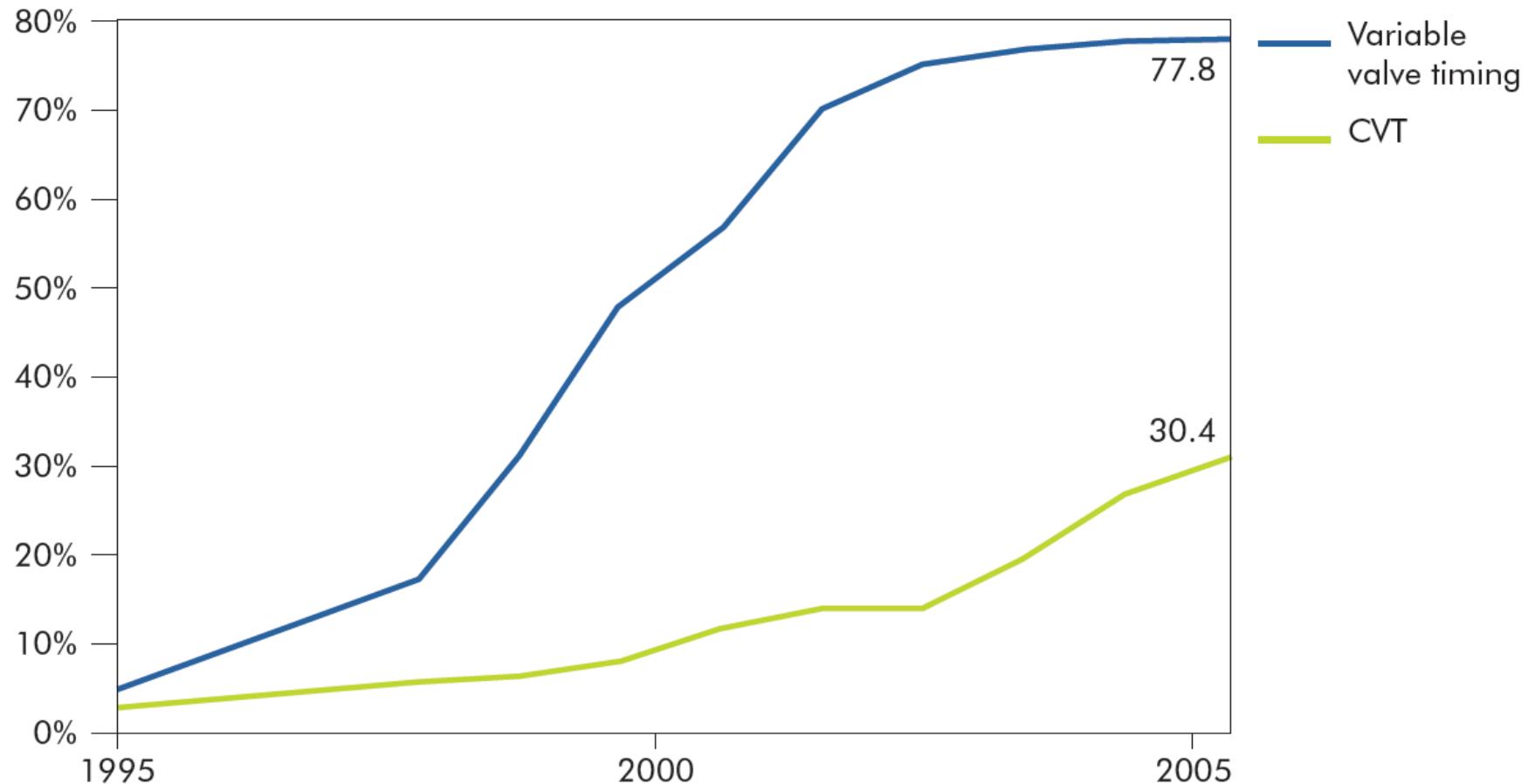


# R&D program investments cannot be directly assessed using NEMS

- Modeling the impact of R&D – the information challenge
- Timing and size of net change in federal R&D spending may differ (substantially) from authorized level
- There is no reliable relationship between the input of specific federal R&D spending and R&D outcomes
- Private R&D expenditures also matter – but we have little reliable data on technology-specific R&D expenditures in the U.S. or their results
- International private and public sector R&D investments are even less reliable than domestic ones
- Knowledge “spillover” (sharing) from international R&D is important and even less reliable and sparse

# Variable valve timing and continuously variable transmission (CVT) in passenger LDVs in Japan

Market share in new vehicles



Barnett Shale Drilling  
From 1997 to 2009  
Ft. Worth Basin, Texas

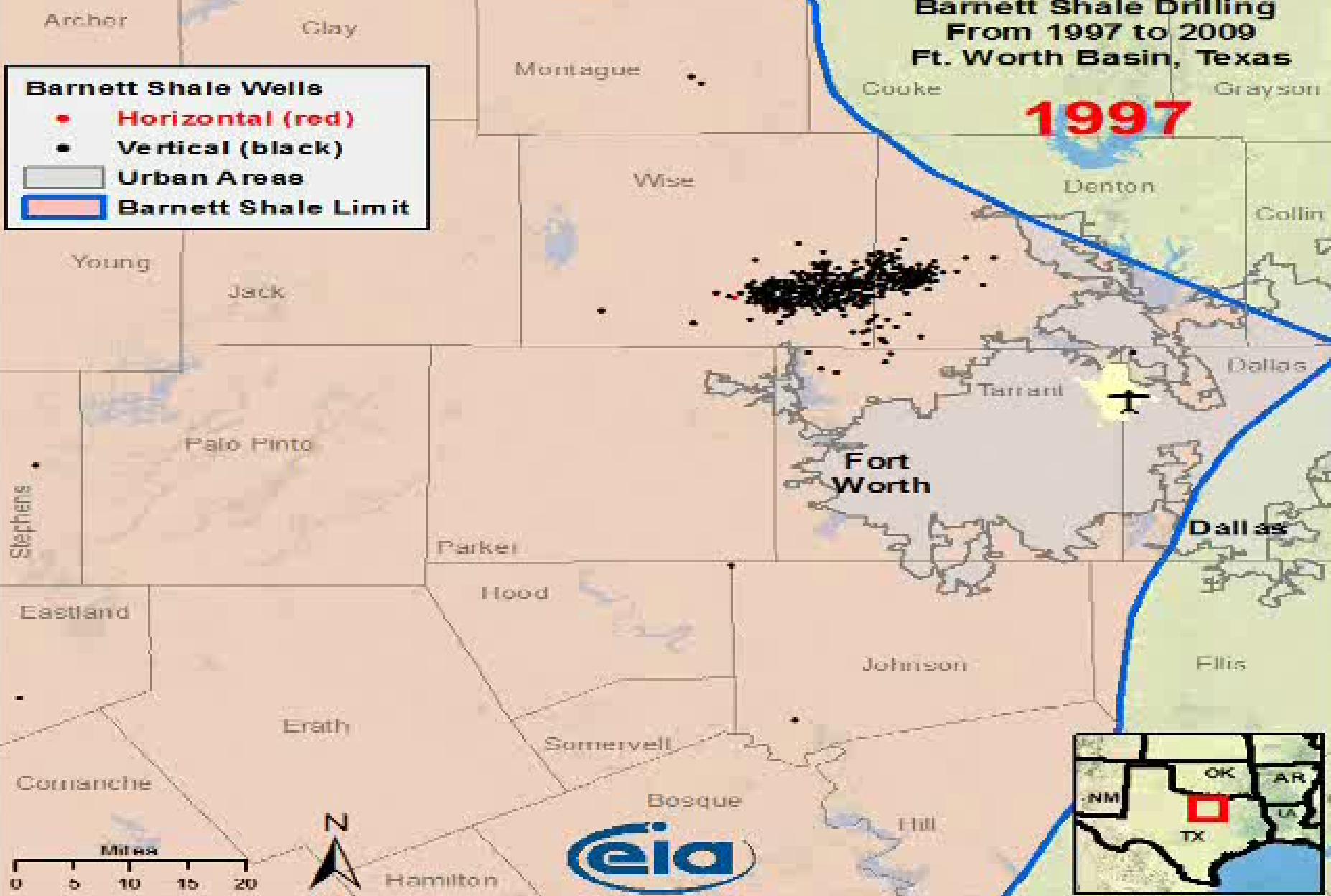
1997

**Barnett Shale Wells**

- Horizontal (red)
- Vertical (black)

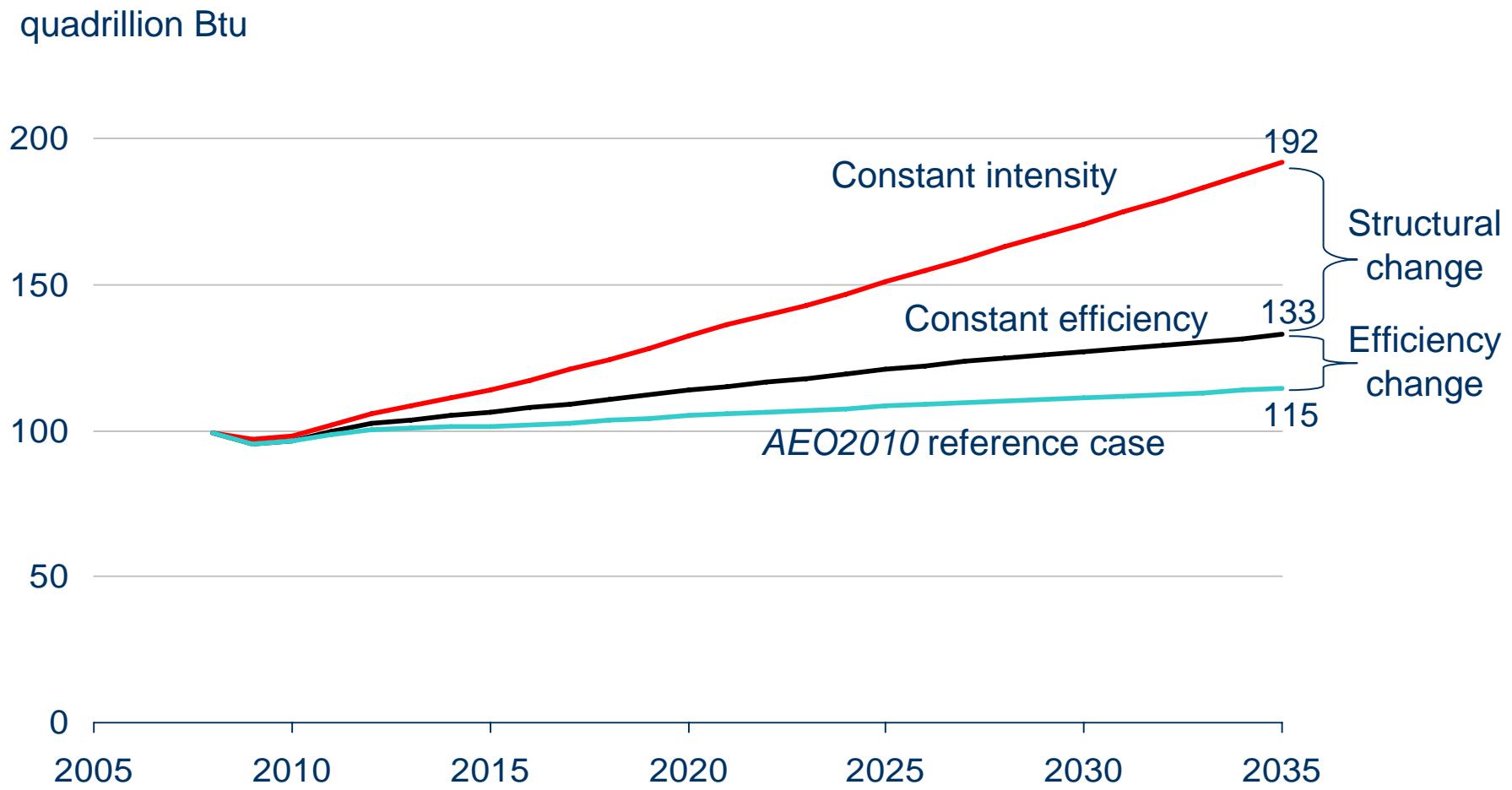
Urban Areas

Barnett Shale Limit



bia

# Energy efficiency gains reduce consumption 15% from where it would otherwise be; structural change is even larger



# Access to shale gas has major implications for prices, production imports, and the Alaska gas pipeline

**Table 7. Natural gas prices, supply, and consumption in four cases, 2035**

Projection	Reference	No Shale Gas Drilling	No Low-Permeability Gas Drilling	High Shale Gas Resource
Henry Hub spot price (2008 dollars per million Btu)	8.88	10.37	10.88	7.62
Total U.S. natural gas production (trillion cubic feet)	23.3	19.1	17.4	25.9
Onshore Lower 48	17.1	12.5	10.4	20.0
Offshore Lower 48	4.3	4.7	5.1	4.0
Alaska	1.9	1.9	1.9	1.9
First year of operation for the Alaska natural gas pipeline	2023	2020	2020	2030
Total net U.S. imports of natural gas (trillion cubic feet)	1.5	3.7	4.5	0.8
Canada	1.7	2.5	2.7	1.4
Mexico	-1.0	-0.7	-0.5	-1.3
Liquefied natural gas	0.8	1.8	2.4	0.8
Total U.S. natural gas consumption (trillion cubic feet)	24.9	22.9	22.0	26.8
Electric power sector	7.4	6.1	5.5	8.7
Residential sector	4.9	4.8	4.7	5.0
Commercial sector	3.7	3.6	3.5	3.8
Industrial sector	6.7	6.5	6.4	7.0
Other	2.2	1.9	1.8	2.3

# Structural change in the economy, is the main driver of projected reductions in energy intensity, but efficiency improvement also matters

- The constant energy intensity estimate assumes that the ratio of energy use to economic output remains fixed at its 2008 level.
- The constant efficiency estimate similarly assumes that energy efficiency does not change from 2008.
- Structure accounts for 76% of the 2035 difference between the Reference case constant energy intensity estimate.

- Low Technology case essentially freeze technologies to those available in 2009.
- High technology has more efficient and less expensive equipment.
- Dispersion across the cases for efficiency and intensity are similar – this reflects the fact that technology drives efficiency which is also part of intensity.

Figure 19. Structural and efficiency effects on primary energy consumption in the AEO2010 Reference case (quadrillion Btu)

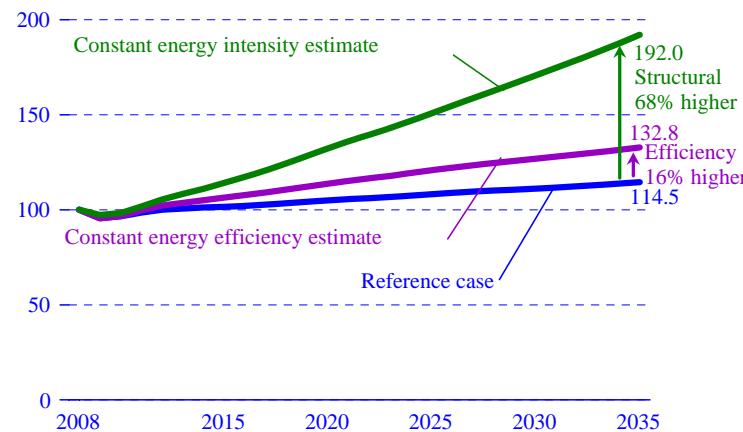
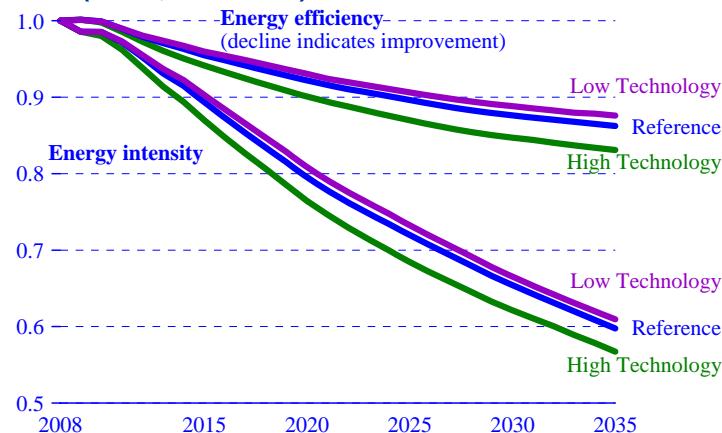
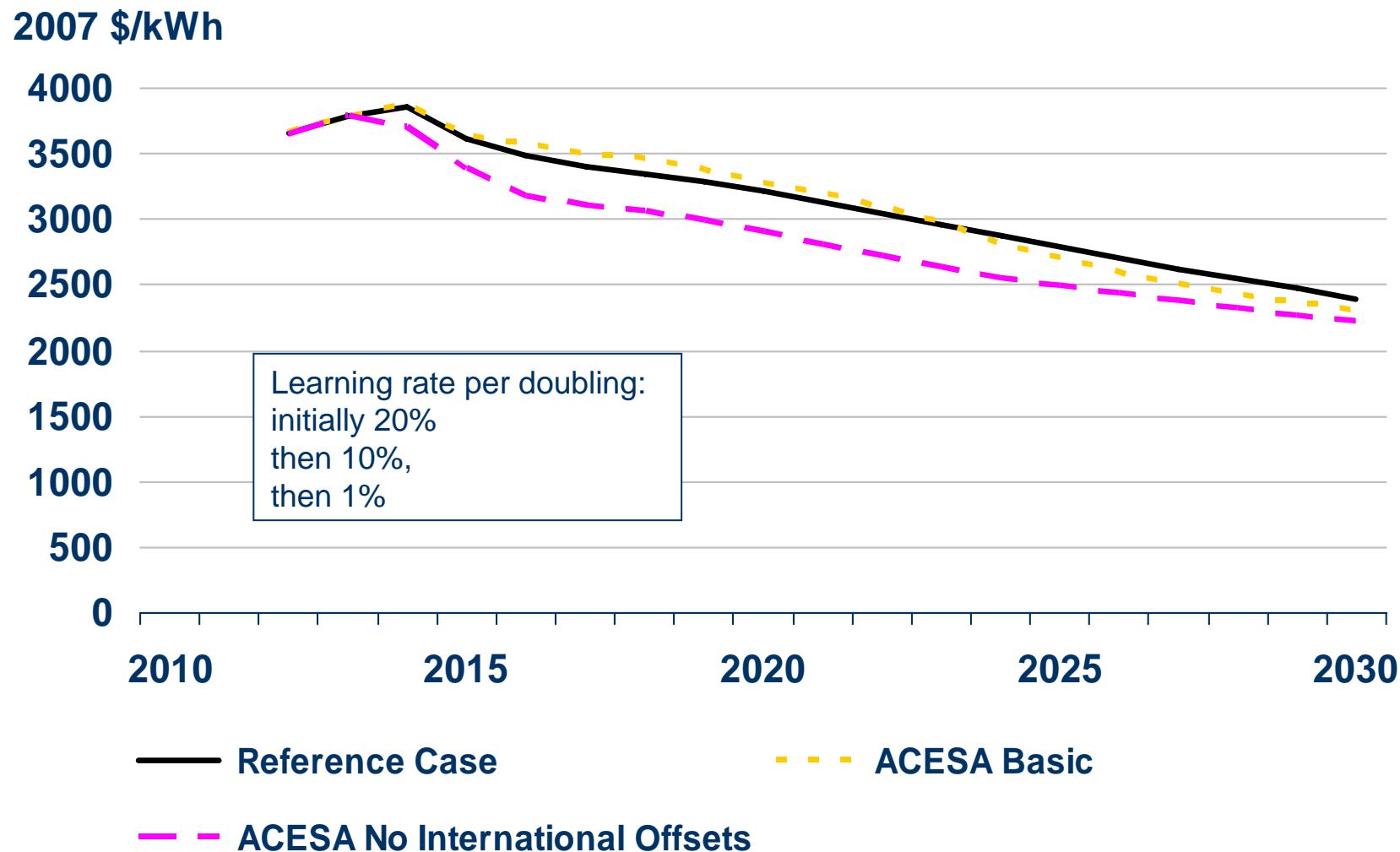


Figure 20. Energy efficiency and energy intensity in three cases, 2008-2035 (index, 2008 = 1.0)



# Overnight costs of new biomass IGCC plants



# Little difference in overnight costs for new wind plants because most of the technology is very mature

