



Aggression in Children: unraveling gene-environment interplay to inform Treatment and InterventiON strategies



European Commission Seventh Framework Programme

# Epigenome-wide association study meta-analysis of aggressive behavior

Jenny van Dongen Vrije Universiteit (VU) Amsterdam Netherlands Twin Register

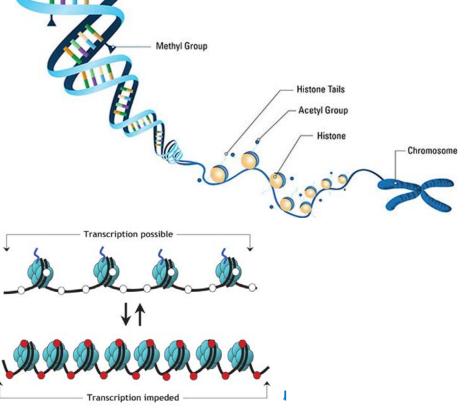


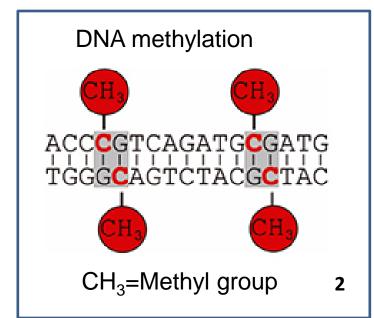


#### Epigenetic mechanisms



- Regulate gene expression, are transmitted during cell division to daughter cells.
  - Regulate ccessibility of DNA to transcription
  - DNA methylation at cytosine-guanine nucleotides = CpG sites
  - + many others (histone modifications, non-coding RNA etc)

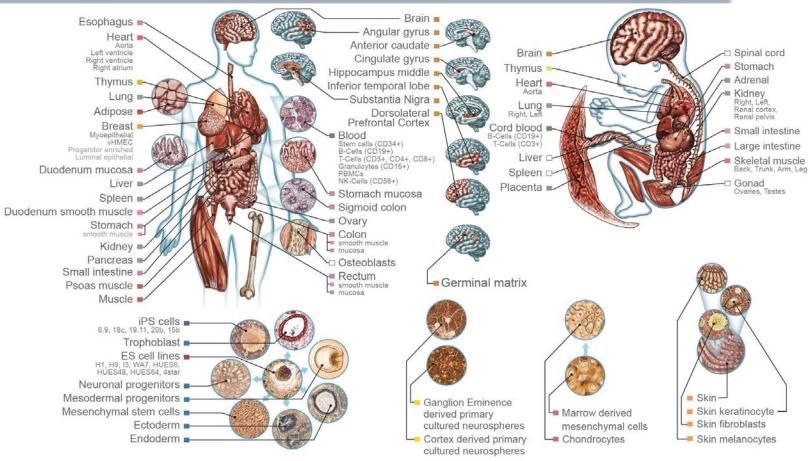






### Each cell has its own epigenome





Kundaje, A, et al. "Integrative analysis of 111 reference human epigenomes." Nature 518.7539 (2015): 317-330.



#### DNA methylation level - Aggression



Mean heritability ~19%, Illumina 450k, whole blood (refs 1,2) Environmental influences affecting DNA methylation: (maternal) smoking and diet, (early) life conditions



Genetic variants — DNA methylation — Aggression Environmental risk/protective factors — DNA methylation — Aggression

- 1. McRae et al Genome Biology (2014).
- 2. van Dongen J. et al. Nature Communications (2016).



#### DNA methylation - Aggression







Surrogate mother+ pear-rearing condition
Inadequate social skills, highly
aggressive, increased voluntary alcohol consumption

Provencal et al. The Signature of Maternal Rearing in the Methylome in Rhesus Macaque Prefrontal Cortex and T Cells. The Journal of Neuroscience 32.44 (2012): 15626-15642.



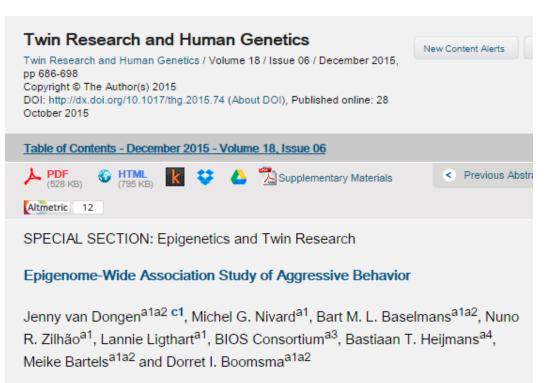
#### **DNA** methylation - Aggression



#### **Human studies:**

Provençal, Nadine, et al. "Differential DNA methylation regions in cytokine and transcription factor genomic loci associate with childhood physical aggression." PLoS one 8.8 (2013): e71691.

Guillemin, Claire, et al. "DNA methylation signature of childhood chronic physical aggression in T cells of both men and women." PloS one 9.1 (2014): e86822.



N= 2029, methylation (IL450k) blood, mean age= 36

**EWAS= Epigenome- wide Association Study** 



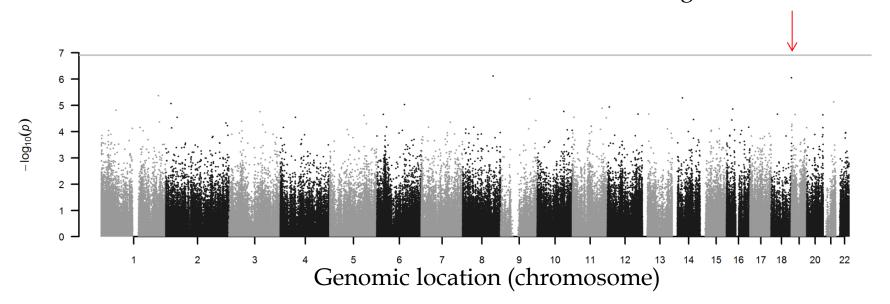


#### **Epigenome-wide association study in NTR(N=2029)**



High-ranking sites: significant enrichment of central nervous system Gene Ontologies







#### EWAS meta-analysis Aggression



- Invitation of cohorts (started January 29 2016)
- N cohorts invited: 31
  - Positive response: 10
  - Negative response: 19
    - Reason: no aggression data=15
    - Reason: no 450k methylation data=3
    - Reason unknown=1
  - Awaiting response to invitation/under consideration: 2 cohorts
- Detailed analysis plan and exemplary analysis scripts
- Summary statistics and cohort information shared through SFTP server



## Participating cohorts – June 18 2016



| Study    | Study                                                 | tissue | Aggression data                                                         | N    |
|----------|-------------------------------------------------------|--------|-------------------------------------------------------------------------|------|
| NTR      | Netherlands Twin<br>Register                          | PWB    | ASEBA Adult self-report (ASR) aggression scale                          | 2029 |
| FT12     | FinnTwin 12                                           | PWB    | Multidimensional Peer Nomination Inventory (MNPI) – aggressive behavior | 757  |
| GenR     | Generation R                                          | UCB    | Child Behavior Checklist (CBCL) 1½ – 5 years Aggressive Behavior scale  | 806  |
| LLD      | LifeLines-DEEP                                        | PWB    | "I am known for being short-tempered and irritable" (NEO personality)   | 683  |
| BSGS     | Brisbane Systems<br>Genetic Study                     | PWB    | Buss and Perry aggression questionnaire                                 | ?    |
| ALSPAC   | Avon Longitudinal<br>Study of Parents and<br>Children | PWB    | SQD conduct problem scale                                               | ~900 |
| NFBC1966 | Northern Finnish<br>Birth Cohort 1966                 | PWB    | "I lose my temper more quickly than most people"                        | 780  |
| NFBC1986 | Northern Finnish<br>Birth Cohort 1986                 | PWB    | ASEBA Youth self-report (YSR) aggression scale                          | 580  |
| Gecko    | Groningen Expert Center for Kids with Obesity         | ?      | SDQ conduct problem scale                                               | ?    |
| INMA     | Environment and<br>Childhood Project                  | PWB    | SDQ conduct problem scale                                               | 200  |

PWB= peripheral whole blood UCB = umbilical cord blood http://www.action-euproject.eu results uploaded (NTR,FT12,GenR, LLD):

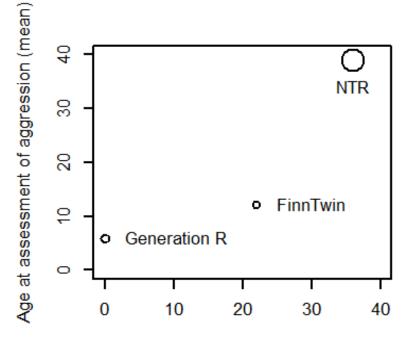
Expected N: >7000

4275



#### Meta-analysis first 3 aggression cohorts (N=3622)





P-value based fixed effects meta-analysis, R package gap

Age DNA methylation measurement (mean)

| Cohort                    | survey |      |       | Years methylation -<br>phenotype, (mean,<br>min:max) |
|---------------------------|--------|------|-------|------------------------------------------------------|
| Netherlands Twin Register | ASR    | 2059 | 36.4  | -2.6 (-10: 8)                                        |
| Generation R              | CBCL   | 806  | birth | 5,9 (5,2: 8,3)                                       |
| FinnTwin 12               | MNPI   | 757  | 22.43 | 10.43 (9:13)                                         |

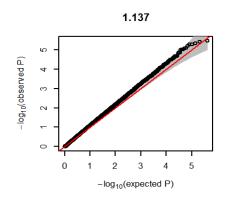
IIII.//www.action-euproject.eu



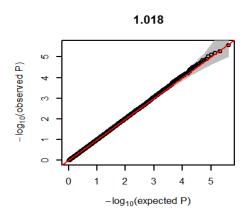
## Results - Genome-wide Bonferroni the shold or FDR < 0.05



- Model 1 no adjustment for BMI or smoking
- Netherlands Twin Register: 0
- FinnTwin: 0
- Generation R (umbilical cord blood DNA):
   1 CpG site (IL1B, p= 6.60E-08)
- Meta-analysis (Total N subjects=3622): 0



- Model 2 -BMI and smoking included as covariates
- Netherlands Twin Register: 0
- FinnTwin: 0
- Generation R: 0
- Meta-analysis (Total N subjects=3622): 0





### Exploratory meta-analysis



All sites

N= 400,230

•  $P < 1 \times 10^{-3}$  in any cohort

NTR: 534

Generation R: 427

FinnTwin 12: 719

 Promising CpGs taken forward to meta-analysis

**1679** 

Meta-analysis p < 2.978e-05? (0.05/1679)

22

• Same direction of effect?

2 cohorts

12

ZNF141; LOC100130522; GGA2; CPA4; CNST; MYNN; chr8:116684801; ACOT13/TTRAP; SGIP1; DENND4A; C10orf62/DHDPSL;GAK 3 cohorts

10

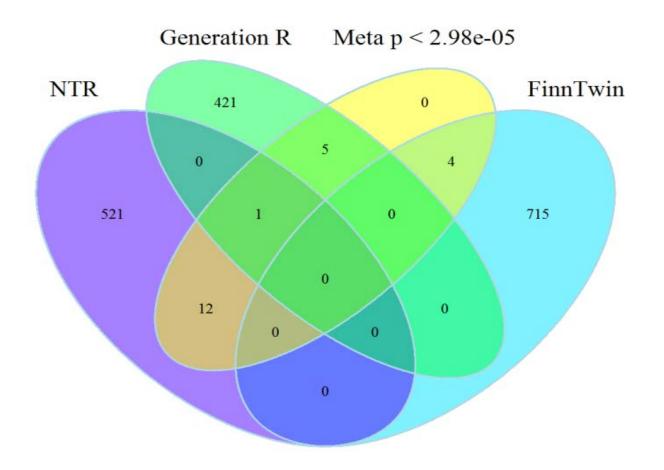
ZNF697; SND1; chr:12:117132552, LTBP1; TMEM44; IL1B; NRP2; SLAMF7; FZD5;chr1: 182059061

http://www.action-euproject.eu



# Overlap of 1679 promising probes (p < 0.001)







## Some highlights - sites from exploratory analysis with same direction of effect in all 3 cohorts



| cgid       | Gene   | Literature – gene function/ associated phenotypes                                                                                  | refs                                                                                                                                                                                                                      |
|------------|--------|------------------------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| cg18635064 | IL1B   | Cytokine; mediator of the acute phase response. Cytokines have previously been implicated in aggression.                           | Provençal, N. et al PLoS ONE 8, e69481 (2013)                                                                                                                                                                             |
| cg24680162 | ZNF697 | neuronal survival, differentiation, and synaptic plasticity.                                                                       | Chan Genomics Data 2015                                                                                                                                                                                                   |
| cg05068777 | SND1   | autism; fragile X syndrome; schizophrenia                                                                                          | Holt European Journal of Human Genetics (2010) 18, 1013–1019; Bittel Genetics in Medicine (2007) 9, 464–472; Fromer Nature 2014                                                                                           |
| cg14260773 | LTBP1  | alcohol consumption. TGF-beta signaling pathway: Azheimer's disease and schizophrenia, vascular development and vascular disease   | Pei 2012 PLOS ONE, Pannu AJMG 2005                                                                                                                                                                                        |
| cg18017245 | TMEM44 | Oculo auriculo vertebral spectrum; deletion of the region: autism, intellectual disability, diverse psychiatric disorders, obesity | Guida 2015 American Journal of Medical Genetics Part A; Biamino 2016 American Journal of Medical Genetics Part B: Neuropsychiatric Genetics; Yang Virology Journal20118:80 Volume 171, Issue 2, pages 290–299, March 2016 |
| cg05348875 | NRP2   | Cg05348875 methylation associated with prenatal maternal smoking. Gene associated with autism, mental retardation.                 | meta-analysis Joubert AJHG 2016                                                                                                                                                                                           |
| cg23844325 | SLAMF7 | Gene methylation associated with posttraumatic stress disorder; alcohol dependence in mouse model                                  | Uddin Proc Natl Acad Sci U S A. 2010                                                                                                                                                                                      |
| cg01201797 | FZD5   | Wnt receptor. Wnt signalling is involved in synapse formation                                                                      | see: Okerlund Journal of Neurodevelopmental Disorders 2011 3:9083                                                                                                                                                         |





- Extra cohorts to join: Brisbane Systems Genetic Study, ALSPAC, NFBC1966 and NFBC1986, Gecko, INMA + 2 more under consideration
- Still welcoming additional cohorts
- Follow-up analyses integrating methylation and gene expression data (RNA-seq and/or microarray)
- We are looking for cross-tissue replication cohort (cohort with aggression and methylation in e.g. brain, buccal, skin etc)

- We are working on a similar project for subjective wellbeing
- Suggestions for cohorts with IL450k/IL850k methylation and aggression or wellbeing data welcome!

#### email

j.van.dongen@vu.nl



## Acknowledgements



Khadeeja Ismail Rosa Mulder Marc Jan Bonder Bart M. L. Baselmans Michel G. Nivard Rick Jansen **Lannie Ligthart** Miina Ollikainen Eero Vuoksimaa Lude Franke Henning W. Tiemeier Jaakko Kaprio Meike Bartels Dorret I. Boomsma



This study was funded by: ACTION. ACTION receives funding from the European Union Seventh Framework Program (FP7/2007-2013) BBRMI-NL-financed BIOS Consortium (NWO 184.021.007)





## Thank you for your attention

**email** j.van.dongen@vu.nl