

# Policy Evaluation and Incomplete Information: Empirical Evidence from Unemployed Job Seekers©

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Preliminary

## *Abstract:*

Standard empirical policy evaluations usually assume that the affected individuals are perfectly informed about policy rules (like eligibility conditions, benefit levels, tax rules etc.) and their implementation. In practice, however, uncertainties about the specifics may be common – due to missing effort by policy makers or individuals to spread or to collect the relevant information. This study provides quasi-experimental large-scale evidence on the role of information in shaping the treatment effects of social policy rules. To assess these impacts we exploit a recent reform in Switzerland on unemployment insurance benefit rules which generated treatment groups who were exposed to different situations of incomplete information. As a reference case -- in which individuals are fully informed about the specific rules – we evaluate the effect of a cut of potential benefit duration (PBD) from 400 days to 200 days for job seekers below age 25. We compare these reference results with two cases in which job seekers were confronted with exactly the same size of treatment but initially were not fully informed about the change. In one case they face an update of the expected PBD from 200 to 400, in the other case the opposite. Perfect anticipation would imply that treatment effects in these two cases do not differ from the ones recovered from the reference case. Preliminary results suggest that they do. The differences are consistent with patterns of loss aversion or of consumption commitment behavior.

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# 1. Introduction

Social policy transfer schemes – like social security, welfare, unemployment or health insurance, EITC, other tax schemes,... – often involve plenty of detail rules which crucially determine the net financial entitlements and implied incentives of these policies. Standard evaluations of such policy schemes usually assume, implicitly or explicitly, that the affected individuals are comprehensively informed about the relevant entitlement rules<sup>1</sup>. In practice, however, this assumption may not hold in numerous situations or for relevant subgroups. Often it may be realistic to assume that affected people are aware of the general rules of the policy, but not of the relevant implementation details or the net impact of combinations of rules. Acquiring the relevant detail knowledge may involve additional effort investment. This option that individuals are incompletely informed or do not entirely understand the rules in such situations is usually ignored in the empirical literature. This paper assesses such situations; it aims at providing empirical evidence on how policy treatment effects differ in cases of varying information exposure.

Information and expectation play essential roles when individuals make decisions facing certain changes in the economic environment that will potentially affect their future economic outcomes. The literature provides different examples of the relevance of information and knowledge in the context of various types of public policies. Chetty, Friedman and Saez (2013) shows that knowledge about policy rules (EITC is the policy subject in their paper) is an important key factor when individuals make optimal decisions and take advantage of the policy in the ways that they are aware of. In particular, they use variation of the degree of “sharp bunching” by self-employed individuals at the first kink across areas with different ZIP codes to identify a “causal” impact of EITC on earnings. Their findings show that the “diffusion of knowledge” about EITC is a crucial mechanism through which a previously under-documented if not ignored “intensive margin” effect is identified. Their empirical results provide additional insights on the role of information played in policy evaluation. Ignoring asymmetric information or incomplete information (from the perspective of targeted groups) about intended changes in policy rules would bias the measured effects of such policy rules. An earlier research that addresses similar points is Alm (1988). He shows that greater uncertainty about income tax policies in the U.S. in the 1960s and 1970s generate behavioral changes among rational individuals. Risk in tax policies may generate less optimal decisions as well as loss of welfare in the absent of symmetric information.<sup>2</sup> He mentions as well the option that policy uncertainty could be used strategically by policy makers.

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<sup>1</sup> Or, alternatively, they do not take into account various degrees of information about the policy and thus estimate average effects which incorporate treatment effects of incomplete information.

<sup>2</sup> Other studies include Blundell, Francesconi, and van der Klaauw (2011) on announcement of reforms in in-work benefits and its impacts on female labor supply; Luttmer and Samwick (2012) on welfare costs and uncertainty in policy; Giavazzi and McMahon (2012) on policy uncertainty and household savings and labor supply.

Thus, the literature has shown that information about policy rules is an important factor to consider for both academics and policy makers. It has yet missing empirical evidences that are based on large scale administrative data, and a “clean” exogenous policy shock. Our paper intends to fill this gap.

In this paper, we empirically analyze the role of information in the context of unemployment insurance. We assess how potential unemployment benefit duration (PBD) changes impact on job seekers’ dependence on UI and their exiting behaviors. Thereby we focus on individuals who have limited information about the changes in UI benefit rules, and see whether and how information and uncertainty about future policy changes affect their behaviors. Access to both large scale administrative unemployment data set and a clean natural experiment that generates a substantial PBD cut for young job seekers allows us to identify the causal impact of changes in policy rules on various groups of targeted individuals with different information exposure about the policy rules. We show that facing uncertainty about future UI benefit rules, individuals behave differently in their (non-)employment decisions.

The change and implementation of UI benefit rules in the Swiss case provides clean natural experiments in which younger job seekers are confronted with exactly the same size of treatment effects (a PBD change by 200 days) but are exposed to different degrees of available information. Different patterns of reactions on cutting PBD are documented among three treatment groups. These groups are all potentially affected by a PBD change of the same size. The first group we consider, our reference group, is directly informed about the eligibility rules that apply to them right at the beginning of the unemployment spell. For this group, there is no uncertainty about the PBD they are confronted with. The second group, more interestingly, is initially uncertain about the specific rules applied to them since the implementation of a PBD cut arrives during their unemployment spell. Thirdly, we consider another interesting policy targeted group of individuals who have limited information about changes in eligibility status: in this case they are confronted with a potential increase of PBD during their unemployment. The latter case is even even independent of the timing of the policy reform. The comparison of the treatment effects among the three groups reveals that information and uncertainty about changes in eligibility rules generate different behavioral responses. And these responses depend also on the nature of the expected outcomes i.e. potential decrease/increase in UI benefit durations.

After recovering the differences in the reactions among different treatment groups, we try to provide potential channels/mechanisms through which one can interpret these results. These channels relate to the literature of loss aversion (Tversky and Kahneman 1991; Yechiam and Telpaz 2013), where the general conclusion is that, facing uncertainty in the future, people dislike losses more than they like gains. Other channels that could also explain our results are related to the literature on endowment effects proposed by Kahneman, Knetsch, and Thaler (1990). Finally, the consumption commitment phenomena discussed in Chetty (2003) could also intuitively explain our results.

The case of PBD change that we consider here to assess the role of information is related to a broad empirical policy evaluation literature. Evaluation of unemployment insurance programs has become popular in the past decades because such programs are most commonly used policy tools to help job losers with their economic hardship while searching for new employments. Unemployment insurance benefit level and unemployment insurance benefit eligible period are key parameters to consider when it comes to evaluate the impact of UI policy changes. Theoretical background on the impacts of potential UI benefit period on duration of unemployment and search outcomes originated from two streams of methodologies. Mortensen (1977) formulates a dynamic job search model incorporating the potential unemployment benefit duration. The model predicts that increasing potential benefit duration increases the value of being unemployed so that eligible unemployed individuals would stay longer in unemployment.<sup>3</sup> Moffit and Nicholson (1982) provide an alternative approach to theoretically incorporate potential benefit duration. They set up a labor-leisure model, where unemployed individuals have preferences over income and unemployment. Unemployment is attractive because of the leisure involved in it<sup>4</sup>. They show that increases in the level and length of the UI benefit generate both income and substitution effects that are the forces to increase average duration of unemployment. Both of theoretical backgrounds offer disincentive effects of prolonged potential UI benefit durations on job search outcomes, mainly employment outcomes. Job seekers stay longer in unemployment and claim unemployment benefit longer if they can.

There is also a rich literature of empirical studies on potential benefit duration and its impact on unemployment spells or job search outcomes. For example, a short list of studies on the impacts of extending potential benefit duration include Katz and Meyer (1990), Card and Levine (2000), Lalive (2008), and Schmieder, von Wachter and Bender (2012). In general, their results show that a longer potential benefit period creates longer UI benefit dependence and hence longer unemployment spells. Moral hazard is usually the main behavioral explanation behind these results. On the other hand, Van Ours and Vodopivec (2006), provide empirical evidence on shortening the potential unemployment benefit duration using a natural experiment in Slovenia. They find that a decrease in potential benefit period results in higher exit rate of unemployment and shorter unemployment spell.

However, the above mentioned literature on evaluation of UI potential benefit duration changes all assume that information about UI benefit rules are complete and commonly shared between the policy maker and target groups. Individuals are assumed to have perfect foresight.

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<sup>3</sup>On the other hand, increasing potential benefit duration also generates incentives for those unemployed who are not eligible for UI benefit to leave unemployment, because the value of employment is higher, since the unemployment benefit value that comes with the risk of “laid off” in the future is higher due to longer benefit coverage.

<sup>4</sup> Upon entering unemployment, individual chooses optimally income and duration of unemployment subject to a convex budget constraint. The budget constraints are separated into three sections, indicating leaving unemployment before the eligible benefit period is exhausted, leaving unemployment right at the exhaustion period, or to leave unemployment after the eligible benefit period.

Incomplete information and uncertainty about potential policy changes are usually ignored or not modeled, especially among existing empirical studies on the evaluation of labor market policies.

We believe that our paper contributes to the literature on policy evaluations using natural experiments, by incorporating explicitly the “fuzzy” cases, where individuals are not fully informed about the policy change. The behavior of these relevant subgroups help us learn about how individual change their response to policy incentives if they are exposed to incomplete information setups. This is important from implementation of public policy point of view, since, we show that incomplete information about policy parameters will have different behavioral responses that are usually not taken into account by the policy maker. The way how information is spread and managed in public policy schemes can potentially reduce, improve or destroy planned policy effects.

The structure of the rest of paper is the following: section 2 provides institutional background of the Swiss unemployment insurance system and the specific policy change and implementation that is utilized in this paper; section 3 describes the data; section 4 presents the empirical model; section 5 provides results and some discussions; finally section 5 concludes the paper.

## **2. Institutional Background and the PBD Reform**

In order to assess the impact of varying exposure to (incomplete) information, we exploit a natural experiment within Swiss unemployment insurance which has generated several comparable treatment groups that differ with respect to available information.

The Swiss unemployment insurance (UI) system is quite typical in its policy design and well comparable to other UI systems within OECD. The potential duration of unemployment benefits (PBD) for prime aged individuals who fully contributed (18 out of the last 24 months) is 400 days. Job seekers who contributed less in the pre-unemployment period (12 out of the last 24 months) are eligible for 260 days. From age 55 on, benefits are extended by additional 120 days. The reform that we exploit here and will discuss below introduced an additional threshold of PBD change at age 25. The replacement ratio is 80%; and 70 % for job seekers whose insured earnings would correspond to a daily benefit payment of more than 140 CHF<sup>5</sup> and who are not caring for children. After the end of the entitlement period the unemployed have to rely on social assistance. Social assistance is means tested and replaces roughly 76% of unemployment benefits for a single job seeker with no other sources of earnings (OECD, 1999).

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<sup>5</sup> 1 Swiss Franc (CHF) = 1.07 USD = 0.96 EUR

The second key eligibility criteria, besides sufficient contributions, is that a job seeker must be “employable”. I.e., job seekers must possess the capability to fulfill the requirements of a regular job. If an individual is found not to be employable there is the possibility to collect social assistance. Upon registration at the Public Employment Service (PES) office, the job seeker is subject to further obligations: he needs to attend regular meetings with the caseworker (usually monthly); fulfill individually specified job search requirements (usually 6 to 12 applications per month, see Arni et al., 2015); attend regularly programs of active labor market policy (job search assistance, training, workfare programs); follow up on referrals that the caseworker provides him. The Swiss UI system is above OECD average in terms of monitoring intensity (Venn, 2012). In particular benefit sanctions – temporary benefit cuts of usually 5 to 10 days – are regularly used and can be imposed in case of observed non-compliance with one of the mentioned obligations. Empirical studies (Lalive et al., 2005, Arni et al., 2013) show that the effect of monitoring strictness and sanctions on unemployment duration and earnings is substantial in the Swiss case.

The UI system features four organizational layers. At the national level, the UI law defines all the mentioned eligibility rules, obligations and means of support. The Swiss system is characterized by a substantial amount of federalist leeway in the implementation of the common rules. The second layer is constituted by the Cantons which are responsible for the organization of the agencies of the UI funds as well as of the PES agencies. About 160 PES offices feature the third level of the system; they are responsible for registering, supporting and monitoring the unemployed job seekers. Finally, about 2500 caseworkers build the personal backbone of the PES offices and execute tasks of job search assistance, monitoring of the requirements and acquisition of job vacancies among local employers.

In the context of this study it is important to note that there is a clear organizational separation between the tasks of support and monitoring – fulfilled by caseworkers and PES – and the tasks of benefit payments and eligibility checks. The latter are performed by the agencies of the UI funds which are also locally separate from the PES. Their databases are, however, connected. As a consequence of this separation, information exchange concerning monthly benefit payments and eligibility issues are handled by the UI funds (usually via monthly letters like payment statements etc.). Thus, caseworkers are not responsible to inform job seekers about their eligibility status with respect to PBD. In fact, they are not allowed to provide legally binding information on eligibility status (updates), this is in the sole responsibility of the UI funds.

The PBD changes we exploit as natural experiments originate in a reform of the Swiss UI law that has been implemented in April 2011. The reform introduced an additional age threshold in the benefit eligibility scheme at age 25<sup>6</sup>. Since April 2011, fully eligible<sup>7</sup> individuals below that

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<sup>6</sup> Note that there have been other smaller policy changes introduced within the UI reform 2011, in particular a slight increase in strictness of the sanctioning rules as well as a larger definition of „suitable“ jobs that a job seeker

age (at registration) were subject to only 200 days of potential benefit duration, whereas job seekers above age 25 keep the right to collect 400 days of benefits. This reduction applies only to persons without children to care for. The background and political aim of the UI reform was the reduction of expenses (and increase of the contributions) in order to balance out the funding of the UI funds in the longer run.

We will exploit the information variation and policy uncertainty that has been generated through the implementation of the new rules, in particular two sources of incomplete information (which correspond to the two cases discussed in section 4). First source is the rule that the PBD eligibility status is updated *within* ongoing unemployment spells. This means in our context that job seekers who enter unemployment slightly (max. 9 months) before their 25<sup>th</sup> birthday will first be subject to 200 days of PBD and then will be upgraded to 400 days of PBD *at* their 25<sup>th</sup> birthday. This particularity is, however, not common knowledge and job seekers would only find out about it in advance if they would actively inquire at the UI funds<sup>8</sup>. Otherwise, the UI funds will only communicate the update of their eligibility status to 400 days of PBD within the mentioned regular mail exchange (monthly payment statements) from the date of 25<sup>th</sup> birthday onwards.

The second source that introduced policy uncertainty is the implementation of the reform. Due to a referendum there has been a public vote on the UI reform by end of September 2010. For this vote, information about the intended adaptations of the general PBD eligibilities has been spread by the usual official information bulletin (Schweizerische Eidgenossenschaft 2010). The details of the implementation – and even the implementation date – were, however, not yet defined and known. Because of this late referendum, implementation rules and their internal communication (to the UI funds and the PES) have been realized very late<sup>9</sup>. Finally, the implementation date has been fixed to be the first of April 2011<sup>10</sup>, and the government decided

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is required to accept in order to avoid sanctions. Note that both of these changes apply generally (the first to everybody, the second to people below age 30), such that they are cancelled out by the natural experiment and the use of diff-in-diff estimation.

<sup>7</sup> Full eligibility means in this context that individuals must have contributed to unemployment insurance taxes at least during 18 out of the last 24 months before unemployment registration. If they contributed less – at least 12 out of the past 24 months – they become eligible for 260 days of benefits (below and above age 25). We do not consider this case in the empirical analysis and sample on fully eligible job seekers.

<sup>8</sup> Note that the general PBD eligibilities by age are communicated in the compulsory introductory information event 1 to 2 weeks after unemployment registration (and in the brochure that is handed out). The special case of updating *within* the spell is, however, not mentioned. Moreover, even the caseworkers may not be aware of this special case because it is only mentioned in one sub-paragraph of the implementation directive (see SECO 2011, paragraph 2a, page 20, related to Art. 27, Abs. 2,4,5 and 5bis of the Swiss UI law (AVIV)) that has been distributed by the Swiss State Secretariat of Economic Affairs (SECO) in 2011. Moreover, caseworkers are not responsible and not allowed to provide legally binding information on individual eligibility status to the job seeker, as mentioned above.

<sup>9</sup> The implementation directive (SECO 2011) has been sent to the Cantonal UI funds and to the PES in February 2011.

<sup>10</sup> The original plan was to implement the reform in January 2011, which was not possible any more due to the late referendum. Note that in Switzerland political opponents of a law can collect 50'000 signatures to urge a referendum.

that the revised eligibility rules were applied immediately to *ongoing* spells. This timing and the immediate implementation created therefore a situation of incomplete information in the months before the reform where the general elements of the reform were known but not the timing of the implementation and to whom they exactly applied.

### 3. Data, Sampling and Descriptives

For this study we use very rich individual data directly from the Swiss Unemployment Insurance Register (UIR). We have access to the individual data of 100% of the population of registered unemployed. They cover all the usual socio-demographic information (age, gender, civil state, nationality, characteristics of the last job, education, mother tongue, foreign language skills, household size, insured earnings, eligibility state and conditions). The spell information (entry, exit) and all the labor market policy and sanction events are registered in daily precision. Based on this, we construct variables on the unemployment history in the 3 years before the current spell (incidence and duration of the spells), as additional controls. Moreover, the data feature fine-grained aggregation information: identifiers of each job seekers' Canton and municipality of residence as well as the PES agency (and caseworker) she is assigned to. We use PES fixed effects as control variables that take into account differences in economic and cultural conditions as well as in PES-level policies. These fixed effects cover small regional entities: Switzerland is decomposed in about 160 PES regions.

To exploit the quasi-experiment of a PBD change by 200 days, we will thus focus on the fully eligible young job seekers around the age of 25 without children (which is the large majority<sup>11</sup>). Sampling on full eligibility, no children, an age window from 22.25 to 27 and three unemployment inflow windows between April 1<sup>st</sup>, 2009, and April 1<sup>st</sup>, 2013, leaves us with a gross estimation sample of 53'705 unemployment spells (37'119 individuals). The details on the age and inflow samplings for the specific treatment and control groups within our (diff-in-diff) analysis will be reported in section 4. The end of the observation window for the spells is August 31<sup>st</sup>, 2014.

[Figure 1 around here]

The left panel of Figure 1 reports the distribution of the realized durations of registered unemployment for the gross estimation sample (censored after two years). The median unemployment duration for this sample of young job seekers is 133 days. The figure shows the typical shape of unemployment exit behavior: unemployment exit rates are clearly highest in the first four to six months. In the period of interest, 2009 to 2014, the labor market conditions

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<sup>11</sup> Within the chosen inflow and age windows which generate our gross estimation sample, the group of fully eligible individuals without children represents 69% of the registered job seeker population.



in Switzerland have been quite stable. The yearly median unemployment durations for the sample vary between 121 and 155 days<sup>12</sup>. Note that we will censor all the individual unemployment spell durations after one year. This is due to the fact that we consider the PBD of 200 days as a treatment. These benefit days are working days which translate into a calendar duration of about 11 months. Thus, considering durations after that point becomes meaningless since the treatment group has left the register by default<sup>13</sup>. The right panel of Figure 1 shows the Kaplan-Meier survivor function for our gross sample. After 12 weeks of unemployment, 30% of the sample population has left the register (for jobs or without job), after 40 weeks a bit less than 25% of the job seekers are still unemployed.

[Table 1 around here]

Table 1 reports a selection of important socio-demographic characteristics of the estimation sample (aged 22.25 to 27 at unemployment entry). 46% of the sample is female job seekers. The highest education of two thirds of these young job seekers is at the secondary level; the vast majority possesses a vocational degree (apprenticeship of three to four years). One third of the registered unemployed in this age window are foreign born. 75% of the sample report a national language (German, French, Italian) as their mother tongue. 79% of the individuals live in urban or sub-urban municipalities. Lower skilled occupations dominate the pool of unemployed. On average, the insured monthly earnings (gross earnings subject to social security) amount to about 4000 CHF within the sample. 54% of the job seekers in the sample did not experience any unemployment in the past 3 years; this explains why the reported mean duration of unemployment experience is relatively low. Note that we use is the full population of registered job seekers (within the mentioned sampling frame), thus there is no issue of selectivity that could harm external validity.

## 4. Empirical framework

The Swiss unemployment insurance PBD reform was implemented on April 1<sup>st</sup> of 2011. The reform affected only people who are below age of 25 at the time of unemployment registration, and their eligible benefit duration is cut by half from 400 days to 200 days. Such a dramatic cut

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<sup>12</sup> The official unemployment rate (published by the Swiss State Secretariat for Economic Affairs SECO) for individuals between age 20 and 30 was around 4% in these years.

<sup>13</sup> Note that the difference between 200 days (9 months) of PBD and 11 months of „real“ duration is explained by weekends, public holidays, „benefit holidays“, possible periods of sickness etc. Note as well that there are minor quantities of individuals subject to 200 days of PBD who stay longer in the register than 11 months; in specific cases it is possible to follow ALMP programs even after benefit exhaustion. Since we are interested in the unemployment duration while being eligible for benefits we censor these cases after one year.

in PBD is quite unique as most public policy adjustments are small in magnitudes. The “sharp” treatment difference around age 25 provides an excellent “exogenous” shock for the young job seekers (below age 25) in the post reform period. This allows us to implement a clean difference-in-difference estimation procedure to identify the “causal” links between the policy change and the exiting behaviors of the registered job seekers.<sup>14</sup> Following Cameron and Trivedi (2005), our empirical econometric model takes the following form:

$$Y_i = \alpha + x_i' \beta_1 + \gamma^1 I_i^{post} + \gamma^2 I_i^{treat} + \delta D_i^{DID} + \pi^1 age_i^{pre,c} + \pi^2 age_i^{pre,t} + \pi^3 age_i^{post,c} + \pi^4 age_i^{post,t} + \eta_t + \mu_r + \varepsilon_i \quad (1)$$

We model outcome variable  $Y$  in a standard linear diff-in-diff set up. We consider three outcomes for individuals who are registered at unemployment agencies in Switzerland between April 1<sup>st</sup> of 2009 and April 1<sup>st</sup> of 2013. In particular, we look at probability of leaving unemployment to a non-job state; probability of finding a job and the duration of the registered unemployment spell. As usual, we control for individual socio economic characteristics with  $X$ .<sup>15</sup>  $I_i^{post}$  and  $I_i^{treat}$  are indicators for the post policy reform period and the “treatment” status respectively. We also control for age trends before and after the policy change for the treatment and control groups separately.  $\eta_t$  captures common time trends, for example, seasonal dummies.  $\mu_r$  captures geographical differences among unemployment individuals, it accounts for any local economic environment that may affect the job search outcomes of unemployed. By controlling for both time and geographic location of the unemployed together with a rich set of observed socio-economic characteristics and separate age trends, we believe that the exogenous policy shock will help us to identify a causal effect. Finally  $\delta$  is the parameter of interest that gives us the treatment effect on the treated.

In order to better identify the treatment effect of the PBD cut, we select individuals who were between age 22 and 27, and who entered unemployment spells between April 1<sup>st</sup> of 2009 and April 1<sup>st</sup> of 2013. This way, on top of a rich set of control variables, we have a balanced sample of young job seekers who share similar observed and unobserved heterogeneity and hence more comparable. The unemployment inflow time window is also “balanced” by using 2 years before and after the implementation of the new UI PBD rules.

We now construct three pairs of control and treatment groups depending on individual’s perception of the implemented PBD rules. Potential treated individuals could have incomplete information about the specific rules that apply to them. From now on, we will use case 1 2 and

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<sup>14</sup> Similar large scale policy changes in welfare benefit levels in Quebec 1986 are also utilized by Lemieux and Milligan (2008). They focus on the sharp discontinuity around the age threshold and adopted RDD approach. In an earlier version of the current paper, we also exploit this nature of our natural experiment and found similar results.

<sup>15</sup> Such characteristics include gender, education, previous occupation, previous jobs tasks, language, insured earnings etc.

3 to refer to these comparison groups. The first case is where there is no incomplete information about the PBD reform and the cutting rules. Individuals share common information about the different treatment of unemployment benefit duration entitlement below and above (inclusive) age 25. In particular, we choose from the universe of all registered unemployed individuals who enter unemployment between April 1<sup>st</sup> of 2009 and April 1<sup>st</sup> of 2010 (before the reform), and between April 1<sup>st</sup> of 2011 and April 1<sup>st</sup> of 2013 (after the reform). Our control group is comprised of those who at the entry of unemployment are 25 and above. Our treatment group contains individuals who are between age 22.25 and 24.25. The treatment age window may appear arbitrary. However, age 24.25 is crucial to us, since by selecting this age threshold, we rule out the possibility that after the reform individuals who are closer to but not yet age 25 will be updated with longer PBD of 400 days instead of 200 days.<sup>16</sup> Therefore in case 1, the controls are those who would have 400 days of PBD before and after the reform, and the treated are those who would have a cut of PBD to 200 days after the reform. This comparison group will serve as our reference group when we discuss the results in the next section, as this group provides us the benchmark results under complete information.

In addition to case 1, we also construct two other comparison groups with less complete information about the PBD rules. When implementing the new PBD rules, the Swiss government decides to update individual's benefit period upon age 25. For example, if an individual enters unemployment spell before age 25 after the implementation of the new rules, he/she will be upgraded to have 400 days of PBD when he/she turns 25 while still in the same unemployment spell. The Offices of Unemployment Insurance Funds (UI payment agency in Switzerland) only updates the individuals' eligible PBD in the month of their 25<sup>th</sup> birthday and does not inform the job seekers in advance. This creates an uncertainty or lack of information for unemployed individuals who are close to age 25 after the reform. From the researcher's point of view, these individuals should have 400 days of PBD before and after the reform and hence form a special "control" group due to the lack of information. Such a "fuzzy" case would usually not be considered in the literature of evaluation of unemployment insurance PBD changes and hence ignored in the past. We explicitly take account of this unique population and form the second comparison group, in which the "treatment" group includes people who are between age 22.25 and 24.25 at the time of entering unemployment spell. Similar to the treatment group in case 1, the inflow time windows are between April 1<sup>st</sup> 2009 and April 1<sup>st</sup> 2010 and between April 1<sup>st</sup> 2011 and April 1<sup>st</sup> 2013. In this case, the "control" group is older than the treated but slightly younger than 25 when entering unemployment. Hence their potential benefit period could be upgraded from 200 days to 400 days. Therefore, we are comparing individuals who are entitled with 200 days (younger ones) with individuals who are entitled with 400 days without knowing about it. Our diff-in-diff estimator would then causally

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<sup>16</sup> This is actually the case, after consulting relevant documents and staff members at the Swiss Unemployment Insurance Register Office. Case workers will update PBD for individuals from 200 to 400 days, while they reach age of 25 during the unemployment spell.

identify the effect of being “treated” as compared to the uncertain “control” group, because the double difference in outcomes before and after the policy change should eliminate any fixed unobserved heterogeneity between the two age groups. To further focus on the role of incomplete information, we censor outcome variables (exit rate and unemployment duration) at age 25 for both control and treated. This is necessary, because before age 25, the treated is not sure of what PBD rules will apply to them after age 25. To better interpret the results from the censored outcomes for case 2, we censor outcomes in case 1 the same as we did to case 2. The censored result from case 1 would serve as a good reference point.

As a final step, we form our last comparison group, which is case 3. In this case, we reconsider the missing inflow time window that is before and not far from the implementation date. This inflow window is between July 2010 and February 2011. Consider for example an individual who enters unemployment spell in the above mentioned time frame at age of 23. Initially she expects 400 days of PBD upon entry, although she is young but the policy of shortening PBD has not been put into place yet. As she continues to rely on the UI benefit, the reform hits her so that she suddenly loses half of her potential benefit dates in the future. This is because she is still younger than 25 when the PBD reform takes place. Such a “negative” surprise gives us an opportunity to form another informative comparison group which contains individuals who could potentially face negative news while unemployed, and individuals who will not be affected by such news anyways. In particular, we consider two inflow windows: from April 1<sup>st</sup> 2009 to April 1<sup>st</sup> 2010, and from July 1<sup>st</sup> 2010 to February 1<sup>st</sup> 2011. The control group is comprised by those who enter unemployment above age of 25 in the above mentioned inflow window. Our treated individuals are those who are between age 22.25 and 24.25 and enter unemployment between July 2010 and February 2011. The treated is facing a PBD cut on April 1<sup>st</sup> of 2011. This cut is a valid “shock” for the treated because the entry period for the treated (between July 2010 and February 2011) is selected to guarantee that individuals will potentially “experience” the PBD cut within 9 months (200 days) of unemployment.<sup>17</sup> In this case, we are comparing unemployed individuals who have 400 days of PBD with individuals whose PBDs are likely to be cut by 200 days. One should notice that the “post” indicator  $I_i^{post}$  now equal to 1 for the period that is before the implementation date, i.e. July 2010 to February 2011. In the diff-in-diff framework, usually, the post means after the reform. But in this case, our definition of post refers to the entry period that is exposed to potential cuts in PBD. Because we are interested to find out whether relatively younger individuals who enter the post period exhibits different behavioral patterns than the unaffected older individuals. In this case the natural experiment should help us identify the effects of uncertainty about negative PBD news on individual’s behavior. Furthermore, to pin down how information may alter the effect of PBD cut, we analyze censored outcomes (probability to exit to employment, probability to exit to non-employment, and duration) before the arrival of the PBD change in April 2011. To form a

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<sup>17</sup> Note that there is a 9 month gap between July 1<sup>st</sup> 2010 and April 1<sup>st</sup> 2011.

meaning comparison group, the censoring on outcomes is also applied to the control group where there is no uncertainty involved.

[Table 2 around here]

Both case 2 and 3 include a group of individuals who face incomplete information regarding PBD rules. However the nature of the incomplete information differs between the two cases. First of all, the post period in case 2 is after the implementation of the PBD change. So people should know about the age distinction about PBD days, the only uncertainty comes from the specifics of how such a PBD change is implemented. People entering unemployment when under age of 25 form expectations about future PBD rules in the beginning. If the government does not inform them an update of changes in PBD entitlement individuals are less sure or even ignore the possibility of being upgraded when reach age 25. We should then expect a minor or even negligible effect for this group compared with the controls that will for sure have 200 days in any event. On the other hand, for case 3, the incomplete information is more pronounced since the post is defined before the actual policy reform is in place. The Swiss government has passed a law to mandate PBD reform more about 9 months before the implementation of the reform so that people have already form an expectation of such a PBD cut in the future. They just don't know when exactly the reform will hit. Secondly, uncertainty in case 2 makes people expect a potential gain in PBD. However, uncertainty in case 3 makes people form a negative expectation about PBD loss in the future. It turns out that such a difference in nature of the future prospects revealed by case 2 and 3 provides us additional insight about how rational individuals react in face of uncertainty. The next section will present the estimation results of the empirical model over 3 cases and offer discussions.

## 5. Results

We estimate equation (1) for case 1, 2 and 3 respectively. For each case, we run two sets of regressions with the non-censored outcomes and censored outcomes separately. Table 3, Table 4 and Table 5 document the estimated treatment effects on three outcomes we consider in this paper: probability to exit from unemployment to employment; probability to exit from unemployment to non-employment (temporary leave labor force); and unemployment durations in days. We also report estimates on the coefficient of treated, post, and constant terms. The estimates on socio-economics as well as geographic variables are not reported to save space. But these estimates are available upon requests from the authors.

[Table 3 around here]

The implemented PBD cut has significant effects on job seekers behavior. We can see from Table 3, cutting PBD by half makes unemployed individuals more likely to leave unemployment for both jobs and temporarily out of labor force. The effect is more prominent on leaving unemployment but not for employment reasons (5.2%). As expected, unemployment duration is also lower for the treated. On average they stay 9.7 days in unemployment less than their statistical counterparts in the control group. The censored outcomes also exhibit expected patterns in treatment effects for the complete information in case 1. After censoring, we look at outcomes at early stages of the unemployment spell: the effects are weaker in terms of magnitude but still significantly different from zero. For example, exiting to non-employment is 1.5% higher for the treated, and unemployment duration is 4.2 days shorter for the treated. This suggests that young unemployed job seekers facing a confirmed PBD cut react early. A PBD cut of 200 days makes unemployment insurance benefit less attractive in terms of “expected” UI benefit income streams. It hence makes other alternatives, such as going to school or leaving unemployment benefit temporarily more attractive to the job seekers. Interestingly, the “employment” effect of such a PBD cut is not as obvious as the effects on other two outcomes. Young job seekers tend to leave labor force (temporarily) and rely less on unemployment benefit.

[Table 4 around here]

The results from case 2 are quite revealing (see Table 4). For the censored case, the job seekers who could potentially face an upgrade of PBD do not react to such an “expected” outcome. The coefficients of the diff-in-diff variables on three outcomes are not significantly different from zero. However, when we look at the non-censored case, we see an impact on existing rate. This effect is mainly driven by individual responses after they reach age 25, because by then, they will have an update of PBD from 200 days to 400 days. Before that, individual is more likely to believe that he will have 200 days just like the treated young job seekers. This could be that the government did not inform them about the updating rules, or could be that they do not know about it even if the information is available.

If we compare results from case 1 and case 2, we can see that information about PBD rules play an important role in determine the treatment effects. Incomplete information in case 2 is the only reason that individuals do not react to an update of PBD. If we assume that people form expectations about future outcomes and act accordingly. In case 2 they potentially face a “positive” shock in the future. In addition, they do not expect a “negative” shock in this case the reduction of PBD anymore since they are already younger than 25 and have 200 days of PBD. The “uncertainty” about this future shock due to lack of information about PBD rules would rather make them not responding to the positive shock.

[Table 5 around here]

Table 5 tells us about behaviors responding to “negative” shocks in the future. The non-censored effects are even more prominent than those in case 1. For example, relative to control, the treated are 2.2% more likely to find job and 5.8% more likely to exit to non-employment states, and stay on average 15 days less on unemployment. These results are driven by both before and after the information about PBD cut is shared (implementation date of PBD cut is the censoring point). For the censored case, the treated in case 3 are both more likely to find jobs and more likely to exit to non-employment. This suggests that facing a potential “negative” shock in the future, people do react. Again, we can assume that people form expectation about the future given their current information set. The law on PBD change has been passed a year before the implementation of the PBD change. Individuals share common information about potential cut in PBD for the young. If a young job seeker (our treated in case 3) enters unemployment before the implementation of the PBD cut, he is entitled with 400 days of PBD, however, he expects that in the future there is a chance that he may get cut, but he does not know when this will happen. Our regression results for the censored case show that he reacts on this uncertainty about future negative outcomes. The only possibility of any change in PBD in the future for such a treated individual in case 3 is going to be a cut.

[Table 6 around here]

To summarize the findings in an illustrative way, we document in Table 6 the effects of the PBD cut across three cases in an intuitive way. An upward arrow means a positive effect and double arrows means the effects are stronger in magnitude. “0” means that the treatment effect is not significantly different from 0. A comparison of the effects shows that especially for the censored cases, uncertainty about upgrading of PBD does not generate any responses from individuals, while uncertainty about downgrading in PBD makes people nervous about the future and triggers a positive exiting effect. The “natural experiment” on PBD in our context provides a unique scenario, in which individuals are exposed to uncertainty about same magnitude of PBD changes but in the opposite direction, i.e. either a gain of 200 days or a loss of 200 days. Our results further reveal that an average risk-averse individual is more sensitive towards potential losses than potential gains facing uncertainty in both cases. This finding is in line with the arguments about “loss aversion” in Tversky and Kahneman 1991 and Yechiam and Telpaz 2013. The response recovered in our case 3 can also be explained by “consumption commitment” theory proposed by Chetty 2003, who argues that if the magnitude of income “shock” is larger, individuals will react by changing their durable goods consumption patterns. A PBD reduction of 200 days could be considered as a substantial drop in the “income” stream

that is derived from unemployment insurance payments, such a negative shock is big enough to make our treated individuals in case 3 to decide to leave unemployment early to avoid the potential income loss and “smooth out” the current consumption.

## 6. Conclusion

The literature on public policy evaluations and/or social policy schemes has flourished for many years. This literature has offered many theoretical and empirical evidences from various types of natural experiment settings around the world. Yet most of the existing studies have focused on the “treatment” effects identified based on the assumption that information is perfect and there is no incomplete information of policy rules from the perspectives of targeted population. That has led to a lack of empirics that offer evidences on the importance of information in the context of public policy evaluations, especially the ones that are based on large scale registered data. We fill this gap by taking advantage of a nationwide unemployment insurance policy reform that has been implemented in Switzerland together with access to a large scale administrative data set that records all registered unemployed individuals throughout Switzerland.

The natural experiment we exploit provides an excellent context for our purpose to show how information matters in directing individual responses under different scenarios. First of all, the policy reform is “clean” and “sharp” because the only condition for different treatment in PBDs is whether one reaches age 25. Newly unemployed individuals receive 400 days of PBD if they are at or above age 25 and receive 200 days if they are younger than 25. There are no economic reasons to believe that people just above age 25 and people just below 25 share very different preferences in job search behaviors. The different PBD rules around age 25 offers sufficient identifying condition to estimate the policy impacts. Secondly, the selected three comparison groups (case 1 2 and 3) only differ in terms of age of entry into the unemployment spell and the calendar time at which they enter. We do not observe different patterns of entering unemployment spell across all three cases and between all control and treatment groups. This is reassuring, because the only difference between the treatment group and the control group is the difference in the entitled PBD days (either 400 days or 200 days). Furthermore, incomplete information about the rules of new PBD is the only difference between the treatment group in case 1 and the treatment group in case 2, since the design and size of the policy change are the same. Case 1 and 3 also share the same information difference in this regard.

Empirical results from the diff-in-diff regressions across all three cases show that incomplete information is the key to explain differences in the treatment effects among individuals who face the same policy reform but have different knowledge about the specific rules that apply to them. This can be seen for example, by comparing results from censored case 2 with results from censored case 1. A comparison between results that are based on censored outcomes from



case 1 and case 3 also delivers the message: information does matter and it generates different treatment effects among different groups given the same reform.

Comparison of the results between case 2 and 3 provides additional evidence on the nature of the information and its impact on behaviors. In particular, the treated individuals with censored outcomes in case 2 and 3 share common elements of incomplete information from the same design of the reform. The main difference between these two treatment groups in censored case 2 and case 3 is that one is facing a potential upgrade (PBD increase of 200 days in case 2), and the other is facing a potential downgrade (PBD decrease of 200 days in case 3). The reactions identified by the diff-in-diff approach in both cases differ a lot. 1) The reactions are not symmetric even though the potential “risky” outcomes are symmetric in magnitude. 2) People seem to take “negative” potential shocks more seriously than “positive” shocks. When there is a potential PBD cut in the future, individuals would adjust their behavior by having a higher probability to leave the unemployment spell even there is uncertainty involved in the advent of such shock. Part of the reason for this pattern could be due to the fact that the information about the implementation of a PBD cut was announced sometime before the actual implementation date by passing the referendum on the cut of PBD for the young job seekers. However the Swiss government did not provide any information on the specific date of the PBD reform to the public while passing the referendum. This in turn generates “expectation” effects of the PBD cut among the young before the actual implementation date. This effect is captured by the analysis of case 3. One should also notice that the degree of incomplete information also differs between case 2 and case3. In case 2, the incomplete information is about the uncertainty on implementation of the rules of the new PBD after it has been put into place. In case 3, the uncertainty is more serious in a sense that the PBD has not yet been implemented for the censored case. This difference in the degree of uncertainty even strengthen our results suggesting that risk-averse individuals will react on “negative” future PBD shocks even the uncertainty of the shock is higher.

In this paper, we provide not only evidence on the importance of incomplete information in public policy evaluations but also additional evidence that supports the argument of “loss aversion” mentioned in Tversky and Kahneman 1991 and in Yechiam and Telpaz 2013. The reason why the treatment effect is non-existent in case 2 (potential upgrade) and the treatment effect is significant and positive in case 3 (potential downgrade) can be that for an average risk averse individual, disutility from a potential gain outweighs the utility from a potential gain of the same magnitude. People hence will act accordingly to avoid the higher disutility from a loss, which in this context is a PBD cut. Alternatively, our results also echo the argument of “consumption commitment” by Chetty 2003. Facing a possible major loss in the future (a PBD cut), individuals adjust their behaviors to minimize the income variation and try to maintain their previous consumption levels. Therefore, they will seek for other alternatives to leave unemployment spell because the expected benefit from staying in unemployment is lower with a PBD cut. However, people may not adjust their behavior at all as in case 2, because the

potential gain from the unemployment insurance benefit does not require additional effort or behavior change in order to keep the same consumption pattern in the event of the positive shock in the future.

To further disentangle the channel to interpret the results in this paper between “loss aversion” and “consumption commitment” additional analysis with richer individual level information is needed. For example more information about individuals’ financial situations, such as family asset and liquidity holdings, consumption patterns on durable goods would help to determine whether consumption commitment fits better when it comes to interpret our results. This is the object of future research.

Finally the results offer important evidence on the role of information to policy makers who expect certain reactions from the design and implementation of any public policy. Incomplete information among targeted groups about specific rules and practices that come with the intended social policy reform would potentially alter individual responses in ways that are usually not easily expected by policy makers. Ignoring incomplete information could result in unexpected outcomes from the targeted population. It is recommended that designing and implementing new public policy rules should consider the distribution of relevant information in a way that it does not distort the intention of the policy change in an unintended way.

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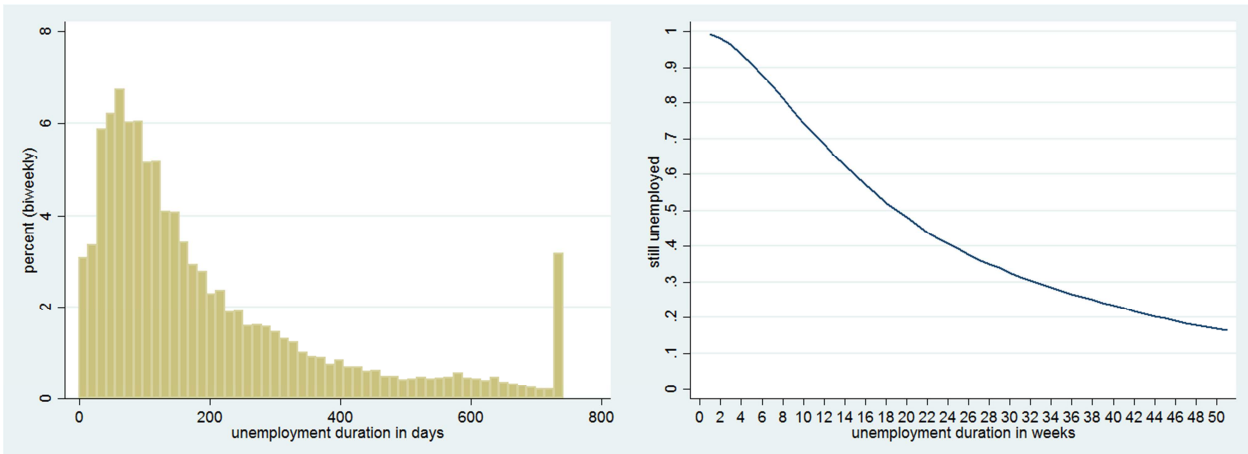
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## Figures

Figure 1: Distribution of realized unemployment durations in estimation sample



*Note:* Full estimation sample (age at unemployment entry 22.25 to 27), 53'705 observations; unemployment durations censored after 2 years (730 days) in left panel and after 1 year in right panel

*Source:* Swiss Unemployment Insurance Register (AVAM/ASAL) dataset

## Tables

Table 1: Descriptive statistics on socio-demographic characteristics in estimation sample

			St. dev.
Unemployment duration	(median in days)	133	118.08
Gender	Female	0.455	
Education	Primary (<=11y.)	0.211	
	Secondary (12-13y.)	0.666	
	Tertiary (>=14y.)	0.053	
Mother tongue	German	0.487	
	French	0.212	
	Italian	0.049	
Foreign born		0.318	
Insured earnings	(mean, CHF)	4049.71	1230.91
Occupation	Sales	0.156	
(5 biggest)	Production (blue collar, etc.)	0.128	
	Gastronomy	0.123	
	Office & admin	0.111	
	Construction	0.108	
Job type	Apprentice	0.039	
	Support task	0.225	
	Professional	0.713	
Urbanization	Centers	0.359	
	Sub-urban	0.427	
	Sub-industrial & Touristic	0.123	
	Rural	0.091	
Previous unemployment experience	(duration in days for past 3 years)	80.81	128.29
N		53'705	

*Notes:* Descriptives are reported for the estimation sample of unemployed who enter registration between age 22.25 and 27. Proportions are presented if not otherwise stated.

*Source:* UIR dataset

Table 2: Overview of the comparison cases generated by the natural experiment

<b>1) Reference Case</b>	<b>200 pure</b>	<b>vs.</b>	<b>400 pure</b>
	[22.25; 24.25]		[25; 27]
	treated		control
<b>2) Upgrade</b>	<b>200 pure</b>	<b>vs.</b>	<b>update 200 → 400</b>
<b>200 → 400</b>	[22.25; 24.25]		[24.25; <25]
	treated		control
<b>3) Downgrade</b>	<b>update 400 → 200</b>	<b>vs.</b>	<b>400 pure</b>
<b>400 → 200</b>	[22.25; 24.25]		[25; 27]
	treated		control

Table 3: Reference case (full information): treatment effects

	finding job	<i>Non-censored</i> (temp.) exit labor force	UE duration	finding job	<i>Censored</i> (temp.) exit labor force	UE duration
<b>DID TE</b>	<b>0.0112</b> (0.0098)	<b>0.0522***</b> (0.0072)	<b>-9.6830***</b> (2.5043)	<b>-0.0089</b> (0.0103)	<b>0.0145***</b> (0.0052)	<b>-4.229***</b> (1.4579)
treated	0.0231*** (0.0083)	0.0008 (0.0058)	-7.2465*** (2.1338)	0.0305*** (0.0086)	-0.00492 (0.0042)	-0.969 (1.2386)
post	0.0101 (0.0084)	0.0133** (0.006)	-11.1435*** (2.1571)	0.0372*** (0.0088)	0.00850* (0.0044)	-2.797** (1.2574)
Constant	0.6993*** (0.0149)	0.1190*** (0.0114)	165.4480*** (3.7806)	0.396*** (0.0155)	0.0690*** (0.0084)	92.97*** (2.1944)
Observations	38'737	38'737	38'737	38'737	38'737	38'737
Covariates	YES	YES	YES	YES	YES	YES
Age trends	YES	YES	YES	YES	YES	YES
regional FE	YES	YES	YES	YES	YES	YES

*Notes:* Robust standard errors in parentheses, \*\*\* p<0.01, \*\* p<0.05, \* p<0.1. The spells for the early treatment effects are censored at the counterfactual time of the change of the PBD eligibility status (at 25th birthday in case 2; at reform date, April 1st 2011, in case 3). In reference case 1 the same censoring scheme than in case 2 is applied (by a mean-preserving uniform random spread; after 138 days in median), in order to allow for comparability across cases.

*Source:* UIR dataset

Table 4: Case 2, upgrade from 200 to 400 days of PBD (incomplete information): treatment effects

	finding job	<i>Non-censored</i> (temp.) exit labor force	UE duration	finding job	<i>Censored</i> (temp.) exit labor force	UE duration
<b>DID TE</b>	<b>0.00692</b> (0.0135)	<b>0.0404***</b> (0.0098)	<b>-5.234</b> (3.4390)	<b>0.00694</b> (0.0138)	<b>-0.00172</b> (0.0072)	<b>-0.0885</b> (1.9012)
treated	0.0121 (0.0112)	0.00752 (0.0079)	-3.632 (2.8849)	-0.000599 (0.0117)	0.00177 (0.0056)	-1.674 (1.6655)
post	0.0128 (0.0129)	0.0266*** (0.0094)	-15.54*** (3.2659)	0.0249* (0.0130)	0.0227*** (0.0069)	-6.264*** (1.7823)
Constant	0.719*** (0.0193)	0.107*** (0.0150)	156.6*** (4.8702)	0.440*** (0.0199)	0.0637*** (0.0108)	93.13*** (2.7887)
Observations	27'320	27'320	27'320	27'320	27'320	27'320
Covariates	YES	YES	YES	YES	YES	YES
Age trends	YES	YES	YES	YES	YES	YES
regional FE	YES	YES	YES	YES	YES	YES

*Notes:* Robust standard errors in parentheses, \*\*\* p<0.01, \*\* p<0.05, \* p<0.1. The spells for the early treatment effects are censored at the time of the change of the PBD eligibility status (at 25th birthday).

*Source:* UIR dataset



Table 5: Case 3, downgrade from 400 to 200 days of PBD (incomplete information): treatment effects

	finding job	<i>Non-censored</i> (temp.) exit labor force	UE duration	finding job	<i>Censored</i> (temp.) exit labor force	UE duration
<b>DID TE</b>	<b>0.0221**</b> (0.0112)	<b>0.0575***</b> (0.0088)	<b>-15.1226***</b> (2.7892)	<b>0.0234*</b> (0.0120)	<b>0.0214***</b> (0.0069)	<b>-2.023</b> (1.4462)
treated	0.0248*** (0.0083)	0.001 (0.0058)	-8.6112*** (2.1345)	0.0344*** (0.0088)	-0.00279 (0.0046)	-3.486*** (1.0554)
post	-0.0095 (0.013)	0.0049 (0.0095)	-10.1000*** (3.33)	0.0224* (0.0136)	-0.00344 (0.0071)	-9.982*** (1.8164)
Constant	0.7193*** (0.0198)	0.1355*** (0.0149)	164.8166*** (5.0514)	0.573*** (0.0208)	0.112*** (0.0121)	133.5*** (3.1276)
Observations	32'789	32'789	32'789	32'789	32'789	32'789
Covariates	YES	YES	YES	YES	YES	YES
Age trends	YES	YES	YES	YES	YES	YES
regional FE	YES	YES	YES	YES	YES	YES

*Notes:* Robust standard errors in parentheses, \*\*\* p<0.01, \*\* p<0.05, \* p<0.1. The spells for the early treatment effects are censored at the time of the change of the PBD eligibility status (at reform date, April 1st 2011).

*Source:* UIR dataset

Table 6: Synthesis of the treatment effects across the three comparison cases. Effects for censored spells (unemployment exit before change) and full duration

	<i>Non-censored</i>		<i>Censored</i>	
	unemployment exit job	no job	unemployment exit job	no job
<b>Case 1</b> <i>T: 200 days</i> <b>reference</b> <i>C: 400 days</i>	0	↑↑	0	↑
<b>Case 2</b> <i>T: 200 days</i> <b>upgrade</b> <i>C: 200 → 400 days</i>	0	↑↑	0	0
<b>Case 3</b> <i>T: 400 → 200 days</i> <b>downgrade</b> <i>C: 400 days</i>	↑	↑↑	↑	↑

*Notes:* The table reports the diff-in-diff treatment effect coefficients (in percentage points) by means of arrows: ↑ = significant treatment effect of below .035, ↑↑ = significant treatment effect of above .035 and below .060. Coefficients are reported in Tables 3 to 5. The spells for the early treatment effects are censored at the time of the change of the PBD eligibility status (at 25<sup>th</sup> birthday in case 2; at reform date, April 1<sup>st</sup> 2011, in case 3). In reference case 1 the same censoring scheme than in case 2 is applied (by a mean-preserving uniform random spread; after 138 days in median), in order to allow for comparability across cases.