

# Improving Equality of Opportunity at School Entry Primary Education Enrollment in the Netherlands

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## Primary education enrollment policies

- At what age are children enrolled in primary education?
- Default enrollment policy in most countries: calendar year of enrollment based on birth-day cutoff policy
- For example: children with birthdays before (after) October 1 enroll in the calendar year they turn 6 years old (7 years old)
- Not in the Netherlands. Education Inspectorate: enroll children by developmental skills, not their date of birth

# Equality of opportunity and primary education enrollment solely by date of birth

- Age at enrollment in primary education has causal effect on later outcomes (e.g. Bedard Dhuey, 2006)
    - ⇒ Enrollment solely by date of birth: later education outcomes depend on random birth date
  - Enrollment by date of birth fully preserves differences in skill endowments among children with the same birth date
- ⇒ No offsetting of (random) differences in skill endowments + introduction of additional source of randomness

## Equality of opportunity and primary education enrollment by developmental skills: potential improvements?

- Developmental skills at a given point in time reflect broader set of child characteristics than birth date
  - ⇒ Enrollment by developmental skills should mitigate link between random birth dates and expected outcomes
- Children with low skill endowments could be enrolled at older ages, giving them more time to mature and possibly improving their outcomes

⇒ Raises education outcomes at the bottom + mitigates randomness in date of birth

## Enrollment by developmental skills: possible drawbacks

- Assessments of developmental skills are imperfect
  - ⇒ Could introduce bias and new sources of noise
  - ⇒ Enrollment by development skills **assessments** could be worse than enrollment by date of birth
    - Replace birth-date randomness with assessment randomness
    - Lower education outcomes at the bottom

## Related literature

- Our paper is about which child starts primary education when, keeping average age at primary education enrollment constant
- Focused on alternatives to birth-date enrollment
- Doesn't seem to be any literature
- Builds on quite large literature on the consequences of individual differences in school starting age in countries with birth-date enrollment default (e.g. Bedard Dhuey, 2006)
  - Strong evidence on primary and secondary school outcomes
  - Some evidence of effect on long-term earnings
- Not much related to literature on early-childhood education

# Outline

- 1 Background on Dutch elementary education and some data
- 2 Theoretical framework
- 3 Estimation of ordered probit model for enrollment year
- 4 Calibration of model for skills end of primary education
- 5 IV estimation of model for skills end of primary education
- 6 Counterfactual analysis of alternative enrollment policies

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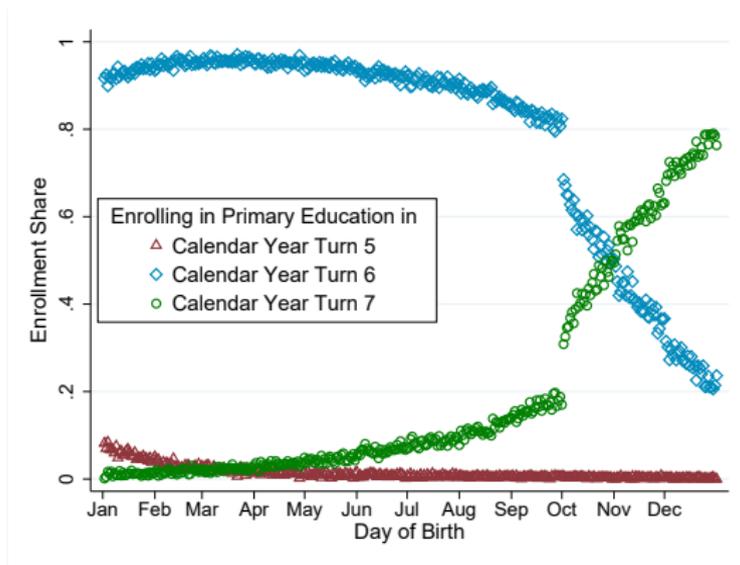
# Kindergarten and primary education in the Netherlands

- Both types of education in same (elementary) school
- Children can start elementary school the day after they turn 4
- Start with a kindergarten education (usually in a mixed-age group)
- Enrollment in primary education. Start of the school year (around 1 September) of the calendar year when children
  - either turn 7 years old
  - or turn 6 years old
  - or turn 5 years old (1 percent)
- Enrollment should be based on developmental skills, not birth dates
- Primary education consists of six grades
- Secondary school with different tracks; tracking partly based on standardized test performance at end of primary education

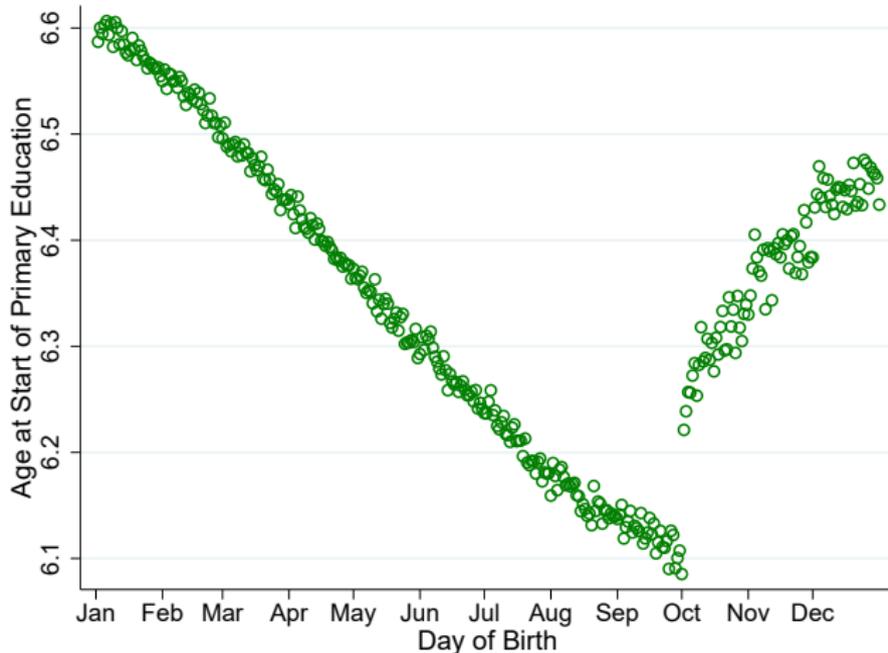
## Main data

- All children born in Netherlands in 2003, 2004, 2005
- Family background:
  - Maternal education
  - Parental income
- Children:
  - Exact birth date
  - When enrolled in primary education
  - Standardized test score end of primary education (end of grade 6; children around 12 years old)
  - Secondary school track
- End up with approx 340,000 children

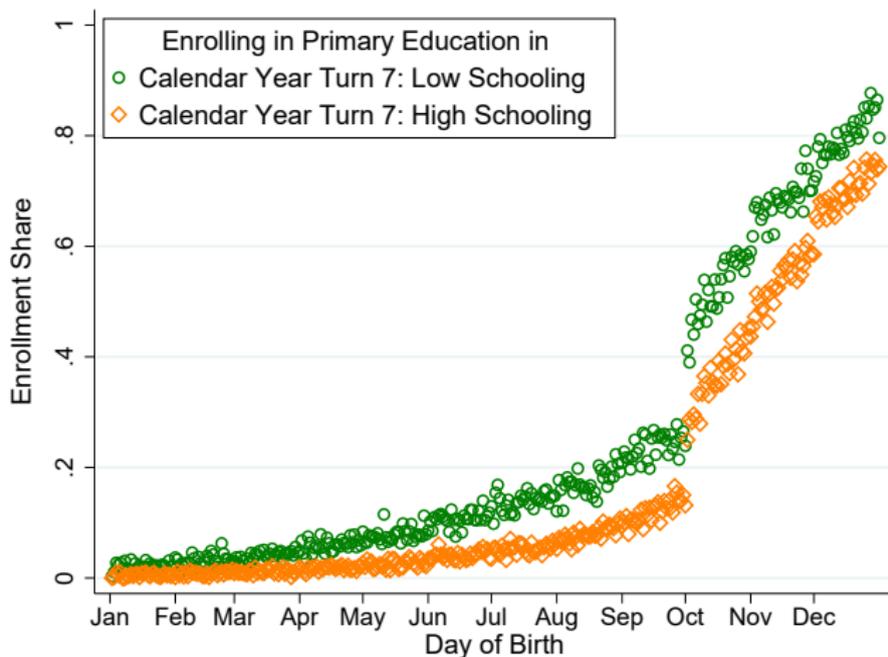
# Children enrolled in primary education in the calendar year they turn 5, 6, and 7 years old



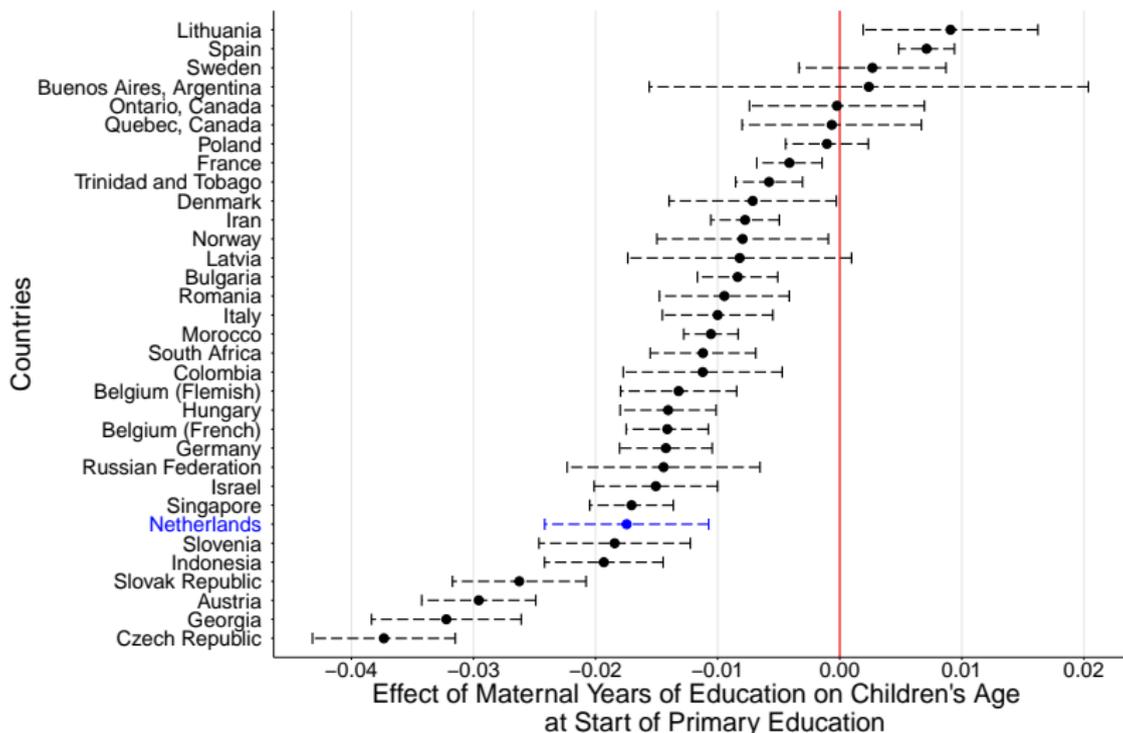
# (Exact) Age at the start of primary education



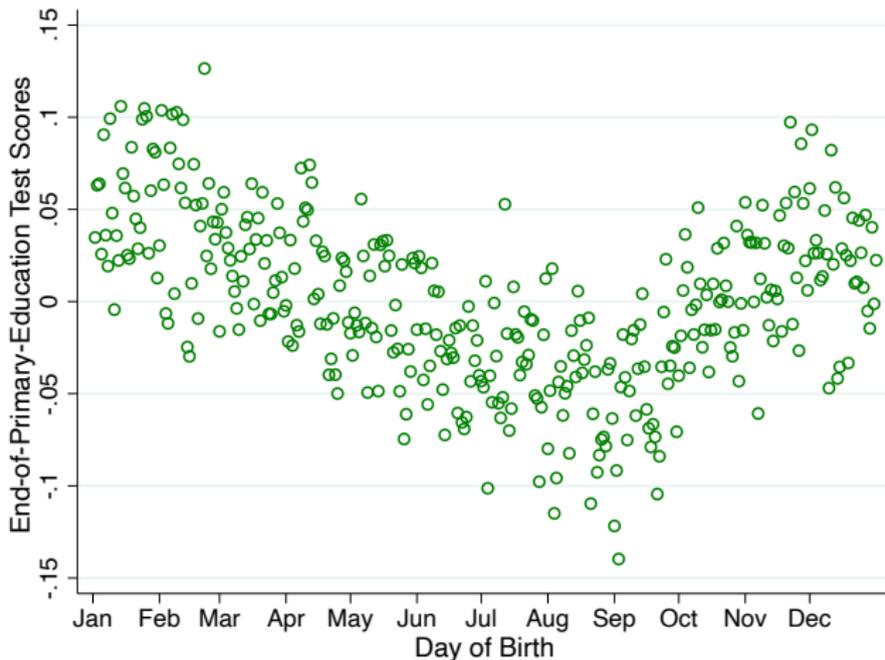
# Enrollment calendar year turn 7 and maternal schooling



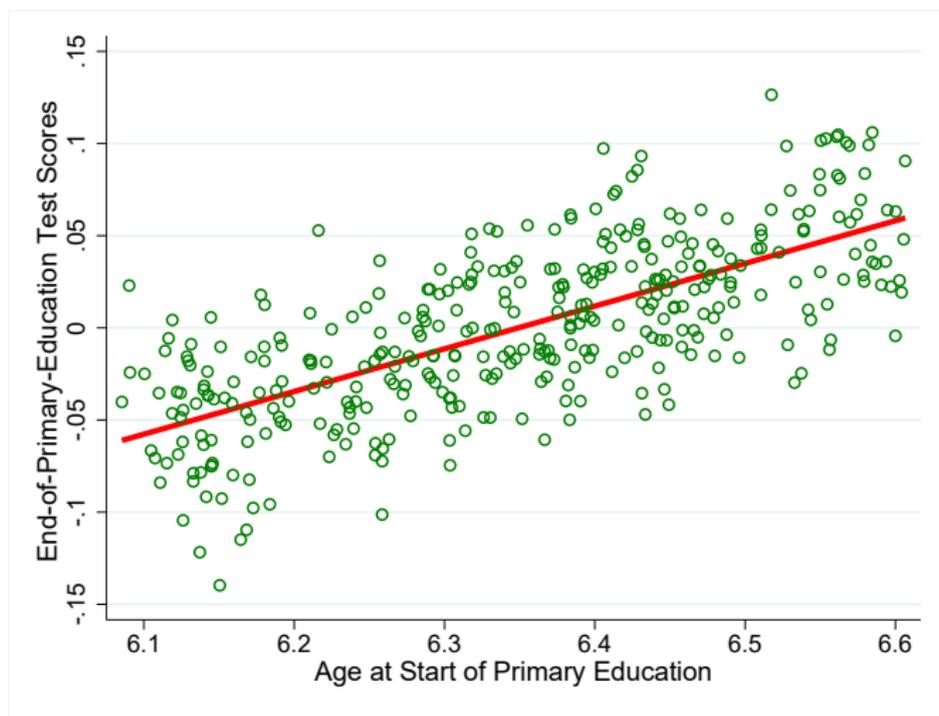
# Maternal schooling and exact age at the start: international comparison using PIRLS



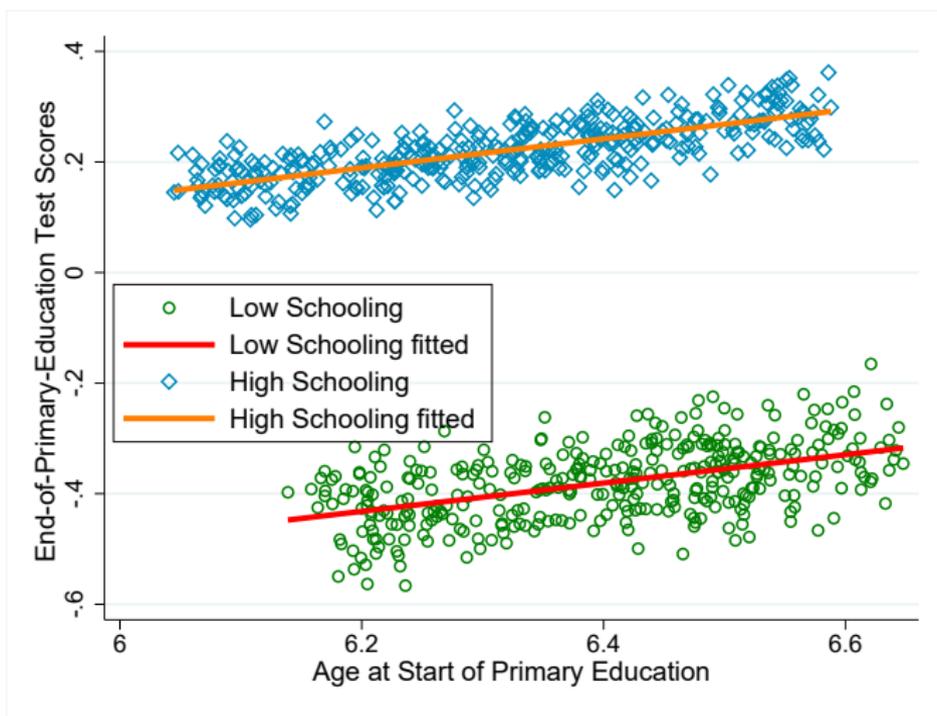
# Test performance at the end of primary education



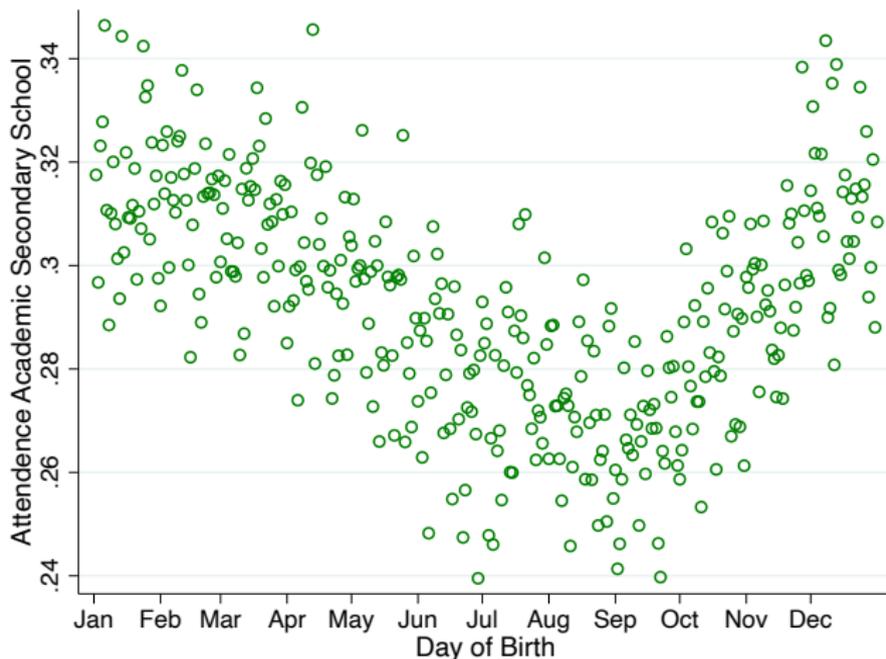
## Scatter plot: test performance at the end of primary education against age at the start of primary education



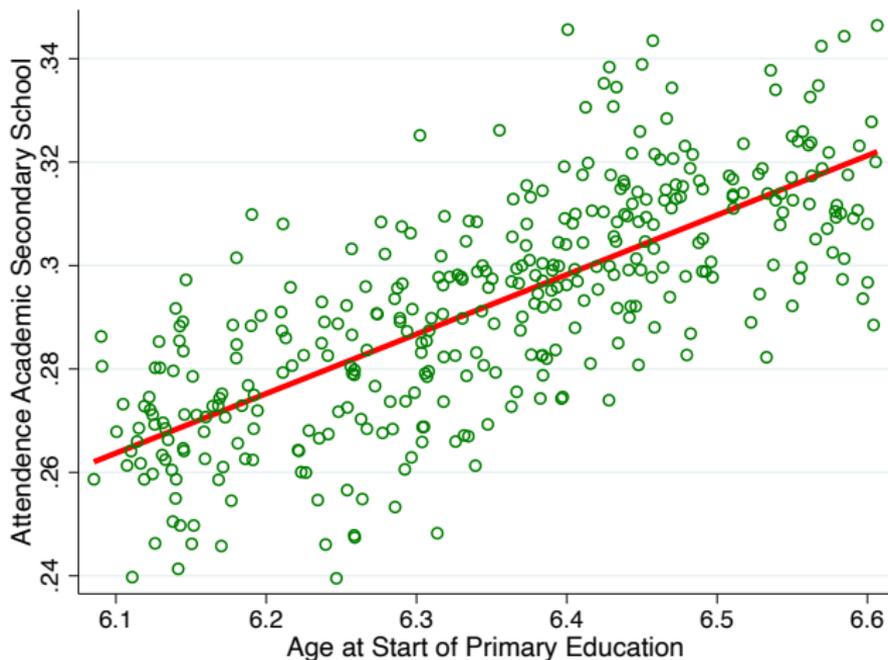
# High vs low maternal schooling: test performance end of primary education against age start of primary education



# Attendance most academic secondary school track and birthday



# Attendance most academic secondary school track against age start of primary education



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## Model where children enroll in primary education in calendar year they turn 6 or 7

- Assess children's skills at the start of the school year in the calendar year they turn 6
- Enroll in primary education in calendar year turn 7 if and only if

$$KindergartenSkills_i < MinSkills[Birthday_i] - ParentInfluence_i$$

- Exact age at start of primary education

$$AgeStartPrimEdu_i = 6 + D_i^7 + f - x_i$$

- $D_i^7 = \mathbf{1}(\text{enroll calendar year turn 7})$
- $x$  birthday normalized to 0–1
- $f$  day school year starts normalized to 0–1

# Model for skills at the end of primary education

$$\text{SkillsEndPrimEdu}_i = a + b \text{AgeStartPrimEdu}_i + dZ_i + \eta_i$$

- $Z_i$  child characteristics that can be observed by kindergarten teachers
- Will keep average of  $\text{AgeStartPrimEdu}_i$  constant in counterfactual analysis
- Model therefore captures both maturity effects and relative age effects

$$\text{SkillsEndPrimEdu}_i = a + b(6 + D_i^7 + f - x_i) + dZ_i + \eta_i$$

# Primary education enrollment policies: implied variances

- $D_i^7 = D^7(x_i, Z_i)$
- $\text{Variance}(\text{AgeStartPrimaryEducation}_i | Z_i, x_i)$
- $\text{Variance}(\text{SkillsEndPrimaryEducation}_i | Z_i, x_i)$

# Primary education enrollment policies

- Minimize variance in **age at start** of primary education  
→ Enroll by date of birth only (primary education enrollment in calendar year turn 7 iff birthday after some cutoff day)
- Minimize variance in **skills at end** of primary education  
→ Enroll calendar in year turn 7 iff skill assessment below a threshold that is independent of birth date

Which type of skill assessment?

→ Expected skills given  $Z_i$  and  $x_i$  at end of primary education if child was enrolled in primary education in calendar year turn 6

# Kindergarten skills assessments (latent variable) at start of school year in calendar year children turn 6

*KindergartenSkills<sub>i</sub>*; assessment not observed by us

$$\begin{aligned} \text{KindergartenSkills}_i &= \mathbb{E}(\text{KindergartenSkills}_i \mid \text{Age}_i, W_i) + u_i \\ &= \alpha + \beta \text{Age}_i + \gamma W_i + u_i \\ &= \alpha + \beta \text{Age}_i + \gamma W_i + \sigma v_i \end{aligned}$$

→  $v$  assumed standard normal conditional on  $\text{Age}$  and  $W$

# Which children are enrolled in primary education in calendar year turn 7?

$$\text{KindergartenSkills}_i < \text{MinSkills}[\text{Birthday}_i] - \text{ParentInfluence}_i$$

$$\alpha + \beta(6 + f - x_i) + \gamma W_i + \sigma v_i < \text{MinSkills}[x_i] - \pi W_i$$

# Skills at the end of primary education

$$\text{SkillsEndPrimEdu}_i = a + b \text{AgeStartPrimEdu}_i + dZ_i + \eta_i$$

→  $Z_i$  characteristics that may enter kindergarten skills assessments

→  $Z_i$  not observable to us, but  $W_i$  (e.g. parental education/income) is

$$Z_i = \mathbb{E}(Z_i|W_i) + \mu_i = eW_i + \mu_i$$

→ assume  $\mu$  normally distributed

→  $\mu$  and unobservable part of skills assessment  $v$  can be correlated

→ write  $\mu$  as  $\rho v + \epsilon$  with  $\epsilon$  normal and independent of  $v$

$$\text{TestEndPrimEdu}_i = a + b \text{AgeStartPrimEdu}_i + cW_i + d\mu_i + \eta_i$$

$$\text{TestEndPrimEdu}_i = a + b \text{AgeStartPrimEdu}_i + cW_i + \phi v_i + d\epsilon_i + \eta_i$$

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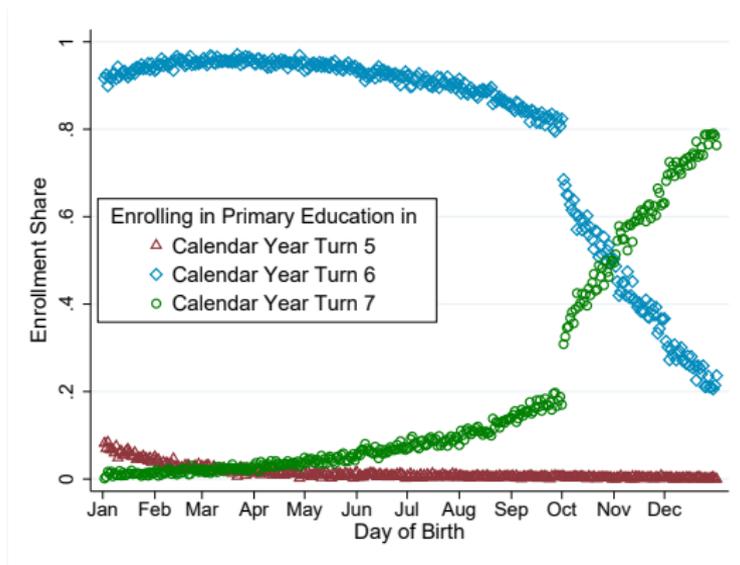
# Estimation of ordered probit for enrollment in calendar year children turn 5, 6, or 7: specifying $MinSkills[x_i]$ (1 of 3)

$$KindergartenSkills_i < MinSkills[Birthday_i] - ParentInfluence_i$$

$$\alpha + \beta(6 + f - x_i) + \gamma W_i + \sigma v_i < MinSkills[x_i] - \pi W_i$$

$$\alpha + \beta(6 + f - x_i) + (\gamma W_i + \pi) + \sigma v_i < MinSkills[x_i]$$

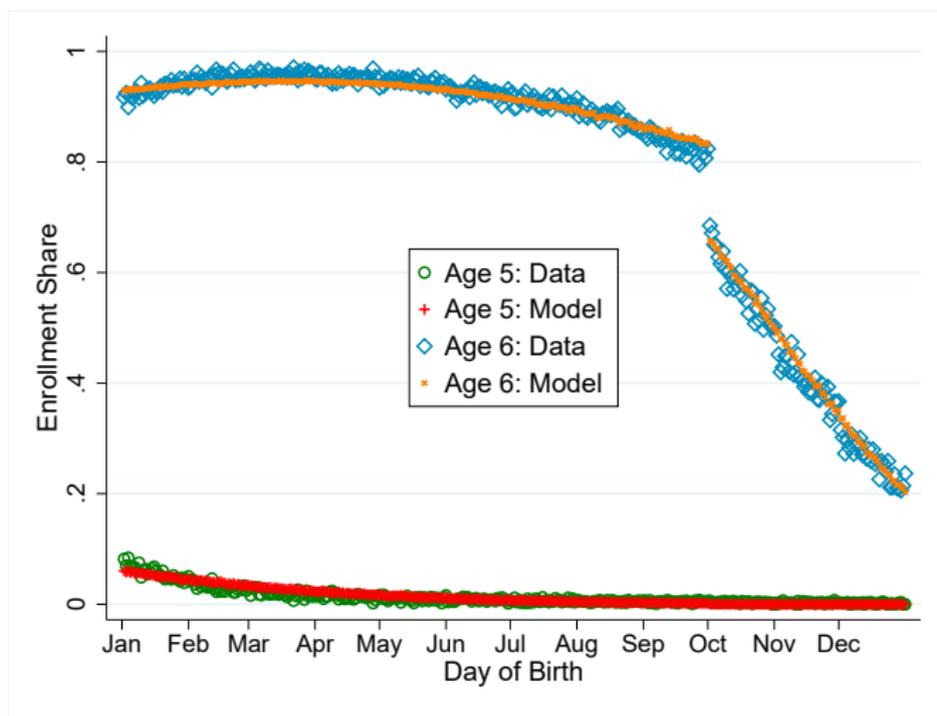
# Estimation of ordered probit for enrollment in calendar year children turn 5, 6, or 7: specifying $MinSkills[x_i]$ (2 of 3)



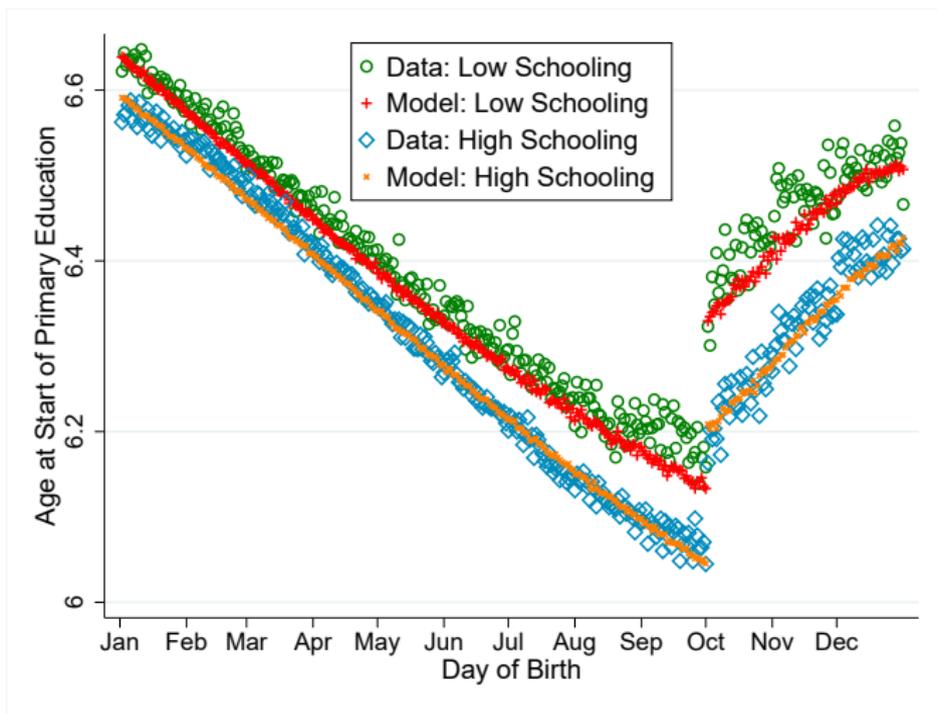
## Estimation of ordered probit for enrollment in calendar year children turn 5, 6, or 7: specifying $MinSkills[x_i]$ (3 of 3)

- $MinSkills$  for enrollment age 5, 6, 7 independent of birthday ( $x$ ) for children born before 1 October
- Discrete jump up in  $MinSkills$  at  $x = 1$  October
- Allow for linear profile of  $MinSkills$  in  $x$  after 1 October
- Another discrete jump up in  $MinSkills$  at  $x = 1$  January

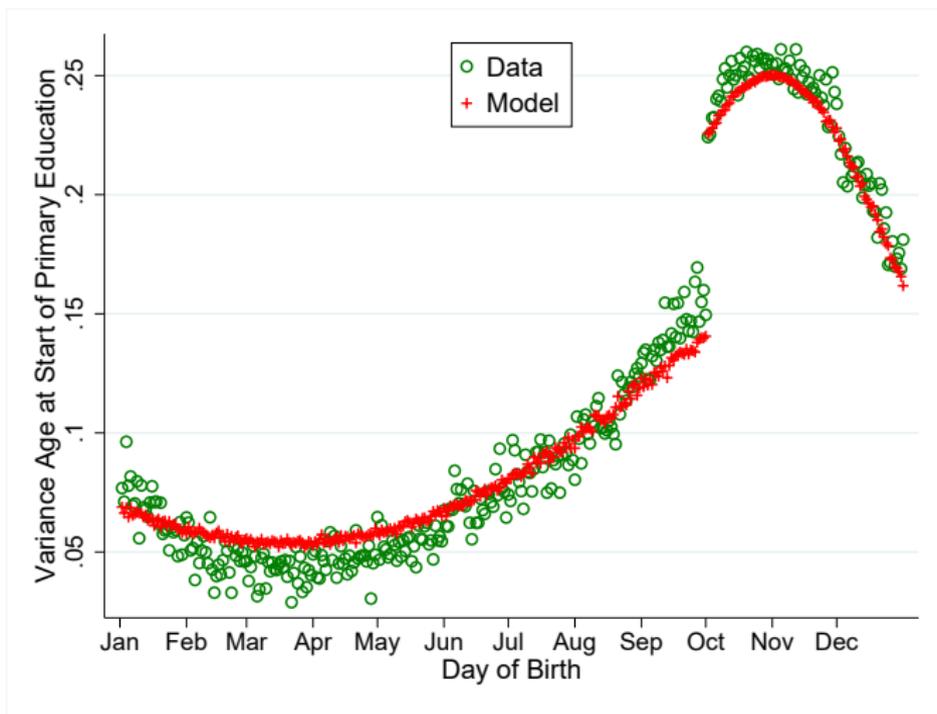
# Ordered probit for enrollment in calendar year children turn 5, 6, or 7: fit enrollment year



# Probit for enrollment in year: fit age at the start primary education; high vs low maternal schooling



# Probit for enrollment in year: fit variance of age at the start primary education



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# Calibration: model equations

$$v \sim N(0, 1)$$

$$AgeStartPrimEdu_i = 6 + \hat{D}^7(W_i, v_i) - \hat{D}^5(W_i, v_i) + f - x_i$$

$$TestEndPrimEdu_i = a + b AgeStartPrimEdu_i + cW_i + \phi v_i + d\epsilon_i + \eta_i$$

$$\mathbb{E}(TestEndPrimEdu_i | W_i, x_i, v_i) = \hat{a} + \hat{b} AgeStartPrimEdu_i + \hat{c}W_i + \hat{\phi}v_i$$

## Targeted moments

- (1 & 2) the test scores for children with family income below/above the median
- (3 & 4) the average test scores for children with family income above the median
- (5) the difference in the average test scores between children enrolling in primary education in the calendar year they turn 7 years old and children enrolling in the calendar year they turn 5 or 6

# Calibration results

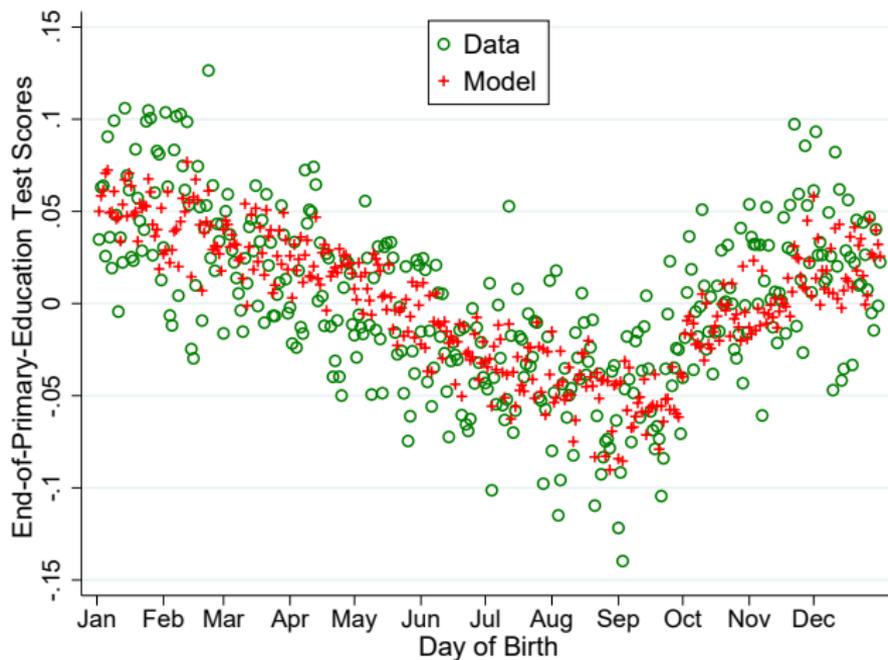
Table 1: Test score end of primary education

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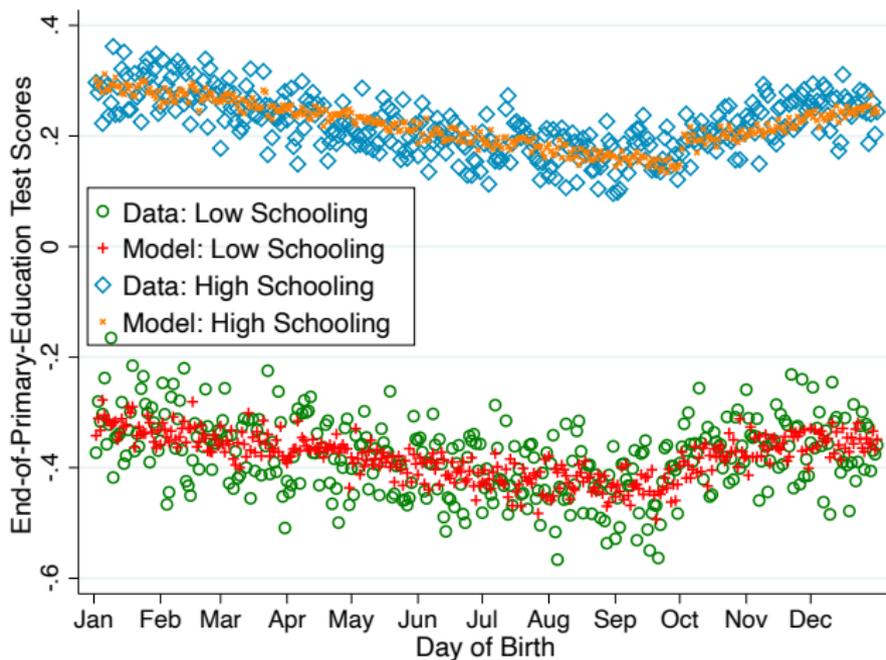
Age start primary education	0.281
Maternal schooling	0.0943
Family income	0.2878
$v$	0.3153

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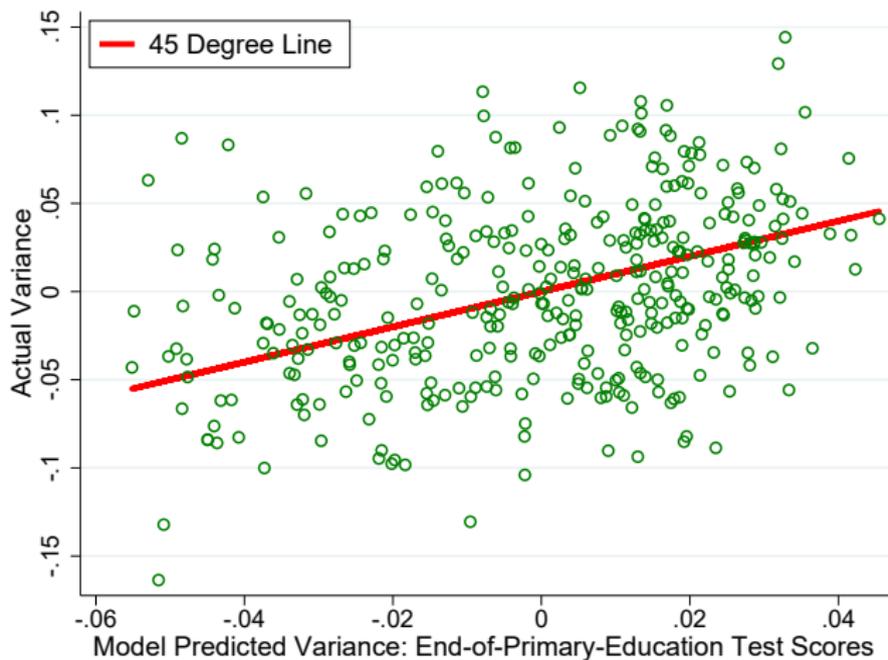
## Skills end of primary education: fit



# Skills end of primary education: fit; high vs low maternal schooling



# Skills end of primary education: fit variance



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# Identifying assumption

$$\begin{aligned}
 KindergartenSkills_i &= \mathbb{E}(KindergartenSkills_i \mid Age_i, W_i) + u_i \\
 &= \alpha + \beta Age_i + \gamma W_i + u_i \\
 &= \alpha + \beta Age_i + \gamma W_i + \sigma v_i
 \end{aligned}$$

$$Age_i = 6 + f - x_i$$

$$\implies \mathbb{E}(v_i | x_i) = 0$$

$$\implies \mathbb{E}(v_i | \mathbb{E}[AgeStartPrimEdu | x_i]) = 0$$

## IV estimation of effect of age at the start of primary education: using variation across birthdays only

$$\begin{aligned} \text{TestEndPrimEdu}_i &= a + b \text{AgeStartPrimEdu}_i + d W_i \\ &\quad + \phi v_i + d \epsilon_i + \eta_i \end{aligned}$$

Instrument for  $\text{AgeStartPrimEdu}_i \rightarrow \mathbb{E}[\text{AgeStartPrimEdu}_i \mid x_i]$ .

## IV estimation compared with calibration results

Table 2: Test score end of primary education

	Calibration	IV estimation	OLS
Age start (primary education)	0.281	0.268*** (0.0113)	-0.235*** (0.00467)
Maternal schooling	0.0943	0.0696*** (0.00140)	0.0646*** (0.000585)
Family income	0.2878	0.289*** (0.00496)	0.272*** (0.00286)
$v$	0.3153		
Observations	340,185	340,185	340,185
School fixed effects		Yes	Yes

## More sophisticated IV approach

Define  $Z_i = 5, 6, 7$  depending on calendar year of enrollment and

$$\tau_i = v_i - \mathbb{E}[v \mid x_i, W_i, Z_i].$$

$$\implies \mathbb{E}(\tau_i | x_i, W_i, Z_i) = 0$$

$$\implies \mathbb{E}(\tau_i | \mathbb{E}[\text{AgeStartPrimEdu} | x_i, W_i, Z_i]) = 0$$

$$\begin{aligned} \text{TestEndPrimEdu}_i &= a + b \text{AgeStartPrimEdu}_i + d W_i \\ &\quad + \phi \mathbb{E}[v \mid x_i, W_i, Z_i] + \phi \tau_i + d \epsilon_i + \eta_i. \end{aligned}$$

Instrument for  $\text{AgeStartPrimEdu}_i \rightarrow \mathbb{E}[\text{AgeStartPrimEdu}_i \mid x_i, W_i, Z_i]$ .

## IV estimation compared with calibration results

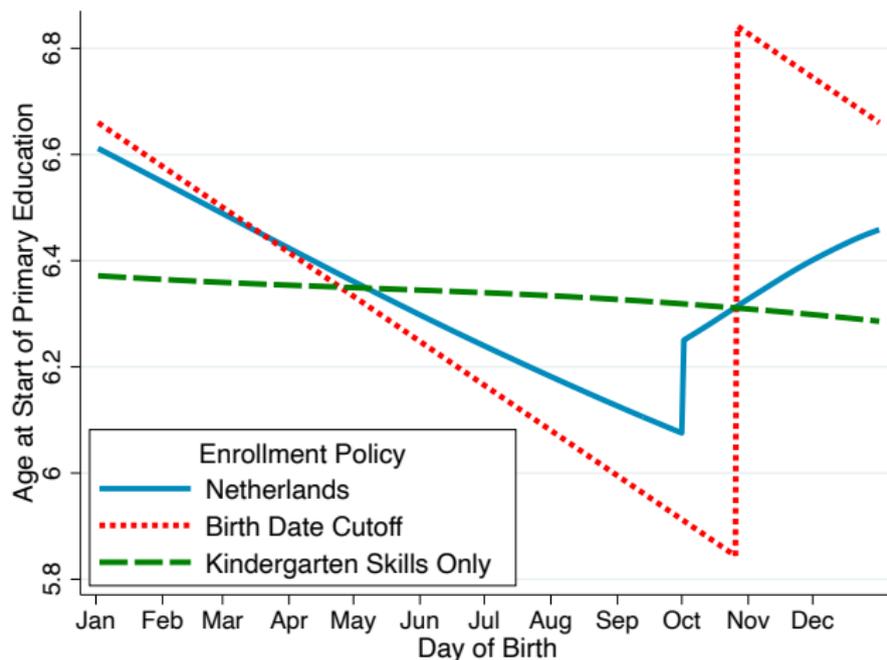
Table 3: Test score end of primary education

	Calibration	IV estimation	
Age start primary education	0.281	0.268*** (0.0113)	0.271*** (0.0111)
Maternal schooling	0.0943	0.0696*** (0.00140)	0.0702*** (0.000591)
Family income	0.2878	0.289*** (0.00496)	0.291*** (0.00287)
Other predetermined ( $\nu$ )	0.3153		0.329*** (0.00646)

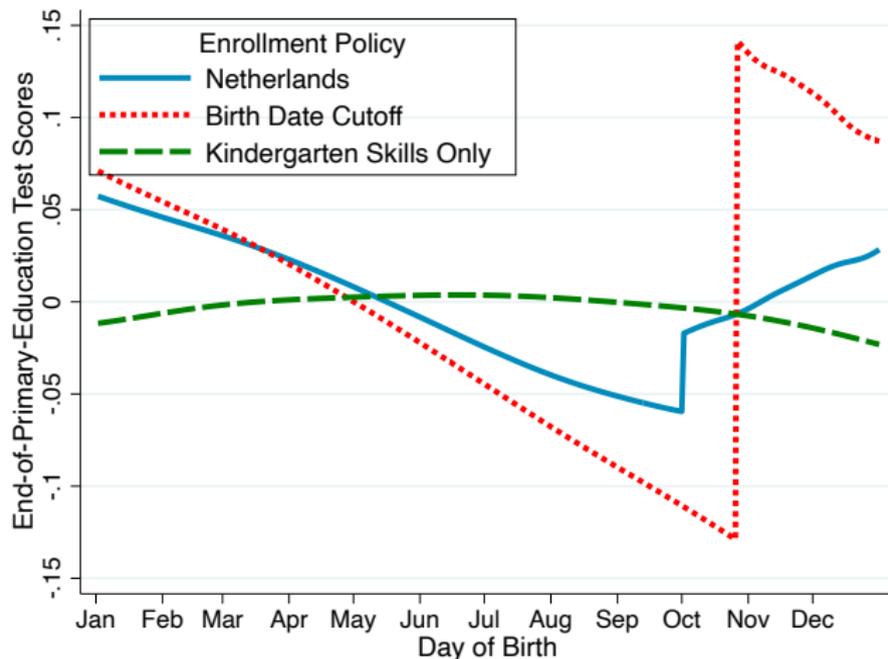
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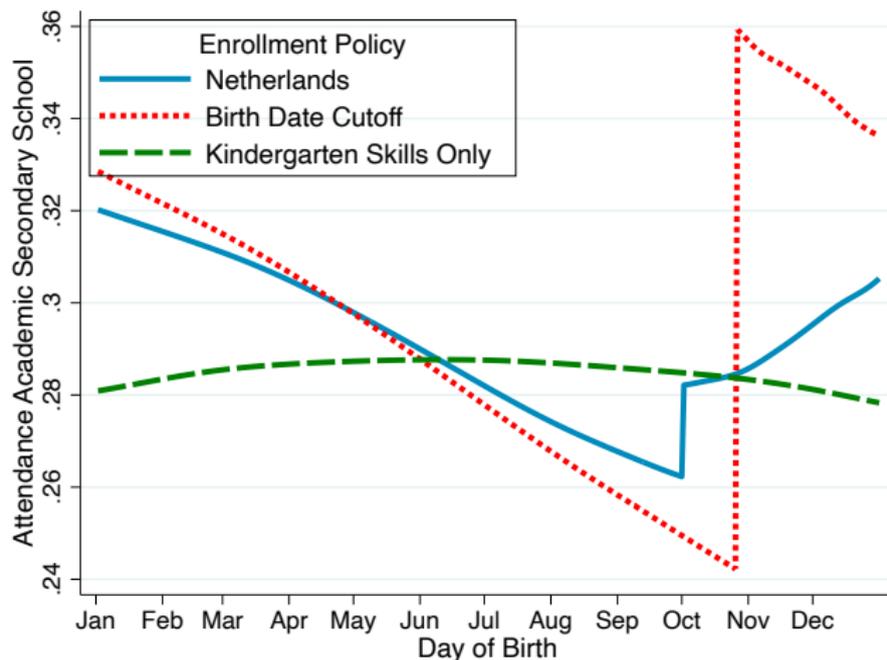
# Alternative enrollment policies: age at the start of primary education



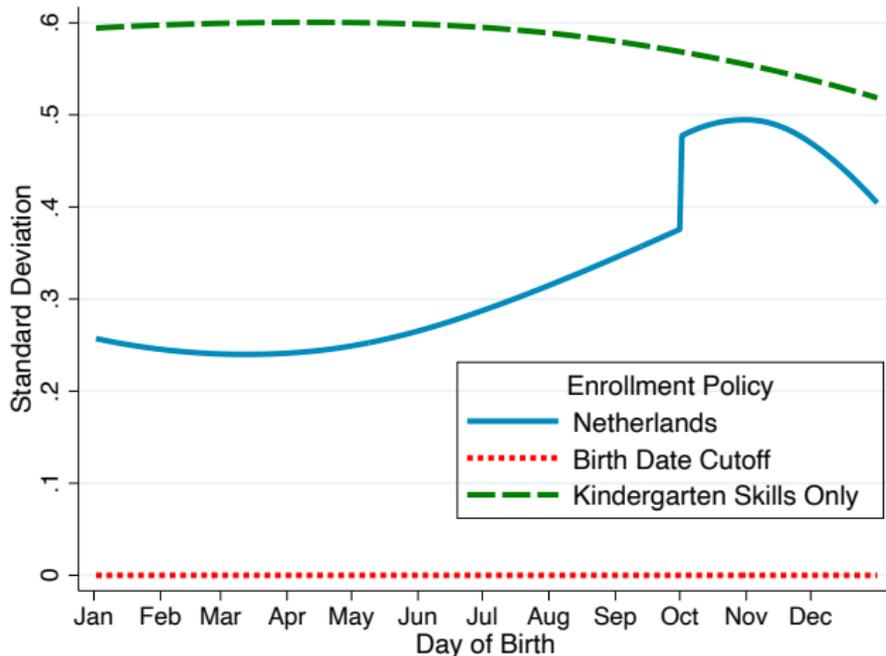
# Alternative enrollment policies: test performance at the end of primary education



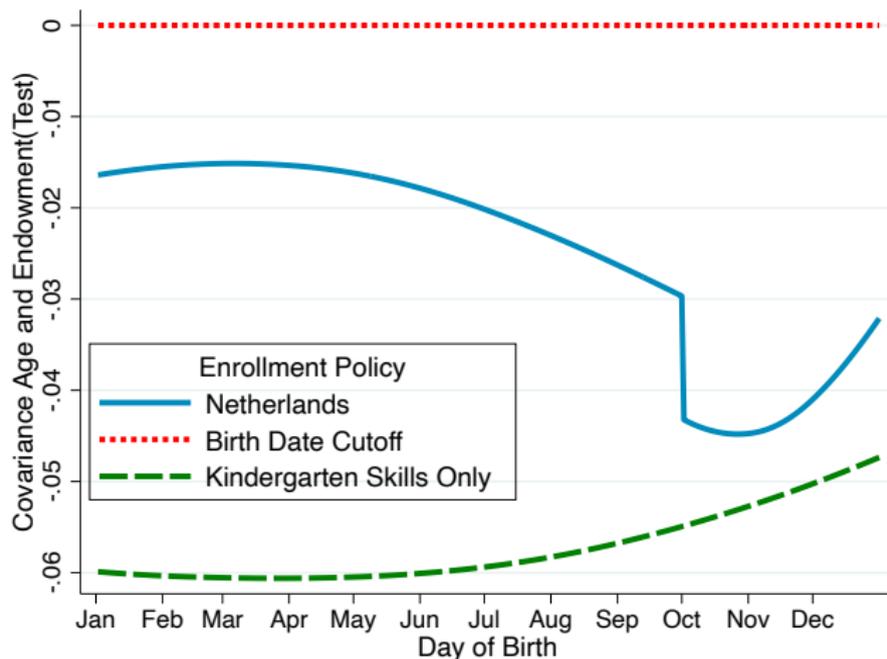
# Alternative enrollment policies: share attending most academic secondary education



# Alternative enrollment policies: standard deviation of age at the start of primary education



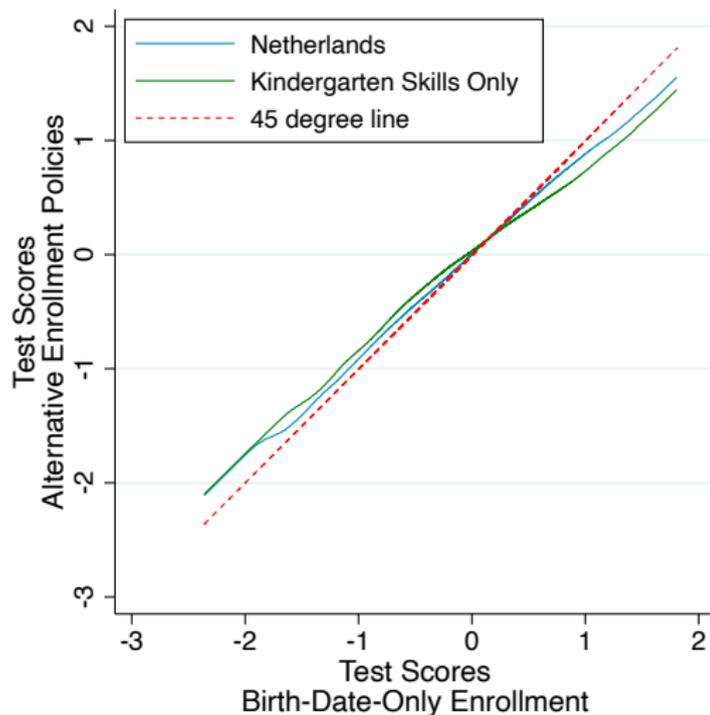
# Alternative enrollment policies: standard deviation of test performance at the end of primary education



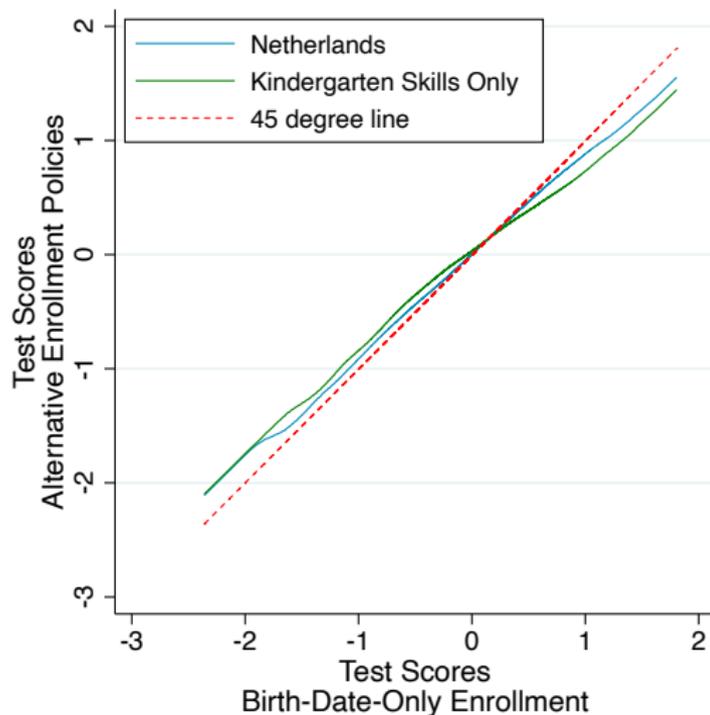
# Standard deviation of outcomes by enrollment rule

	Enrollment policies		
	Birth date	Netherlands	Skills assessments
Age at start of primary education	0.29	0.37	0.59
Test performance end of primary education	0.54	0.5	0.45

# Expectation test performance conditional on birth-date-enrollment test performance, given $W$ and $x$



# Expectation test performance conditional on birth-date-enrollment test performance, given W only



# Conclusion

- Dutch system of enrollment in primary education is improvement over enrollment based on birth dates
- Effects are clear and consistent with findings elsewhere
- Should be taken into account that improvements come solely from reallocating “extra” year in kindergarten education across children
- Putting even more weight on kindergarten skills assessments would improve things further