- 1 Association between Integrase Strand Transfer Inhibitors and Cardiovascular Disease in People Living
- 2 with HIV: A multicentered Prospective Study from the RESPOND Cohort Consortium
- 3 Bastian Neesgaard, MD<sup>1</sup>; Lauren Greenberg, Ph.D<sup>1</sup>; Prof. Jose M Miró, Ph.D.<sup>3</sup>; Katharina Grabmeier-
- 4 Pfistershammer, MD<sup>4</sup>; Prof. Gilles Wandeler, MD<sup>5</sup>; Colette Smith, Ph.D.<sup>6</sup>; Prof. Stéphane De Wit, Ph.D.<sup>7</sup>;
- 5 Ferdinand Wit, Ph.D.<sup>8</sup>; Annegret Pelchen-Matthews, Ph.D.<sup>2</sup>; Prof. Cristina Mussini, MD<sup>9</sup>; Prof. Antonella
- 6 Castagna, MD<sup>10</sup>; Prof. Christian Pradier, Ph.D.<sup>11</sup>; Prof. Antonella d'Arminio Monforte, Ph.D.<sup>12</sup>; Prof. Jörg J
- Vehreschild, MD<sup>13,14</sup>; Prof. Anders Sönnerborg, DMSc<sup>15</sup>; Alain V Anne, BA<sup>16</sup>; Prof. Andrew Carr, DMSc<sup>17</sup>;
- 8 Loveleen Bansi-Matharu, Ph.D.<sup>2</sup>; Prof. Jens D Lundgren, DMSc<sup>1</sup>; Harmony Garges, MD MPH<sup>18</sup>; Felipe
- 9 Rogatto, MD<sup>19</sup>; Prof. Robert Zangerle, MD<sup>20</sup>; Prof. Huldrych F Günthard, MD.<sup>21,22</sup>; Line D Rasmussen,
- 10 DMSc<sup>23</sup>; Coca Necsoi, MD<sup>7</sup>; Prof. Marc van der Valk, Ph.D<sup>8</sup>; Marianna Menozzi, MD<sup>9</sup>; Camilla Muccini,
- 11 MD<sup>10</sup>; Lars Peters, DMSc<sup>1</sup>; Prof. Amanda Mocroft, Ph.D.<sup>1,2</sup> and Lene Ryom, DMSc.<sup>1</sup>
- 12 1: CHIP, Centre of Excellence for Health, Immunity, and Infections, Rigshospitalet, University of Copenhagen, Copenhagen, Denmark.;
- 2: Centre for Clinical Research, Epidemiology, Modelling and Evaluation (CREME), Institute for Global Health, University College London, London,
- 14 UK.
- 15 3: Infectious Diseases Service. Hospital Clinic IDIBAPS University of Barcelona, Barcelona, Spain; and, Centro de Investigación Biomédica en Red
- de Enfermedades Infecciosas (CIBERINFEC), Instituto de Salud Carlos III, Madrid, Spain.
- 4: Austrian HIV Cohort Study (AHIVCOS), Medizinische Universität Vienna, Vienna, Austria;
- 18 5: Department of Infectious Diseases, Bern University Hospital, University of Bern, Switzerland;
- 19 6: The Royal Free HIV Cohort Study, Royal Free Hospital, University College London, London, United Kingdom;
- 7: CHU Saint-Pierre, Centre de Recherche en Maladies Infectieuses a.s.b.l., Brussels, Belgium;
- 21 8: AIDS Therapy Evaluation in the Netherlands (ATHENA) cohort, Stichting HIV Monitoring, Amsterdam, the Netherlands;
- 9: Modena HIV Cohort, Università Degli Studi di Modena, Modena, Italy;
- 23 10: San Raffaele Scientific Institute, Università Vita-Salute San Raffaele, Milano, Italy;
- 24 11: Nice HIV Cohort, Université Côte d'Azur et Centre Hospitalier Universitaire, Nice, France;
- 25 12: Italian Cohort Naive Antiretrovirals (ICONA), ASST Santi Paolo e Carlo, Milano, Italy;
- 26 13: Medical Department 2, Hematology/Oncology, University Hospital of Frankfurt, Frankfurt, Germany;
- 27 14: Department I for Internal Medicine, University Hospital of Cologne, Cologne, Germany;
- 28 15: Division of Infectious Diseases, Department of Medicine Huddinge, Karolinska Institutet, Stockholm, Sweden
- 29 16: European AIDS Treatment Group (EATG);
- 30 17: HIV and Immunology Unit, St Vincent's Hospital, Sydney, and The Australian HIV Observational Database (AHOD), UNSW Sydney, Sydney,
- 31 Austalia;

- 32 18: ViiV Healthcare, RTP, North Carolina, USA;
- 33 19: Gilead Sciences, Foster City, California, USA;
- 34 20: Austrian HIV Cohort Study (AHIVCOS), Medizinische Universität Innsbruck, Innsbruch, Austria;
- 35 21: Division of Infectious Diseases and Hospital Epidemiology, University Hospital Zurich, Zurich;
- 36 22: Institute of Medical Virology, University of Zurich, Zurich, Switzerland;
- 37 23: Department of Infectious Diseases, Odense University Hospital, Odense, Denmark
- 39 <u>Corresponding author:</u>
- 40 Bastian Neesgaard,
- 41 CHIP, Centre of Excellence for Health, Immunity, and Infections. Section 2100, Rigshospitalet
- 42 Blegdamsvej 9, DK-2100 Copenhagen Ø, Denmark
- 43 E-mail: <u>Bastian.Neesgaard@regionh.dk</u>

## 44 Abstract

45

46

# Summary

- 47 Background Although associations between older antiretroviral drug classes and cardiovascular disease
- 48 (CVD) in people living with HIV (PLWH) are well described, data regarding a possible association with
- 49 integrase strand transfer inhibitors (INSTIs) are limited. Our aim was to investigate if exposure to INSTIs was
- associated with an increased incidence of CVD.

51

52 53

#### Methods

- 54 RESPOND is a prospectively multicentered collaboration between 17 pre-existing European and Australian
- cohorts, that follows > 32 000 adult PLWH in clinical care after Jan 1, 2012.
- Included participants were required to have CD4 cell counts and HIV viral load measured in the 12 months
- before or within 3 months after baseline. (latest of cohort enrollment or Jan 1, 2012); these were subsequently
- 58 followed to the earliest of the first CVD event (myocardial infarction, stroke, or invasive cardiovascular
- procedure), last follow-up, or Dec 31, 2019.
- 60 Multivariable negative binomial regression was used to assess associations between CVD and INSTI-
- exposure.

62

- Findings Out of 29,340 PLWH, 47.7% were exposed to an INSTI. During 160,252 person-years of follow-up
- 64 (PYFU), 748 individuals experienced a CVD event (incidence rate, IR, 4.67/1000 PYFU [95% confidence
- interval, 4·34–5·01]). The crude CVD IR increased from 4·19/1000 PYFU [3·83–4·57] in those with no
- INSTI-exposure to 8.46 [6.58-10.71] at >0-6 months exposure and decreased after 24 months of exposure, to
- 67 levels similar to individuals never-exposed to INSTIs. Compared to those never-exposed, the risk of CVD was
- elevated within the first 24 months of INSTI-exposure (>0–6 months adjusted incidence rate ratio:1.85 [1.44–
- 69 2.39], 6–12 months: 1.19 [0.84-1.68], 12-24 months of exposure: 1.46 [1.13-1.88], p <0.01) and thereafter
- fell to levels similar to those never-exposed. Results were consistent across a range of sensitivity analyses, and
- according to age, estimated 5-year D:A:D CVD risk score and calendar year before or after 2014 (p<sub>interaction</sub>
- 72 >0.25, for all)

- 74 Interpretation Although the potential for unmeasured confounding and channelling bias cannot fully be
- excluded, INSTIs initiation was associated with an early onset, excess incidence of CVD in the first two years
- of exposure, after accounting for known CVD risk factors and across a wide range of sensitivity analyses.
- 77 These early findings call for analyses in other large studies, and the potential underlying mechanisms explored
- 78 further.

Funding The CHU St Pierre Brussels HIV Cohort, The Austrian HIV Cohort Study, The Australian HIV Observational Database, The AIDS Therapy Evaluation in the Netherlands national observational HIV cohort, The EuroSIDA cohort, The Frankfurt HIV Cohort Study, The Georgian National AIDS Health Information System, The Nice HIV Cohort, The ICONA Foundation, The Modena HIV Cohort, The PISCIS Cohort Study, The Swiss HIV Cohort Study, The Swedish InfCare HIV Cohort, The Royal Free HIV Cohort Study, The San Raffaele Scientific Institute, The University Hospital Bonn HIV Cohort and The University of Cologne HIV Cohorts, ViiV Healthcare, and Gilead Sciences.

## Research in context:

88 89

90

**Evidence before this study** 

- 91 We searched Pubmed for observational studies and clinical trials, using the Mesh-terms "cardiovascular
- 92 disease, "myocardial infarction" OR "cerebrovascular disorder" OR "Stroke" OR "cardiovascular Procedures"
- 93 with AND "Antiretroviral Therapy, Highly Active" OR "Anti-Retroviral Agents" OR "HIV integrase
- 94 inhibitors" OR "raltegravir" OR "elvitegravir" OR "dolutegravir" OR "bictegravir," or AND "HIV," in the
- 95 period from index start to Aug 1, 2021, without any date or language restrictions.
- Associations between the risk of cardiovascular disease and the use of older antiretroviral drugs are well
- 97 described. The risk has been described as a gradual increase with longer cumulative exposures, for the boosted
- 98 protease inhibitors indinavir, lopinavir, and darunavir, and as a rapid and maintained risk increase, reversible
- 99 upon discontinuation, for the nucleotide-reverse-transcriptase-inhibitor, abacavir. However, investigations of
- a potential association between the use of the newer integrase inhibitor drug-class which are recommended
- as first-line treatment in most guidelines and cardiovascular disease are still scarce. Nonetheless, such
- studies are warranted, as an increasing number of studies suggest that integrase inhibitors are linked to weight
- gain and associated conditions such as metabolic syndrome, which could, in turn, lead to cardiovascular
- disease. A recent retrospective, US-based, found no such association, although not assessing exposure time
- and excluding clinical events within the first 90 days.
- On the other hand, an older analysis spanning the period 2003 2015 from the US Veterans Affairs cohort
- found that myocardial infarctions and strokes were less likely with atazanavir treatment than integrase inhibitor
- treatment. However, the analysis was not dedicated to examining a potential relationship between integrase
- inhibitors and cardiovascular disease. Moreover, the integrase inhibitor group was relatively small, with only
- a limited number of second-generation Integrase inhibitors included.
- Whether a relationship between cumulative exposure to integrase inhibitors and cardiovascular disease exists
- when examined in well-powered studies with firmly defined end-points, including centrally adjudicated events,
- is unknown

114

#### Added value of this study

- During 6.16 years median follow-up time and 160,252 person-years, 748 of the 29,340 individuals included
- experienced a rigorously defined cardiovascular event. When comparing individuals never-exposed to an
- integrase inhibitor to individuals exposed for >0–6 months, >6–12 months, >12–24 months, >24–36 months,
- and >36 months, we found that the relative risk of CVD increased almost two-fold in the first six months of
- exposure, after adjustment for potential confounders. The association remained until 24 months of exposure

— albeit at a lower relative risk than in the initial six months. The association was similar across a wide range of sensitivity analyses that tested the robustness of the findings; included analyses that excluded individuals with prior CVD and analyses that excluded invasive cardiovascular procedures for the composite cardiovascular end-point. Exploratory models adjusting for factors on the potential causal pathway to CVD, such as BMI, lipids, glucose, blood pressure, and CD4 count, as time-updated variables, did not lower the relative risk, suggesting that the association was not mediated through classic cardiovascular risk factors. The association was similar for individuals above or below 50 years of age and individuals at low or high 5-year estimated cardiovascular risk, respectively. In addition, the risk did not vary by immune/virologic status or by the period before or after availability of second-generation integrase inhibitors

#### Implications of all the available evidence

- With cardiovascular disease remaining a common cause of morbidity and mortality among people living with
- HIV, it is paramount that treatment given to suppress HIV does not add to the cardiovascular risk profile.
- Therefore, insights into CVD risk factors, including the potential role of individual antiretroviral agents, remain
- 133 crucial.

120

121 122

123

124125

126

127128

- In this large, multi-national cohort study using meticulously defined cardiovascular end-points, we observed
- an almost two-fold increased risk of cardiovascular disease, after accounting for other known risk factors,
- within the first six months of exposure to integrase inhibitors when compared to individuals never-exposed to
- an integrase inhibitor. The risk remained elevated until two years of exposure, although the risk was higher in
- the initial six months. We did not find any evidence suggesting that known cardiovascular risk factors mediated
- the increased risk or that the strength of the association depended on underlying estimated cardiovascular risk.
- Our results call for investigations in other large studies and further exploration of potential underlying
- mechanisms.

## Introduction

142 143

144

173

174

the RESPOND cohort consortium.

(PLWH) has approached that of the HIV-negative population. Yet, as the population ages, non-AIDS 145 comorbidities such as cardiovascular disease (CVD) and risk factors hereof are seen with increasing 146 frequency.2 Therefore, continuous assessments of modern antiretroviral drugs are needed to tailor ART 147 regimens to fit individual needs, taking the complex interactions between ART, comorbidities, lifestyle factors, 148 and non-ART medication into consideration.<sup>3,4</sup> 149 A safety signal linking ART-exposure to incident myocardial infarctions (MIs) first appeared in a 2003 150 publication from The Data Collection on Adverse Events of Anti-HIV Drugs (D:A:D) study.<sup>5</sup> Follow-up 151 studies published in 2007 and 2010 from the same group could, in part, attribute this to a 47% and 54% increase 152 153 in the relative risk of MIs per 5 years of exposure to the older protease inhibitors (PI), indinavir, and ritonavirboosted lopinavir, respectively. <sup>6,7</sup> An additional analysis from the D:A:D study further suggested that recent 154 exposure to the nucleoside-reverse transcriptase inhibitor, abacavir (ABC), increased the relative risk of MIs 155 by 90%. Subsequently, both these findings were reproduced in other independent studies, although not 156 consistent across all studies. 10 Whereas a pro-atherosclerotic lipid profile is now generally considered to 157 underlie the association for older PIs<sup>11</sup>, a platelet hyperactivity mechanism has been suggested as the link 158 between ABC and CVD.<sup>12</sup> Both cases illustrate that the process from initially observing a potential safety 159 signal to establishing a plausible causal mechanism evolves over time and requires the involvement of many 160 different types of studies. The recent report of a 59% increase in CVD risk per 5 years exposure to the ritonavir-161 boosted darunavir, 13 not explained by dyslipidemia, serves as an example of the initiation of one such process 162 — underlining the continued need for large-scale pharmacovigilance research of potential adverse effects of 163 164 antiretroviral drugs. To date, no studies have reported an association between CVD and the use of nonnucleotide reverse transcriptase inhibitors (NNRTIs).7,13 165 Due to their potent suppression of HIV viremia, rapid immune reconstitution, and high genetic barrier to 166 resistance, 15-18 unboosted integrase strand transfer inhibitors (INSTIs) are recommended as first-line treatment 167 in North American and European guidelines.<sup>3,4</sup> Although INSTIs are generally well-tolerated, <sup>15–17,19</sup> recent 168 studies have suggested a possible association between INSTI use, weight gain, and metabolic syndrome; <sup>20–22</sup> 169 170 factors that in turn could lead to CVD. However, only limited data exist on a potential association between rarely occurring CVD events and INSTI-exposure.<sup>23,24</sup> Therefore, data from large-scale, prospective, 171 observational collaborations with extended follow-up and rigorously defined clinical end-points are warranted. 172 In this study, we investigated if exposure to INSTIs was associated with an increased incidence of CVD within

With modern combination antiretroviral therapy (ART), the life expectancy for people living with HIV

# **Methods**

175

176

182

#### Study design and participants

- A detailed consortium profile for REPSOND has been published elsewhere. <sup>25</sup> In brief RESPOND was formed
- in 2017, dedicated to the study of HIV and other infectious diseases, as a prospectively multicentered
- 179 collaboration between 17 pre-existing European and Australian cohorts. RESPOND participants are required
- to more than 18 years of age, INSTI naïve prior to Jan 1, 2012, and to have a CD4 cell counts and HIV viral
- load measured in the 12 months before or within 3 months after baseline (see statistical analysis below),

#### **Ethical considerations**

- Participants consent to share data with RESPOND according to local requirements. Enrolled participants are
- pseudonymised by assigning a unique identifier by the participating cohort before data transfer. According to
- national or local requirements, all cohorts have the approval to share data with RESPOND. Data are stored
- on secure servers at the RESPOND coordinating centre in Copenhagen, in accordance with current
- legislation and under approval by The Danish Data Protection Agency (approval number 2012-58-0004,
- 188 j.nr.: RH-2018-15, 26/1/2018), under the EU General Data Protection Regulation (2016/679).

#### 189 Procedures

- All included individuals had data retrospectively collected for at least five years prior to their enrollment into
- 191 RESPOND a complete history of ART and clinical events was requested for all individuals. In addition,
- 192 prospective data have been collected annually since 2017. The systematic data collection includes
- demographics (e.g., sex, age, region of origin), viral hepatitis co-infection, and HIV-specific information (e.g.,
- HIV viral load [VL], CD4 cell counts, AIDS), detailed information on ART including start/stop dates, and
- reasons for discontinuation. Further, non-ART medications, biochemical measures (e.g., lipids, creatinine,
- 196 glucose, and Hb1Ac, cardiovascular risk factors (prior CVD, smoking, body-mass-index [BMI], hypertension,
- renal function, and diabetes mellitus [hereafter referred to as diabetes]), and incident clinical events (including
- 198 CVD, cancers, liver- and renal failure) are also collected.

#### Outcomes

- We assessed CVD using a composite endpoint consisting of fatal and non-fatal MIs, strokes, and invasive
- 201 cardiovascular procedures (ICPs: coronary angioplasty/stenting, coronary bypass surgery, and carotid
- 202 endarterectomy). CVD events occurring within 12 months of the last clinical visit before RESPOND enrolment
- and thereafter were reported using designated case report forms. Subsequently, the case report forms were
- 204 centrally validated by a trained medical doctor, using standardised algorithms based on WHO's MONICA
- study. 26 CVD events occurring before this point were collected but not centrally validated.

## Statistical analysis

- We followed INSTI naïve individuals, from the latest of cohort enrolment or Jan 1, 2012 (baseline) to the
- earliest of the first CVD event, last follow-up visit, or Dec 31, 2019 (administrative censoring date). We
- allowed CVD events prior to baseline, but only included incident events of a different subtype after baseline
- 210 (e.g. if the person had experienced a MI before baseline we would not include a subsequent MI during follow-
- up, whereas we would count a stroke). We did not count ICPs performed within 72 hours of an MI.
- 212 Logistic regression, adjusted for calendar time, was used to assess whether or not individuals at a higher
- estimated 5-year D:A:D CVD risk<sup>27</sup> preferentially started an INSTI, compared to other contemporary third-
- 214 drug antiretrovirals within the period. We used the 5-year risk estimate rather than the 10-year risk estimate,
- as the median follow-up in the population did not exceed ten years.
- ART exposure was calculated based on the D:A:D study methodology described elsewhere.<sup>5</sup> In brief, follow-
- 217 up from each participant was divided into a series of consecutive one-month periods, adding each month on a
- drug, the person's cumulative exposure for that specific drug. If treatment stopped, the exposure count
- 219 remained static with no addition to the cumulative exposure of that drug. However, should the specific
- treatment be reinitiated, time would be added to the cumulative exposure. We repeated this process for each
- ARV that an individual had received. Finally, we added drug exposure prior to the baseline to the cumulative
- exposure.
- In these first analyses, we assessed INSTI-exposure as a class exposure consisting of raltegravir (RAL),
- cobicistat-boosted elvitegravir (EVG/c), dolutegravir (DTG), and bictegravir (BIC), as the analytical power at
- the time of the analysis was insufficient to assess exposure to individual INSTIs. Based on exploratory analyses
- determining whether a potential relationship between CVD incidence and INSTI-exposure was linear or not,
- we analysed INSTI exposure as a categorical variable, with categories of 0 months (unexposed), >0-6, >6-6
- 12, >12 24, >24 36, and >36 months of exposure; the 0-exposure group refers to those who were never
- exposed to an INSTI, at any time, and per definition, includes both ART experienced and ART naïve
- 230 individuals. As RESPOND has complete ART history and precise dates of CVD events, we were able to
- determine INSTI exposure prior to CVD events, for those exposed to INSTI.
- 232 CVD incidence rates (IR) were calculated per 1000 person-years of follow-up (PYFU), stratified by duration
- of INSTI-exposure.
- Binomial regression models using generalised estimating equations and robust standard errors were used to
- examine a potential association. A priori, the model was adjusted for sex, ethnicity, region, HIV acquisition
- 236 risk, age, body mass index (BMI), CD4 cell count, CD4 nadir, hypertension, dyslipidemia, diabetes, prior
- AIDS-defining conditions, prior CVD, and chronic kidney disease (CKD) all fitted at baseline. We included
- smoking and antiretroviral drugs previously associated with CVD (cumulative exposure to indinavir, ritonavir-

- boosted lopinavir, boosted darunavir, didanosine, and recent ABC exposure [current or within six months]) in
- the model as time-updated variables. An unknown category accounted for missing categorical data in the
- 241 model. Due to collinearity with cumulative ART exposure, we did not include calendar time or treatment
- experience in the model. Definitions and variable fitting are shown in the legend of Table 1 and Figure 2 and
- 243 3, respectively. To investigate the potential overfitting of the model, we performed a sensitivity analysis,
- adjusted only for the estimated 5-year D:A:D CVD risk score.<sup>27</sup>
- We used exploratory analyses to assess the effect of fitting factors on the potential causal pathway from INSTI-
- exposure to CVD (CD4 cell count, BMI, hypertension, diabetes, CKD, and dyslipidemia) as time-updated
- variables to evaluate if this would attenuate a potential signal and indicate a mediator effect. Subsequently, we
- added time-updated platelet counts to the model, assessing a potential platelet-dependent mechanism, such as
- 249 blood-clotting.
- To test the primary model's robustness, we further performed analyses with models that excluded ICPs from
- 251 the composite CVD endpoint or excluded individuals with any CVD before baseline. Other sensitivity analyses
- only included centrally validated CVD events or individuals who switched/initiated a new ART regimen after
- 253 Jan 1, 2012.

260

- We also examined if the CVD incidence and association with INSTI-exposure varied depending on the
- estimated 5-year CVD risk score, sex, or age (<50 years and ≥50 years) by testing the relevant interactions. In
- addition, we also examined potential variation due to differences in the availability of first and second-
- generation INSTIs, by testing a potential interaction with calendar-year before or after Jan 1, 2014.
- We used Stata/SE 15·0 (StataCorp LLC) for all performed analyses. All p-values are two-sided, with a p-value
- 259 <0.05 defined as statistically significant.

# 261 Role of funding source

- 262 As per RESPOND governance
- 263 (https://chip.dk/Portals/0/files/RESPOND/Study%20documents/RESPOND%20governance%20and%20proc
- 264 edures\_v6\_2020SEP30.pdf?ver=2020-10-20-163958-080), funders of the study were also academic
- collaborators, and employees/associates could be included as co-authors if they met the ICJME criteria.
- However, funding bodies (incl. employees/associates hereof), were not in a position to veto study design,
- data collection, data analysis, data interpretation, and/or writing of the manuscript.

# **RESULTS**

268

290

- Among 32,487 eligible individuals within RESPOND, 3147 participants were excluded, leaving 29,340
- 270 (90.3%) INSTI-naïve individuals for inclusion, as shown in the inclusion flowchart, Figure 1, which also notes
- 271 specific reasons for the exclusion. There were some differences in baseline characteristics between those
- included and excluded. Compared to those included, a larger proportion of excluded participants were ART-
- 273 naïve (1678/3147 [53·3%] vs. 7172/29,340 [24·4 %]), and a lower proportion had one or more comorbidities
- 274 (1343/3147 [42·7%] vs 20,913/29,340 [71.3%]).
- Of the 29,340 included individuals, 47.7% were exposed to one or more INSTIs during follow-up (8647)
- 276 individuals to DTG, 3344 to EVG/c, 3296 to RAL, and 840 to BIC). The majority were white, males of Western
- European origin, with men who have sex with men as the predominant risk category (table 1).
- During a median follow-up of 6.16 years (interquartile range, IQR: 3.87 7.52; 160,252 person-years of FU,
- 279 PYFU), 748 individuals experienced a CVD event (299 MIs, 228 strokes, and 221 ICPs); crude incidence rate
- 280 (IR) 4.67/1000 PYFU (95% confidence interval, 95% CI, 4.34 5.01). Traditional CVD risk factors, such as
- current smoking, hypertension, dyslipidemia, CKD, and diabetes, were more prevalent at baseline for those
- 282 who developed a CVD event during follow-up (p<0.001 for all; Table 1). Further, individuals who experienced
- a CVD event were older than those who did not, and their 5-year estimated risk of CVD at baseline was
- consequently higher (p<0.001). Additional details on prior ART usage among those with and without incident
- 285 CVD and those exposed and unexposed to INSTIs are provided in Supplementary tables 1 and 2.
- Compared to those at low estimated 5-year risk of CVD, the odds of starting an INSTI showed an upward
- 287 going linear trend, being significantly higher for those with moderate, high , and very high risk of CVD
- 288 (p<0.001 for all; Figure 2). Further, the results were consistent but slightly more pronounced when only
- assessing ART-experienced individuals.
- The crude CVD IR increased from 4·19/1000 PYFU (95% CI, 3·83 4.57) in those with no INSTI-exposure
- to a peak IR of 8.46/1000 PYFU (6.58 10.71) at >0-6 months of INSTI-exposure, and then gradually
- weakened, returning to rates similar to no INSTI-exposure, after >12–24 months INSTI-exposure, figure 3A.
- After adjusting for potential CVD confounders, the CVD IR ratio (aIRR) remained significantly higher at >0-
- 6 months of INSTI-exposure when compared to those never exposed (aIRR 1.85 [95% CI, 1.44 2.39]; figure
- 3B). The aIRR remained elevated at >6-12 months of exposure (1.19 [0.84 1.68]) and >12-24 months of
- exposure (1.46 [1.13 1.88]), although the associations were weaker than within the first six months. After
- 298 24 months of exposure, aIRRs decreased to levels comparable to those with no INSTI-exposure (0.89 [0.62 –
- 299 1.29] and 0.96 [0.69 1.33] at >24–36 and >36 months, respectively)

- Fitting CD4 cell count, BMI, hypertension, diabetes, CKD, and dyslipidemia as time-updated variables yielded
- results consistent with the primary analysis, as was the case when adding time-updated platelet counts to the
- model, Table 2. In addition, all performed sensitivity analyses were consistent with the primary analysis, Table
- 304 2.
- 305 Although we did not have the statistical power to perform adjusted analyses, crude IR for MIs and strokes was
- 306 consistent with the primary analysis (numbers not shown). Moreover, as only 15% of total strokes caused by
- 307 cerebral hemorrhages, we could not meaningful separate ischemic and hemorrhagic strokes.
- We found no evidence suggesting that the association between INSTI-exposure and CVD differed according
- to baseline CVD risk score or age group ( $p_{interaction} = 0.27$  for both), indicating that the association was similar
- 310 in both younger and older individuals and individuals at high and low estimated CVD risk. Likewise, the
- association was similar before and after Jan 1, 2014 ( $p_{interaction} = 0.63$ ), and for men and women ( $p_{interaction} = 0.63$ ).
- 312 0.28).
- 313 Moreover, while we did not have adequate statistical power to stratify individuals based on treatment
- experience at baseline, we tested the interaction between INSTI-exposure and treatment experience at baseline
- defined as ART-naïves, ART-experienced with a VL ≥200 copies/mL, or ART-experienced with a VL <200
- 316 copies/mL, in a subsequent analysis. However, we found no evidence that the association differed between the
- 317 groups ( $p_{interaction} = 0.18$ ).
- 318 To further investigate the impact of immunologic and virologic status on the CVD risk, we conducted an
- exploratory post hoc analysis focused on the first six months after starting an INSTI; stratifying individuals
- according to good, poor, or intermediate immunologic and virologic markers<sup>28</sup> at the time of INSTI initiation
- 321 (good: CD4 count ≥500 cells/µL and VL <200 copies/mL, poor: CD4 count ≤350 cells/µL and VL >200
- 322 copies/mL intermediate: all other combinations respectively). However, we did not find any difference in the
- association between the groups (p = 0.20).

# **Discussion**

To our knowledge, this is the first assessment of a potential association between INSTI-exposure and the incidence of CVD, which applies data derived from a large and multi-national cohort of PLWH seen in routine clinical care, with prospectively collected data and rigorously defined and centrally adjudicated end-points. After accounting for CVD risk factors, we observed that INSTI use was associated with an almost two-fold greater CVD incidence in the first six months of exposure compared to no INSTI-exposure. Although the association was relatively weaker after the initial six months, it persisted until 24 months of exposure, after which the incidence decreased to levels comparable to that of no INSTI-exposure. Findings were consistent across a wide range of sensitivity analyses, with no evidence suggesting that the association between INSTI-exposure and CVD incidence differed according to underlying estimated CVD risk strata, age group, sex, calendar time, or immune/virologic status.

Randomised clinical trials (RCTs) and observational studies, including the RESPOND cohort itself, have suggested an association between INSTI use and increase in BMI,<sup>20–22</sup> especially within the first 12 months of initiating ART, and potentially also with metabolic syndrome.<sup>22</sup> Therefore, as higher BMI is associated with CVD, it could be hypothesised that INSTI-exposure might increase CVD risk over time. Conversely, we found a rapid increase in CVD incidence after INSTI initiation, which was no longer present beyond 24 months of exposure — a pattern of association different from that previously described for cumulative exposure to certain PIs<sup>7,8,13</sup> and recent exposure to ABC.<sup>8,9</sup> Nevertheless, the strength of the association, with an estimated relative risk increase of 85% within the first six months, and 46% between 12 to 24 months, were similar in magnitude to previous reports for both cumulative exposure boosted PIs and recent ABC exposure. If the association indeed turns out to be causal, it could imply that CVD develops quickly after INSTI initiation in individuals with a distinct underlying vulnerability. However, it is possible that unmeasured confounding may have played a part in our findings.

The increased likelihood of starting an INSTI in persons with a higher estimated 5-year CVD risk indicates at least some degree of confounding by indication, with individuals at risk of CVD preferentially starting an INSTI-based regimen. However, it is important to note that the association found between INSTI use and incident CVD remained after adjusting for CVD risk profiles, including ABC and other antiretroviral drugs previously associated with CVD. Further, the association was also observed for individuals with a low estimated 5-year CVD risk, suggesting that the findings cannot alone be explained by confounding by indication. Nevertheless, the lack of such an interaction warrants a cautious interpretation with the test's limited statistical power.

RESPOND's observational nature does not allow us to establish causality of the found association. However, we examined possible mediator effects in exploratory analyses, adjusting for any effects of time-updated BMI, hypertension, diabetes, dyslipidemia, and CKD. These adjustments showed no attenuation in CVD risk; therefore, none of these are likely to mediate it, consistent with these factors leading to CVD via slow developing atherosclerosis and would not account for the rapid increase in CVD rates as seen here. In addition, prior findings from RESPOND analyses examining incident dyslipidemia<sup>29</sup> and hypertension<sup>30</sup> have not found an increase in these events within a period that precedes or matches the increased CVD risk incidence seen here, although, the time of the event was not the main focus of these analyses Nevertheless, here we focused on the potential relationship between CVD and INSTIs more broadly, not restricting the population, and understanding the potential effects of INSTI-related weight gain is of increasing clinical interest. Therefore, future RESPOND studies will investigate potential associations between CVD risk factors and CVD in greater detail for the population experiencing weight gain related to INSTIs.

 Overall, the lack of an attenuated effect after adjusting for BMI and other known CVD-risk factors suggests one of two possible explanations: either that we have not captured the CVD risk factors through which INSTIs act to increase CVD adequately, or that the association is in fact not causal, and explained by unmeasured CVD risk factors in the INSTI-exposed population. A third possible explanation for our findings is that INSTIs can increase CVD risk via a different mechanism unrelated to known CVD risk factors. Such an effect could be similar to the drug-induced platelet hyperreactivity, suggested as the mechanisms linking ABC to CVD, 12 or the antibody-mediated clot formation and thrombocytopenia seen in vaccine-induced immune thrombotic thrombocytopenia. However, introducing time-update platelet count into our model did not affect the relative risk, although we cannot adequately address thrombocyte function and other potential pathways in this study. We encourage further examinations of the possible underlying mechanism for the association observed here in mechanistic studies.

INSTI treatment can cause a rapid increase in CD4 cell count in individuals initiating treatment with a low CD4 cell count. Therefore, increased occurrence of the immune-reconstitution-inflammatory syndrome, or a similar phenomenon, with immunological changes that could mimic symptoms of CVD or even cause type II, non-atherosclerotic, MIs could also be suspected to underlie our findings. However, it is important to underline that RESPOND's clinical event definitions exclude all suspected type II MIs and stroke cases due to other causes such as opportunistic infections and cancers. Moreover, in addition to the low number of ART-naïve individuals included here, there was no apparent difference seen in the first six months when stratifying individuals by CD4 cell count and VL at the time of INSTI initiation and the risk was similar for ART naïve, and ART experienced individuals. In addition, adding time-updated CD4 cell count to our model did not influence the CVD risk in any substantial way. Therefore, immune-reconstitution-inflammatory syndrome or

390 a related condition as an explanation seems unlikely — even though we did not assess CD4/CD8 ratios in these 391

analyses, as it is not available for all participants at present.

Focusing exclusively on those on INSTIs, using 0-6 months as a reference, lower CVD rates after 24 months 392

might be suggested. However, such an interpretation is not without caveats. If confounding by indication

explains the initial 0-6 months peak, a comparison with this group would be biased towards lower rates.

Moreover, to confirm a decrease >24 compared to 0-6 would require substantially longer follow-up to also

rule out an increase in CVD with long term exposure beyond 3 years.

Contrary to our findings here, no RCTs assessing INSTIs have reported a short-term increase in CVD incidence. 15-18 Nevertheless, it is worth noting that while RCTs are essential to determine ART efficacy and safety, they do generally not have the large sample size or duration of follow-up needed to uncover rarely occurring events such as CVD. Although investigations of CVD occurrence with INSTI-exposure are still scarce, a recently published US-based analysis showed no association between INSTI use and CVD.<sup>24</sup> Nevertheless, the analysis had a retrospective design, did not assess CVD incidence stratified by exposure time, and excluded CVD events occurring in the first three months of INSTI initiation. Therefore, an immediate effect may have been overlooked and further diluted by not accounting for events shortly after INSTI initiation. In addition, an older analysis from the US Veteran's Affairs cohort, assessing potential cardioprotective effects of atazanavir, reported hazard ratios of MI and stroke that were lower for atazanavir than for INSTI, in line with our findings. Even so, the study period of the analysis spanned from 2003-2015, and the INSTI group

408 409 410

411

412

413

414

415

422 423

393

394

395 396

397

398

399

400

401 402

403

404

405

406

407

There are several limitations of our analysis to address. Firstly, as this is an observational study, we cannot exclude the potential for residual confounders or channelling bias as discussed above. We have applied the same methodology developed and used in D:A:D pharmacovigilance analyses adjusting for a number of potential confounders and performed numerous consistent sensitivity analyses, interpreting results cautiously and conservatively.<sup>5-8</sup> Nevertheless, propensity score matching could have been considered an alternative to traditional regression analyses, even though such methods also have their limitations.

was relatively small, including only a limited number of individuals treated with second-generation INSTIs.<sup>23</sup>

416 Secondly, we did not have adequate analytical power to restrict the analyses to only include ART-naïve 417 individuals or provide reliable estimates for individual INSTIs use at present. Therefore, we assessed all 418 INSTIs collectively as a class for a combined population of ART-naïve and ART-experienced individuals; explored further, in post-hoc power calculation, we found less than 50% power to detect a 1.8-fold increase in 419 420 the incidence of CVD in the first 6 months of exposure to the most frequently used INSTI in RESPOND, DTG, 421 versus those not exposed to DTG.

We acknowledge there may be within-class differences in CVD risk among INSTIs, as shown for PIs, 13 and differences in CVD risk assessments. However, reporting on potential class effects follows that of earlier

studies, including D:A:D, and allows for timely reporting of a potential safety signal of currently used ART, 424 allowing for investigation in other studies and examination of potential mechanisms. 6-8 Assessments of CVD 425 incidence with cumulative use of individual INSTIs, stratified by ART experience, will be a focus area for 426 427 RESPOND going forward as follow-up time within the cohort increases. 428 Finally, as RESPOND only includes individuals naïve to INSTIs before 2012, we could not directly examine the relationship between CVD and use of NNRTIs or PI/b within the same analysis, as very few individuals 429 within the cohort were naïve to these two drug classes by Jan 1 2012, and thus the statistical power was 430 431 insufficient. 432 In summary, while we cannot exclude possible channelling bias and residual confounding, we found that after accounting for CVD risk factors — including the use of ABC — INSTI-exposure was associated with an 433 almost two-fold higher CVD risk in the first six months after INSTI initiation. The increased risk persisted up 434 to 24 months of use, albeit with lower risk. The association was similar in individuals with high and low 435 estimated CVD risk and across a wide range of sensitivity analyses. These early findings call for analyses in 436 437 other large studies, and the potential underlying mechanisms explored further..

# **Author contribution:**

BN, LG, AM, LR, and JDL proposed and developed the research question,

BN wrote the first draft of the manuscript.

LG conducted the statistical analyses.

JDL, JMM, KG-P, GW, CS, SDW, FW, LP, APM, CM, AC, CP, AM, JJV, AS, AVA, AC, LB-M, HFG, FR, RZ, HG, LDR, CN, MvdV, MM and CMU contributed to the study design, interpretation of data and revision of the manuscript.

BN, LG, AM, and LR have verified the underlying data

All authors have seen and contributed to the final version of the manuscript.

## **Potential conflicts of interest**

BN, LR, LDR, LBM no conflicts of interest

AM has received honoraria, consultancy fees, and/or travel support from ViiV, Gilead and Eiland and Bonnin PC.

A.P-M. has received an honorarium from Gilead Sciences outside the submitted work

HFG has received unrestricted research grants from Gilead Sciences and Roche, fees for data and safety monitoring board membership, for advisory board and consulting activities from Gilead Sciences, Merck, ViiV, Sandoz and Mepha.

AC has received research funding from Gilead Sciences, MSD and ViiV Healthcare; lecture and travel sponsorships from Gilead Sciences and ViiV Healthcare; and has served on advisory boards for Gilead Sciences, MSD and ViiV Healthcare.

JMM has received consulting honoraria and/or research grants from AbbVie, Angelini, Contract, Cubist, Genentech, Gilead Sciences, Jansen, Medtronic, MSD, Novartis, Pfizer, and ViiV Healthcare, outside the submitted work. JMM received a personal 80:20 research grant from Institut d'Investigacions Biomèdiques August Pi i Sunyer (IDIBAPS), Barcelona, Spain, during 2017–21.

# **Acknowledgements:**

The Australian HIV Observational Database (AHOD), Austrian HIV Cohort Study (AHIVCOS), CHU Saint-Pierre, EuroSIDA Cohort, Frankfurt HIV Cohort Study, Georgian National AIDS Health Information System (AIDS HIS):National AIDS Health Information System (AIDS HIS), Italian Cohort Naive Antiretrovirals (ICONA), Modena HIV Cohort, Nice HIV Cohort, PISCIS Cohort Study, Royal Free Hospital Cohort, San Raffaele Scientific Institute, Swedish InfCare HIV Cohort, Swiss HIV Cohort Study (SHCS), University

Hospital Bonn, University Hospital Cologne participates The International Cohort Consortium of Infectious Disease (RESPOND)

The full RESPOND study group can be found at <a href="https://www.chip.dk/Research/Studies/RESPOND/Study-group">https://www.chip.dk/Research/Studies/RESPOND/Study-group</a> and is listed in the Appendix.

# **Financial support:**

The International Cohort Consortium of Infectious Disease (RESPOND) has received funding from ViiV Healthcare LLC and Gilead Sciences. Additional support has been provided by participating cohorts contributing data in-kind and/or statistical support: Austrian HIV Cohort Study (AHIVCOS), The Australian HIV Observational Database (AHOD), CHU Saint-Pierre, University Hospital Cologne, EuroSIDA, Frankfurt HIV Cohort Study, Georgian National AIDS Health Information System (AIDS HIS), Modena HIV Cohort, San Raffaele Scientific Institute, Swiss HIV Cohort Study (SHCS), AIDS Therapy Evaluation in the Netherlands Cohort (ATHENA), Royal Free HIV Cohort Study.

# **Data sharing statements:**

The RESPOND Scientific Steering Committee (SSC) encourages the submission of concepts for research projects. Online research concepts (please see https://chip.dk/Portals/0/files/RESPOND/RESPOND%20governance%20and%20procedures v6 2019SEP3 0.pdf?ver=2019-10-02-144419-230) should be submitted to the **RESPOND** (respond.rigshospitalet@regionh.dk). The secretariat will direct the proposal to the relevant Scientific Interest Group, where the proposal will initially be discussed for scientific relevance before being submitted to the SSC for review.

Once submitted to the SSC, the research concept's scientific relevance, relevance to RESPOND's ongoing scientific agenda, design, statistical power, feasibility, and overlap with already approved projects will be evaluated. Upon completion of the review, feedback will be provided to the proposer(s). In some circumstances, a revision of the concept may be requested. If the concept is approved for implementation, a writing group will be established consisting of the proposers (up to 3 persons who were centrally involved in developing the concept), representatives from RESPOND cohorts, and representatives from the Statistical Department and Coordinating Center. All persons involved in the process of reviewing these research concepts are bound by confidentiality.

All data within RESPOND from individual cohorts are de-identified. The present RESPOND data structure and a list of all collected variables and their definition can be found in the latest version of "Standard Operating Procedure for data transfer in RESPOND, EuroSIDA, MISTRAL, and CARE," of the publicly available at <a href="https://chip.dk/Research/Studies/RESPOND/Study-documents">https://chip.dk/Research/Studies/RESPOND/Study-documents</a>.

inquiries regarding data-sharing, please For the RESPOND secretariat any contact (<a href="mailto:respond.rigshospitalet@regionh.dk">respond.rigshospitalet@regionh.dk</a>) Dorthe Research Coordination and Raben, Director of (Dorthe.raben@regionh.dk

## **REFERENCES**

- Trickey A, May MT, Vehreschild JJ, et al. Survival of HIV-positive patients starting antiretroviral therapy between 1996 and 2013: a collaborative analysis of cohort studies. *Lancet HIV* 2017; **4**: e349–56.
- Pelchen-Matthews A, Ryom L, Borges AH, et al. Aging and the evolution of comorbidities among HIV-positive individuals in a European cohort. *AIDS* 2018; **32**: 2405–16.
- 3 EACS Guidelines version 10.0, October 2019. 2019. https://www.eacsociety.org/media/guidelines-10.0\_final\_2\_2.pdf.
- Adolescents. P on AG for A and. Guidelines for the Use of Antiretroviral Agents in Adults and Adolescents Living with HIV. Department of Health and Human Services. 2018. internal-pdf://142.82.209.6/NIH HIV guidelines.pdf.
- Friis-Moller N, Sabin CA, Weber R, *et al.* Combination antiretroviral therapy and the risk of myocardial infarction. *N Engl J Med* 2003; **349**: 1993–2003.
- Friis-Moller N, Reiss P, Sabin CA, et al. Class of antiretroviral drugs and the risk of myocardial infarction. N Engl J Med 2007; **356**: 1723–35.
- Worm SW, Sabin C, Weber R, et al. Risk of myocardial infarction in patients with HIV infection exposed to specific individual antiretroviral drugs from the 3 major drug classes: the data collection on adverse events of anti-HIV drugs (D:A:D) study. J Infect Dis 2010; 201: 318–30.
- The DAD Study Group. Use of nucleoside reverse transcriptase inhibitors and risk of myocardial infarction in HIV-infected patients enrolled in the D:A:D study: a multi-cohort collaboration. *Lancet* 2008; **371**: 1417–26.
- The SMART/INSIGHT and the D:A:D Study Groups. Use of nucleoside reverse transcriptase inhibitors and risk of myocardial infarction in HIV-infected patients. *Aids* 2008; **22**. DOI:10.1097/QAD.0b013e32830fe35e.
- Ding X, Andraca-Carrera E, Cooper C, et al. No association of abacavir use with myocardial infarction: Findings of an FDA meta-analysis. *J Acquir Immune Defic Syndr* 2012; **61**: 441–7.
- Fontas E, Van Leth F, Sabin CA, et al. Lipid profiles in HIV-infected patients receiving combination antiretroviral therapy: Are different antiretroviral drugs associated with different lipid profiles? *J Infect Dis* 2004; **189**: 1056–74.
- Satchell CS, O'Halloran JA, Cotter AG, *et al.* Increased platelet reactivity in HIV-1-infected patients receiving abacavir-containing antiretroviral therapy. *J Infect Dis* 2011; **204**: 1202–10.
- Ryom L, Lundgren JD, El-Sadr W, et al. Cardiovascular disease and use of contemporary protease inhibitors: the D:A:D international prospective multicohort study. *Lancet HIV* 2018; **5**: e291–300.
- Ryom L, Lundgren JD, El-Sadr W, *et al.* Cardiovascular disease and use of contemporary protease inhibitors: the D:A:D international prospective multicohort study. *Lancet HIV* 2018; **5**: e291–300.
- Eron JJ, Young B, Cooper DA, et al. Switch to a raltegravir-based regimen versus continuation of a lopinavir-ritonavir-based regimen in stable HIV-infected patients with suppressed viraemia (SWITCHMRK 1 and 2): two multicentre, double-blind, randomised controlled trials. *Lancet* 2010. DOI:10.1016/S0140-6736(09)62041-9.

- Molina JM, Ward D, Brar I, et al. Switching to fixed-dose bictegravir, emtricitabine, and tenofovir alafenamide from dolutegravir plus abacavir and lamivudine in virologically suppressed adults with HIV-1: 48 week results of a randomised, double-blind, multicentre, active-controlled, phas. *Lancet HIV* 2018. DOI:10.1016/S2352-3018(18)30092-4.
- 17 Cahn P, Pozniak AL, Mingrone H, et al. Dolutegravir versus raltegravir in antiretroviral-experienced, integrase-inhibitor-naive adults with HIV: Week 48 results from the randomised, double-blind, non-inferiority SAILING study. *Lancet* 2013. DOI:10.1016/S0140-6736(13)61221-0.
- Molina JM, LaMarca A, Andrade-Villanueva J, *et al.* Efficacy and safety of once daily elvitegravir versus twice daily raltegravir in treatment-experienced patients with HIV-1 receiving a ritonavir-boosted protease inhibitor: randomised, double-blind, phase 3, non-inferiority study. *Lancet Infect Dis* 2012; **12**: 27–35.
- Molina JM, Lamarca A, Andrade-Villanueva J, et al. Efficacy and safety of once daily elvitegravir versus twice daily raltegravir in treatment-experienced patients with HIV-1 receiving a ritonavir-boosted protease inhibitor: randomised, double-blind, phase 3, non-inferiority study. *Lancet Infect Dis* 2012; **12**: 27–35.
- Calmy A, Tovar Sanchez T, Kouanfack C, et al. Dolutegravir-based and low-dose efavirenz-based regimen for the initial treatment of HIV-1 infection (NAMSAL): week 96 results from a two-group, multicentre, randomised, open label, phase 3 non-inferiority trial in Cameroon. *Lancet HIV* 2020; 7: e677–87.
- Loveleen Bansi-Matharu, on behalf of the RESPOND study Group. Associatioon Between Newer Antiretrovirals and Increase in Body Mass Index (BMI) in RESPOND. Virtual Conf. Retrovir.

  Opportunistic Infect. http://www.croiwebcasts.org/console/player/47554?mediaType=slideVideo&.
- Venter WDF, Sokhela S, Simmons B, *et al.* Dolutegravir with emtricitabine and tenofovir alafenamide or tenofovir disoproxil fumarate versus efavirenz, emtricitabine, and tenofovir disoproxil fumarate for initial treatment of HIV-1 infection (ADVANCE): week 96 results from a randomised, phase 3, n. *Lancet HIV* 2020; **7**: e666–76.
- Lafleur J, Bress AP, Rosenblatt L, *et al.* Cardiovascular outcomes among HIV-infected veterans receiving atazanavir. *Aids* 2017; **31**: 2095–106.
- O'Halloran JA, Sahrmann J, Butler AM, Olsen MA, Powderly WG. Brief Report: Integrase Strand Transfer Inhibitors Are Associated With Lower Risk of Incident Cardiovascular Disease in People Living With HIV. *J Acquir Immune Defic Syndr* 2020; **84**: 396–9.
- Neesgaard B, Mocroft A, Greenberg L, et al. How to RESPOND to Modern Challenges for People Living with HIV: A Profile for a New Cohort Consortium. *Microorganisms* 2020; **8**. DOI:10.3390/microorganisms8081164.
- Tunstall-Pedoe H, Kuulasmaa K, Amouyel P, Arveiler D, Rajakangas AM, Pajak A. Myocardial infarction and coronary deaths in the World Health Organization MONICA project: Registration procedures, event rates, and case-fatality rates in 38 populations from 21 countries in four continents. *Circulation* 1994. DOI:10.1161/01.cir.90.1.583.
- Monforte AD armini., Reiss P, Ryom L, et al. An updated prediction model of the global risk of cardiovascular disease in HIV-positive persons: The Data-collection on Adverse Effects of Anti-HIV Drugs (D:A:D) study. Eur J Prev Cardiol 2016; 27: 214–23.
- 28 The RESPOND Study Group. The interrelationship of smoking, CD4+ cell count, viral load and cancer

- in persons living with HIV. AIDS 2021; **35**: 747–57.
- The RESPOND Study Group. Incidence of dyslipidemia in people with HIV who are treated with integrase inhibitors versus other antiretroviral agents. *AIDS* 2021; **35**. DOI:10.1097/QAD.000000000002811.
- Byonanebye DM, on behalf of the RESPOND study Group. Incidence of hypertension in people living with HIV receiving InSTI versus other third-drug ART regimens in the RESPOND cohort. In: EACS 18th. London, 2021. https://eacs2021.abstractserver.com/program/#/details/presentations/372.
- 31 Greinacher A, Thiele T, Warkentin TE, Weisser K, Kyrle PA, Eichinger S. Thrombotic Thrombocytopenia after ChAdOx1 nCov-19 Vaccination. *N Engl J Med* 2021; : 1–10.

Table 1: Baseline demographics and clinical characteristics, overall and stratified by cardiovascular event

		<b>Overall,</b> $n = 29340$		<b>CVD Event,</b> $n = 748$		<b>No CVD Event,</b> $n = 28592$	
		n	(%)	n	(%)	n	(%)
C	Male	21818	(74-4)	655	(87-6)	21163	(74.0)
Sex	Female	7478	(25.5)	93	(12.4)	7385	(25.8)
	White	20419	(69.6)	611	(81.7)	19808	(69.3)
Ethnicity	Black	2983	(10.2)	20	(2.7)	2963	(10-4)
	Other	1267	(4.3)	15	$(2 \cdot 0)$	1252	(4.4)
	West Europe	12810	(43.7)	443	(59.2)	12367	(43.3)
G 11 1 1	South Europe and Argentina	6626	(22.6)	140	(18.7)	6486	(22.7)
Geographical region	North Europe and Australia	7069	(24·1)	129	(17.2)	6940	(24.3)
	East Europe	2832	(9.7)	36	(4.8)	2796	(9.8)
	Men sex with men	13229	(45.1)	362	(48.4)	12867	(45.0)
	Intraveneous drug use	3993	(13.6)	117	(15.6)	3876	(13.6)
Risk of HIV acquisition	Heterosexual sex	10253	(34.9)	216	(28.9)	10037	(35·1)
	Other	654	(2.2)	15	(2.0)	639	$(2 \cdot 2)$
	<200	11925	(40.6)	398	(53.2)	11527	(40.3)
CD4 cell nadir	200-350	8757	(29.8)	202	(27.0)	8555	(29.9)
(cells/μL)	350-500	4325	(14.7)	74	(9.9)	4251	(14.9)
	>500	4333	(14.8)	74	(9.9)	4259	(14.9)
Prior AIDS	Yes	5785	(19.7)	221	(29.5)	5564	(19.5)
	ART-naïve	7172	(24.4)	58	(7.8)	7114	(24.9)
ART treatment status	ART-experienced, VL <200 cp/mL	19951	(68.0)	647	(86.5)	19304	(67.5)
	ART-experienced, VL ≥200 cp/mL	2217	(7.6)	43	(5.7)	2174	(7.6)
	<18.5	873	(3.0)	18	(2.4)	855	(3.0)
BMI (kg/m²)	18.5 - <25	11321	(38.6)	335	(44.8)	10986	(38.4)
Divir (ng m )	25 - <30	1547	(5·3)	51	(6.8)	1496	(5.2)
	>30	5159	(17.6)	162	(21.7)	4997	(17.5)
	Never	8207	(28.0)	191	(25.5)	8016	(28.0)
Smoking status	Current	8196	(27.9)	305	(40.8)	7891	(27.6)
Smoking status	Previous	2261	(7.7)	90	(12.0)	2171	(7.6)
Hypertension <sup>±</sup>	Tievious	5683	(19.4)	330	(44.1)	5353	(18.7)
Diabetes <sup>‡</sup>		1170	(4.0)	99	(13.2)	1071	(3.7)
Dyslipidaemia <sup>+</sup>		17984	(61.3)	633	(84.6)	17351	(60.7)
Prior CKD <sup>T</sup>		541	(1.8)	44	(5.9)	497	(1.7)
Prior CVD <sup>1</sup>		666	(2·3)	94	(12.6)	572	(2.0)
		Median	IOR	Median	IOR	Median	IOR
Age (years)		44.3	(36·2-51·3)	53.4	(47.5-61.5)	44.0	(36.0-51.0)
CD4 (cells/µL)		524.0	(357.0-715.0)	554.0	(388·5-752·0)	523.0	(355.8-714.0)
Platelets (cells/nL)		200	(134-248)	213	(165-260)	200	(133-248)

Percentage of overall unknowns: ethnicity: 15·9, Risk of HIV acquisition: 4·1, Prior AIDS: 5·4, BMI: 35·6, smoking status: 36·4, hypertension: 17·5, diabetes: 20·8, CKD: 9·8, and CVD: 9·8

#### p<0.001 for all comparisons5

Abbreviations: HIV: human immunodeficiency virus, AIDS: Acquired Immune Deficiency Syndrome, µL: microliter, nL: nanoliter ART: antiretroviral therapy, VL: (HIV) viral load, cp: copies, BMI: body mass index, CKD: Chronic kidney disease, CVD: Cardiovascular disease, IQR: Interquartile range

<sup>\*</sup>Hypertension: Blood pressure systolic >140 mm Hg, diastolic >90 mm Hg or use of antihypertensive drugs

<sup>\*</sup>Diabetes: random blood glucose > 11·1 mmol/L, HbA1c > 48 mmol/mol, use of antidiabetic drugs or a noted diagnosis of diabetes

<sup>+</sup>Dyslipidimia: Total cholesterol >6.2 mmol/L, high-density lipoprotein (HDL)cholesterol <0.9 mmol/L, triglyceride >2.3 mmol/L, or use of lipid-lowering treatment)

 $<sup>^\</sup>intercal$ Prior CKD:  $\geq$ 2 estimated glomerular filtration rate (eGFR) measure <60 mL/min/1·73m²

<sup>&</sup>lt;sup>L</sup>Prior CVD: MI, stroke, and ICPs, (coronary angioplasty/stenting, coronary bypass surgery, and carotid endarterectomy)

Table 2: Adjusted incidence rate ratio by cumulative exposure to INSTIs, compared to no INSTI-exposure in exploratory- and sensitivity analyses.

#### **Cumulative INSTI-exposure**

		0 months	(reference)	>0 – 6 m	onths	>6 – 12 m	onths	>12 – 24 r	nonths	>24 – 36 r	nonths	>36 month	hs	Global p-values
		aIRR	Events	aIRR	Events	aIRR	Events	aIRR	Events	aIRR	Events	aIRR	Events	_
	n include	(95% CI)	(PYFU)	(95% CI)	(PYFU)	(95% CI)	(PYFU)	(95% CI)	(PYFU)	(95% CI)	(PYFU)	(95% CI)	(PYFU)	
Primary model <sup>†</sup>	29,340	1	506	1.85	69	1.19	34	1.46	69	0.89	31	0.96	39	<0.0001
1 mary moder - 29,340	(ref)	(120714)	(1.44 - 2.39)	(8154)	(0.84 - 1.68)	(6489)	$(1 \cdot 13 - 1 \cdot 88)$	(10327)	(0.62 - 1.29)	(7287)	(0.69 - 1.33)	(7938)	10 0001	
Model with time-updated factors on the potential	29,340	1	506	1.92	69	1.09	34	1.27	69	0.81	31	0.87	39	<0.0001
causal pathway *	27,540	(ref)	(120714)	(1.47 - 2.52)	(8154)	(0.74 - 1.61)	(6489)	(0.95 - 1.70)	(10327)	(0.54 - 1.22)	(7287)	(0.61 - 1.26)	(7938)	<0.0001
Model with time-updated factors on the potential causal	29.340	1	506	1.93	69	1.09	34	1.27	69	0.82	31	0.88	39	<0.0001
pathway + platelets <sup>△</sup>	29,340	(ref)	(120714)	(1.47 - 2.52)	(8154)	(0.74 – 1.61)	(6489)	(0.95 - 1.70)	(10327)	(0.54 - 1.23)	(7287)	(0.61 - 1.27)	(7938)	<0.0001
Model only adjusted for D:A:D 5-year CVD risk	20.340	1	506	2.07	69 1·29 34 1·61 69 1·00 31 1·11 39 <0·0001									
score g	29,340	(ref)	(120714)	$(1 \cdot 61 - 2 \cdot 66)$	(8154)	(0.91 - 1.83)	(6489)	$(1 \cdot 25 - 2 \cdot 07)$	(10327)	(0.70 - 1.45)	(7287)	(0.80 - 1.53)	(7938)	<0.0001
Excluding individuals with	28,674	1	445	1.83	60	1.12	29	1.36	58	0.86	27	0.97	35	0.0002
prior CVD at baseline #	26,074	(ref)	(118141)	(1.39 - 2.41)	(7976)	(0.77 - 1.63)	(6366)	(1.03 - 1.80)	(10111)	(0.58 - 1.28)	(7141)	(0.69 - 1.38)	(7731)	0.0002
Excluding ICPs from the	29,340	1	353	1.77	47	1.13	23	1.55	52	0.73	18	0.93	27	0.0003
composite CVD outcome <sup>6</sup>	Outcomo	(120714)	$(1 \cdot 30 - 2 \cdot 41)$	(8154)	(0.74 - 1.73)	(6489)	$(1 \cdot 15 - 2 \cdot 08)$	(10327)	(0.45 - 1.17)	(7287)	(0.63 - 1.38)	(7938)	0.0003	
Including only individuals who started/shifted regimen	20.792	1	118	1.76	73	1.18	38	1.41	74	0.98	37	1.03	44	0.0023
after Jan 1, 2012 ×		(ref)	34081	$(1 \cdot 31 - 2 \cdot 37)$	8609	(0.82 - 1.71)	6863	(1.05 - 1.89)	10922	(0.68 - 1.43)	7730	(0.72 - 1.46)	8412	0.0023
Including only centrally	21 100	1	145	1.37	26	1.30	22	1.33	48	0.93	27	0.88	34	
adjudicated CVD events ± 21,188	(ref)	(40886)	(0.89 - 2.12)	(4121)	(0.82 - 2.06)	(3744)	(0.93 - 1.90)	(7149)	(0.61 - 1.42)	(6006)	(0.59 - 1.31)	(7533)	0.22	

<sup>+</sup>primary model, adjusted for age (per 10 years older), sex (male, female), ethnicity (Black, White, other), region (West Europe, South Europe and Argentina, North Europe and Australia, East Europe), BMI (kg/m; <18·5, 18·5-<25, 25-<30 and >30), HIV acquisition risk (MSM, heterosesual contact IDU, CD4 cell count (per 100 cell/μL higher), hypertension (yes/no), diabetes (yes/no), prior CVD (yes/no), prior CVD (yes/no), diabetes (yes/no), all fixed at baseline. In addition smoking and antiretroviral drugs previously associated with CVD (cumulative exposure to indinavir, ritonavir-boosted lopinavir, didanosine, and recent ABC exposure [current or within six months]) were included in the model as time-updated variables.

Abbreviations: aIRR: adjusted Incidence rate ratio, 95% CI: 95 % confidence interval, PYFU: person years of follow-up, BMI: Body mass index, CVD: cardiovascular disease, CKD: chronic kidney disease, INSTI: integrase strand transfer inhibitor

<sup>\*</sup> As primary model, with BMI, hypertension, diabetes, dyslipidemia, CKD, and CD4 cell count fitted as time-updated variables instead of at baseline

<sup>△</sup> As primary model, with BMI, hypertension, diabetes, dyslipidemia, CKD, and CD4 cell count fitted as time-updated variables instead of at baseline + time-updated platelet count

m Model adjusted only for D:A:D 5-year CVD risk score at baseline

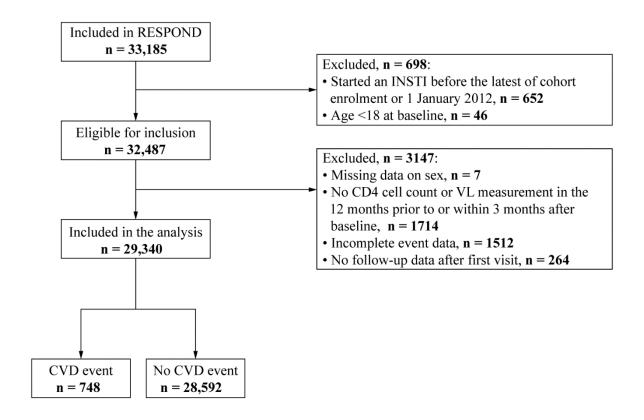
<sup>#</sup> As primary model, excluding individuals with prior CVD at baseline

Θ As primary model, excluding ICPs from the composite CVD outcome

<sup>×</sup> As primary model, including only individuals who started/shifted regimen after the RESPOND baseline, Jan 1, 2012

 $<sup>\</sup>pm$  As primary model, including only centrally validated CVD events. However, as the median time of CVD event was before the validation period, the model included a substantially lower number of events (302 vs 748) and had limited statistical power.

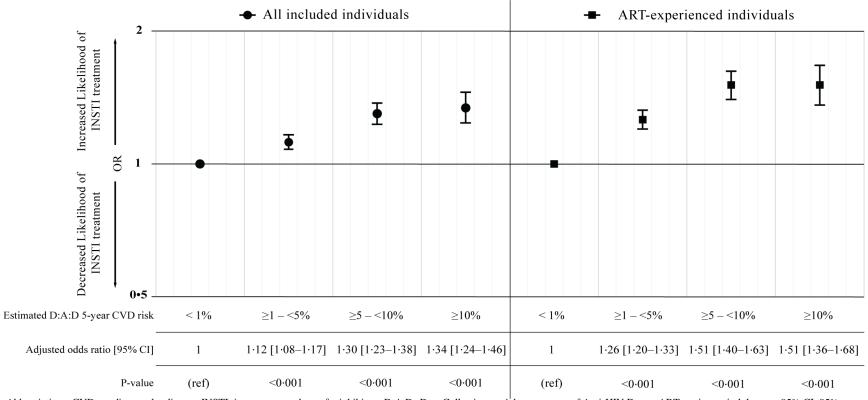
Figure 1: Flowchart depicting the participant inclusion process



Abbreviations. CVD: Cardiovascular disease, INSTI: integrase strand transfer inhibitor, VL: viral load

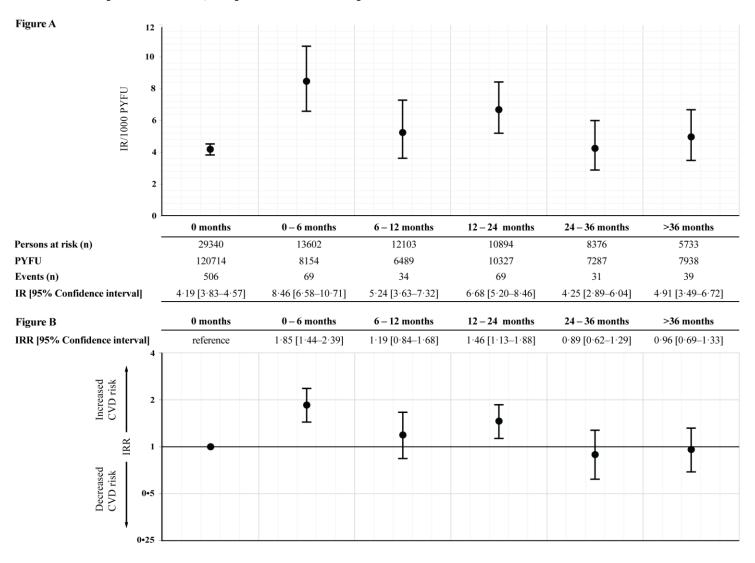
Note that more that one reason for exclusion may apply





Abbreviations: CVD: cardiovascular disease, INSTI: integrase strand transfer inhibitor, D:A:D: Data Collection on Adverse events of Anti-HIV Drugs, ART: antiretroviral therapy, 95% CI: 95% confidence interval

Figure 3: A: Crude IR of CVD/1000 PYFU by cumulative exposure to INSTIs. B: Adjusted incidence rate ration (IRR) by cumulative exposure to INSTIs, compared to no INSTI-exposure



Multivariable model adjusted for: age (per 10 years older), sex (male, female), ethnicity (Black, White, other), region (West Europe, South Europe and Argentina, North Europe and Australia, East Europe), BMI (kg/m; <18·5, 18·5-<25, 25-<30 and >30), HIV acquisition risk (MSM, heteroseksual contact IDU, CD4 cell count (per 100 cell/µL higher), hypertension (yes/no), diabetes (yes/no), prior AIDS (yes/no), prior CVD (yes/no), prior CKD (yes/no), dyslipidaemia (yes/no), all fixed at baseline. In addition Smoking and antiretroviral drugs previously associated with CVD (cumulative exposure to indinavir, ritonavir-boosted lopinavir, boosted darunavir, didanosine, and recent ABC exposure [current or within six months]) were included in the model as time-updated variables.

# Supplementary Table 1: Prior exposure as numbers, percentage and median cumulative exposure to specific drugs within different ART classes among individuals that did experience a CVD event during follow-up, stratified by INSTI exposed or not INSTI exposed during follow-u

		INSTI exposed	Not INSTI exposed		
ARVs	exposure	n = 242	n = 506		
PIs (IDV,LPV/r, DRV/b)	n	159	311		
	%	65.7 %	61.5%		
	Median cumulative exposure, months (IQR)	56 (22-114)	58 (23-95)		
NRTIs (ABC, DDI)	n	180	318		
	%	74.4%	62.8%		
	Median cumulative exposure, months (IQR)	72 (29-127)	79 (30-127)		
	n	103	245		
NNRTIS (EFV)	%	42.6%	48.4%		
	Median cumulative exposure, months (IQR)	49 (17-112)	53 (17-115)		

Abbreviations: PIs: protease inhibitors, ARVs: antiretroviral drugs, IDV: indinavir, LPV/r: ritonavir boosted lopinavir, DRV/b: cobicistat or ritonavir boosted darunavir, NRTI: nucleos(t)ide reverse transcriptase inhibitors, ABC: abacavir, DDI: Didanosine, NNRTI: non-nucleotide reverse transcriptase inhibitors, EFV: efavirenz, IQR: interquatile range, CVD: cardiovascular disease, INSTI: integrase inhibitor

Supplementary Table 2: Prior exposure as numbers, percentage and median cumulative exposure to specific drugs within different ART classes among individuals that did not experience a CVD event during follow-up, stratified by INSTI exposed or not INSTI exposed during follow-up

		INSTI exposed	Not INSTI exposed
ARVs	exposure	n = 13360	n =15232
PIs (IDV,LPV/r, DRV/b)	n	6944	7507
	%	52.0%	49.3%
	Median cumulative exposure, months (IQR)	49 (19-96)	51 (20-96)
NRTIs (ABC, DDI)	n	7830	6202
	%	58.6%	40.7%
	Median cumulative exposure, months (IQR)	53 (26-111)	64 (26-111)
NNRTIS (EFV)	n	4637	6657
	%	34.7%	43.7%
	Median cumulative exposure, months (IQR)	56 (16-111)	60 (19-115)

Abbreviations: PIs: protease inhibitors, ARVs: antiretroviral drugs, IDV: indinavir, LPV/r: ritonavir boosted lopinavir, DRV/b: cobicistat or ritonavir boosted darunavir, NRTI: nucleos(t)ide reverse transcriptase inhibitors, ABC: abacavir, DDI: Didanosine, NNRTI: non-nucleotide reverse transcriptase inhibitors, EFV: efavirenz, IQR: interquatile range, CVD: cardiovascular disease, INSTI: integrase inhibitor