# Unveiling Spatial Epidemiology of HIV with Mobile Phone Data Supplementary Information

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In this document we provide following supplementary information:

## Ivory Coast departments map

Figure S1 shows boundaries of Ivory Coast departments with corresponding *id* numbers used in our study.

## **Features Description**

Tables S2 and S3 display the feature names and their descriptions. The marked features (\*) are those included in the best SVR-RFE models.

## **HIV** estimates

HIV estimates at department level from national population-based surveys (source Joseph Larmarange and Victoria Bendaud, AIDS 2014) are provided in Table S1.

## **Features Contribution**

Figure S2 reveals results of features contribution analysis for features ranked from  $4^{th}$  to  $6^{th}$  place in recursive feature elimination procedure.



Figure S1: Departments of Ivory Coast. We used open source QGIS software (http://www.qgis.org) to create map.

|                 | HIV prevalence esti |                | indicators      |
|-----------------|---------------------|----------------|-----------------|
| Department ID   | Department Name     | HIV prevalence | Quality         |
| 1               | Abengourou          | 2.70           | good            |
| 2               | Abidjan             | 3.60           | good            |
| 3               | Aboisso             | 3.20           | uncertain       |
| 4               | Adzopé              | 4.70           | uncertain       |
| 5               | Agboville           | 3.10           | uncertain       |
| 6               | Agnibilkrou         | 3.20           | moderately good |
| 7               | Bangolo             | 3.30           | uncertain       |
| 8               | Béoumi              | 2.50           | uncertain       |
| 9               | Biankouma           | 2.00           | uncertain       |
| 10              | Bondoukou           | 1.70           | moderately good |
| 11              | Bongouanou          | 3.30           | uncertain       |
| 12              | Bouaflé             | 2.50           | uncertain       |
| 13              | Bouaké              | 3.10           | good            |
| 14              | Bouna               | 2.00           | uncertain       |
| 15              | Boundiali           | 1.40           | uncertain       |
| 16              | Dabakala            | 2.50           | uncertain       |
| 17              | Daloa               | 1.90           | uncertain       |
| 18              | Danané              | 2.10           | uncertain       |
| 19              | Daoukro             | 3.80           | uncertain       |
| 20              | Dimbokro            | 2.30           | uncertain       |
| $\frac{20}{21}$ | Divo                | 2.00           | uncertain       |
| $\frac{21}{22}$ | Duékoué             | 3.80           | uncertain       |
| 22              | Ferkessédougou      | 2.90           | uncertain       |
| $\frac{23}{24}$ | Gagnoa              | 2.00           | uncertain       |
| $24 \\ 25$      | Grand-Lahou         | 2.00<br>2.20   | uncertain       |
| 26              | Guiglo              | 3.20           | moderately good |
| $20 \\ 27$      | Issia               | 1.90           | uncertain       |
| 28              | Katiola             | 4.00           | uncertain       |
| 29              | Korhogo             | 2.30           | good            |
| $\frac{29}{30}$ | Lakota              | 2.00           | uncertain       |
| 31              | Man                 | 2.80           | moderately good |
| 32              | Mankono             | 2.80<br>2.10   | moderately good |
| 32<br>33        | Mahiakro            | 3.00           | uncertain       |
| 33              | Odienné             | 1.70           | moderately good |
| $34 \\ 35$      |                     |                |                 |
|                 | Oumé                | 2.50           | uncertain       |
| 36<br>27        | Sakassou            | 1.70           | uncertain       |
| 37              | San-Pédro           | 3.30           | moderately good |
| 38              | Sassandra           | 3.50           | uncertain       |
| 39              | Séguéla             | 1.80           | uncertain       |
| 40              | Sinfra              | 2.50           | uncertain       |
| 41              | Soubré              | 2.80           | moderately good |
| 42              | Tabou               | 5.70           | uncertain       |
| 43              | Tanda               | 2.10           | moderately good |
| 44              | Tengréla            | 0.60           | uncertain       |
| 45              | Tiassalé            | 2.60           | uncertain       |
| 46              | Touba               | 1.60           | moderately good |
| 47              | Toumodi             | 2.60           | uncertain       |
| 48              | Vavoua              | 1.30           | uncertain       |
| 49              | Yamoussoukro        | 3.10           | moderately good |
| 50              | Zuénoula            | 1.10           | uncertain       |

Table S1: HIV prevalence estimates with quality indicators

| Feature Name                 | Description  |
|------------------------------|--|
| Connectivity-Inner*          | Sum of inner calls in department divided by population of depart |
|                              | ment   |
| Connectivity-Orig*           | Sum of calls originating from department divided by population   |
|                              | of department  |
| Connectivity-Term*           | Sum of calls terminating in department divided by population o   |
|                              | department   |
| Connectivity-All*            | Sum of all calls in department divided by population of depart   |
|                              | ment   |
| Connectivity-Weekday*        | Sum of all calls in department during weekdays divided by popu   |
|                              | lation of department   |
| Connectivity-Weekend         | Sum of all calls in department during weekends divided by popu   |
|                              | lation of department   |
| Connectivity-Weekday-00-08h  | Sum of all calls in department during weekdays in 00-08h time    |
| ° °                          | interval divided by population of department                     |
| Connectivity-Weekday-08-16h* | Sum of all calls in department during weekdays in 08-16h time    |
| U U                          | interval divided by population of department                     |
| Connectivity-Weekday-16-24h* | Sum of all calls in department during weekdays in 16-24h time    |
| 5 5                          | interval divided by population of department                     |
| Connectivity-Weekend-00-08h* | Sum of all calls in department during weekends in 00-08h time    |
| U U                          | interval divided by population of department                     |
| Connectivity-Weekend-08-16h  | Sum of all calls in department during weekends in 08-16h time    |
|                              | interval divided by population of department                     |
| Connectivity-Weekend-16-24h  | Sum of all calls in department during weekends in 16-24h time    |
|                              | interval divided by population of department                     |
| Connectivity-Weekday-00h     | Sum of all calls in department during weekdays in 00-01h time    |
|                              | interval divided by population of department                     |
| Connectivity-Weekday-01h*    | Sum of all calls in department during weekdays in 01-02h time    |
|                              | interval divided by population of department                     |
| Connectivity-Weekday-02h*    | Sum of all calls in department during weekdays in 02-03h time    |
|                              | interval divided by population of department                     |
| Connectivity-Weekday-03h*    | Sum of all calls in department during weekdays in 03-04h time    |
|                              | interval divided by population of department                     |
| Connectivity-Weekday-04h     | Sum of all calls in department during weekdays in 04-05h time    |
|                              | interval divided by population of department                     |
| Connectivity-Weekday-05h     | Sum of all calls in department during weekdays in 05-06h time    |
|                              | interval divided by population of department                     |
| Connectivity-Weekday-06h*    | Sum of all calls in department during weekdays in 06-07h time    |
|                              | interval divided by population of department                     |
| Connectivity-Weekday-07h     | Sum of all calls in department during weekdays in 07-08h time    |
| connectivity weekaay offi    | interval divided by population of department                     |
| Connectivity-Weekday-08h*    | Sum of all calls in department during weekdays in 08-09h time    |
| connectivity treenday con    | interval divided by population of department                     |
| Connectivity-Weekday-09h*    | Sum of all calls in department during weekdays in 09-10h time    |
| Connectivity meenday-001     | interval divided by population of department                     |
| Connectivity-Weekday-10h*    | Sum of all calls in department during weekdays in 10-11h time    |
| Connectivity- weekday-1011   | interval divided by population of department                     |
| Connectivity-Weekday-11h*    | Sum of all calls in department during weekdays in 11-12h time    |
| Connectivity-weekuay-1111    | interval divided by population of department                     |
| Connectivity-Weekday-12h*    | Sum of all calls in department during weekdays in 12-13h time    |
|                              | T Sum of all cans in department during weekdays in 12-131 tille  |

| Feature Name                      | Description   |
|-----------------------------------|---|
| Connectivity-Weekday-13h*         | Sum of all calls in department during weekdays in 13-14h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekday-14h*         | Sum of all calls in department during weekdays in 14-15h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekday-15h*         | Sum of all calls in department during weekdays in 15-16h time |
| U U                               | interval divided by population of department                  |
| Connectivity-Weekday-16h*         | Sum of all calls in department during weekdays in 16-17h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekday-17h*         | Sum of all calls in department during weekdays in 17-18h time |
| Connectivity-weekday-1711         | interval divided by population of department                  |
| Connectivity-Weekday-18h          | Sum of all calls in department during weekdays in 18-19h time |
| Connectivity-weekday-18h          | interval divided by population of department                  |
| Course attaction We also have 10h |   |
| Connectivity-Weekday-19h          | Sum of all calls in department during weekdays in 19-20h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekday-20h          | Sum of all calls in department during weekdays in 20-21h time |
| ~                                 | interval divided by population of department                  |
| Connectivity-Weekday-21h          | Sum of all calls in department during weekdays in 21-22h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekday-22h          | Sum of all calls in department during weekdays in 22-23h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekday-23h*         | Sum of all calls in department during weekdays in 23-00h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekend-00h*         | Sum of all calls in department during weekends in 00-01h time |
| ·                                 | interval divided by population of department                  |
| Connectivity-Weekend-01h*         | Sum of all calls in department during weekends in 01-02h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekend-02h*         | Sum of all calls in department during weekends in 02-03h time |
| Connectivity Weekend 02h          | interval divided by population of department                  |
| Connectivity-Weekend-03h*         | Sum of all calls in department during weekends in 03-04h time |
| Connectivity Weekend oon          | interval divided by population of department                  |
| Connectivity-Weekend-04h          | Sum of all calls in department during weekends in 04-05h time |
| Connectivity-weekend-04n          |   |
| Commentionites Westernel Off      | interval divided by population of department                  |
| Connectivity-Weekend-05h          | Sum of all calls in department during weekends in 05-06h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekend-06h*         | Sum of all calls in department during weekends in 06-07h time |
|                                   | interval divided by population of department                  |
| $Connectivity-Weekend-07h^*$      | Sum of all calls in department during weekends in 07-08h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekend-08h          | Sum of all calls in department during weekends in 08-09h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekend- $09h^*$     | Sum of all calls in department during weekends in 09-10h time |
|                                   | interval divided by population of department                  |
| Connectivity-Weekend-10h*         | Sum of all calls in department during weekends in 10-11h time |
| •                                 | interval divided by population of department                  |
| Connectivity-Weekend-11h*         | Sum of all calls in department during weekends in 11-12h time |
| J                                 | interval divided by population of department                  |
| Connectivity-Weekend-12h          | Sum of all calls in department during weekends in 12-13h time |
| connectivity meetend 1211         | interval divided by population of department                  |
| Connectivity Weekend 12h          | Sum of all calls in department during weekends in 13-14h time |
| Connectivity-Weekend-13h          |   |
|                                   | interval divided by population of department                  |
| Connectivity-Weekend-14h          | Sum of all calls in department during weekends in 14-15h time |
|                                   | interval divided by population of department                  |

| Feature Name                  | Description  |
|-------------------------------|--|
| Connectivity-Weekend-15h      | Sum of all calls in department during weekends in 15-16h time    |
| ·                             | interval divided by population of department                     |
| Connectivity-Weekend-16h      | Sum of all calls in department during weekends in 16-17h time    |
|                               | interval divided by population of department                     |
| Connectivity-Weekend-17h*     | Sum of all calls in department during weekends in 17-18h time    |
| ·                             | interval divided by population of department                     |
| Connectivity-Weekend-18h      | Sum of all calls in department during weekends in 18-19h time    |
| Ũ                             | interval divided by population of department                     |
| Connectivity-Weekend-19h      | Sum of all calls in department during weekends in 19-20h time    |
| Ũ                             | interval divided by population of department                     |
| Connectivity-Weekend-20h      | Sum of all calls in department during weekends in 20-21h time    |
| Ũ                             | interval divided by population of department                     |
| Connectivity-Weekend-21h      | Sum of all calls in department during weekends in 21-22h time    |
| ·                             | interval divided by population of department                     |
| Connectivity-Weekend-22h      | Sum of all calls in department during weekends in 22-23h time    |
| ·                             | interval divided by population of department                     |
| Connectivity-Weekend-23h      | Sum of all calls in department during weekends in 23-00h time    |
| Ũ                             | interval divided by population of department                     |
| Average-Inner-Call-Duration   | Sum of durations of inner calls in department divided by number  |
| 0                             | of calls   |
| Average-Orig-Call-Duration    | Sum of durations of originating calls in department divided by   |
|                               | number of calls  |
| Average-Term-Call-Duration    | Sum of durations of originating calls in department divided by   |
| 0                             | number of calls  |
| Average-Call-Duration         | Sum of durations of all calls in department divided by number of |
| 0                             | calls  |
| Average-Call-Duration-Weekday | Sum of durations of all calls in department during weekdays di-  |
|                               | vided by number of calls   |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekends di-  |
| Weekend*                      | vided by number of calls   |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekdays in   |
| Weekday-00-08h*               | time interval 00-08h divided by number of calls                  |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekdays in   |
| Weekday-08-16h                | time interval 08-16h divided by number of calls                  |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekdays in   |
| Weekday-16-24h                | time interval 16-24h divided by number of calls                  |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekends in   |
| Weekend-00-08h*               | time interval 00-08h divided by number of calls                  |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekends in   |
| Weekend-08-016h*              | time interval 08-16h divided by number of calls                  |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekends in   |
| Weekend-16-24h                | time interval 16-24h divided by number of calls                  |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekdays in   |
| Weekday-00h                   | time interval 00-01h divided by number of calls                  |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekdays in   |
| Weekday-01h*                  | time interval 01-02h divided by number of calls                  |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekdays in   |
| Weekday-02h*                  | time interval 02-03h divided by number of calls                  |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekdays in   |
| Weekday-03h*                  | time interval 03-04h divided by number of calls                  |
| Average-Call-Duration-        | Sum of durations of all calls in department during weekdays in   |
| Weekday-04h                   | time interval 04-05h divided by number of calls                  |

| Feature Name           | Description  |
|------------------------|--|
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-05h*           | time interval 05-06h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-06h*           | time interval 06-07h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-07h*           | time interval 07-08h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-08h            | time interval 08-09h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-09h            | time interval 09-10h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-10h            | time interval 10-11h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-11h            | time interval 11-12h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-12h*           | time interval 12-13h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-13h*           | time interval 13-14h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-14h            | time interval 14-15h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-15h            | time interval 15-16h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-16h            | time interval 16-17h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-17h            | time interval 17-18h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-18h            | time interval 18-19h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-19h            | time interval 19-20h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-20h            | time interval 20-21h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-21h*           | time interval 21-22h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-22h            | time interval 22-23h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekdays in |
| Weekday-23h*           | time interval 23-00h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekends in |
| Weekend-00h            | time interval 00-01h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekends in |
| Weekend- $01h^*$       | time interval 01-02h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekends in |
| Weekend- $02h^*$       | time interval 02-03h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekends in |
| Weekend- $03h^*$       | time interval 03-04h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekends in |
| Weekend-04h            | time interval 04-05h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekends in |
| Weekend-05h*           | time interval 05-06h divided by number of calls                |
| Average-Call-Duration- | Sum of durations of all calls in department during weekends in |
| Weekend-06h*           | time interval 06-07h divided by number of calls                |

| Feature Name             | Description  |
|--------------------------|--|
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend- $07h^*$         | time interval 07-08h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend- $08h^*$         | time interval 08-09h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-09h              | time interval 09-10h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-10h              | time interval 10-11h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-11h              | time interval 11-12h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend- $12h^*$         | time interval 12-13h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-13h <sup>*</sup> | time interval 13-14h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-14h*             | time interval 14-15h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-15h*             | time interval 15-16h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-16h*             | time interval 16-17h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-17h              | time interval 17-18h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-18h              | time interval 18-19h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-19h              | time interval 19-20h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-20h              | time interval 20-21h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-21h              | time interval 21-22h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend-22h              | time interval 22-23h divided by number of calls                |
| Average-Call-Duration-   | Sum of durations of all calls in department during weekends in |
| Weekend- $23h^*$         | time interval 23-00h divided by number of calls                |

Table S3: Features descriptions for SET3.

| Feature Name               | Description  |
|----------------------------|--|
| Gyration-All               | 95 percentile of the distribution of user's radius of gyration for all |
|                            | visited locations  |
| Gyration-Night*            | 95 percentile of the distribution of user's radius of gyration for     |
|                            | locations visited during nigth hours 22h-05h                           |
| Gyration-Weekday           | 95 percentile of the distribution of user's radius of gyration for     |
|                            | locations visited during weekdays                                      |
| Gyration-Weekday-Night*    | 95 percentile of the distribution of user's radius of gyration for     |
|                            | locations visited during weekdays nigth hours 22h-05h                  |
| Gyration-Weekend           | 95 percentile of the distribution of user's radius of gyration for     |
|                            | locations visited during weekend hours                                 |
| $Gyration-Weekend-Night^*$ | 95 percentile of the distribution of user's radius of gyration for     |
|                            | locations visited during weekend nigth hours 22h-05h                   |
| Diameter-All               | 95 percentile of the distribution of user's diameter of convex hull    |
|                            | for all visited locations  |

| Feature Name            | Description  |
|-------------------------|--|
| Diameter-Night          | 95 percentile of the distribution of user's diameter of convex hull  |
|                         | for locations visited during nigth hours 22h-05h                     |
| Diameter-Weekday        | 95 percentile of the distribution of user's diameter of convex hull  |
|                         | for locations visited during weekdays                                |
| Diameter-Weekday-Night  | 95 percentile of the distribution of user's diameter of convex hull  |
| v C                     | for locations visited during weekdays nigth hours 22h-05h            |
| Diameter-Weekend        | 95 percentile of the distribution of user's diameter of convex hull  |
|                         | for locations visited during weekend hours                           |
| Diameter-Weekend-Night  | 95 percentile of the distribution of user's diameter of convex hull  |
| 0                       | for locations visited during weekend night hours 22h-05h             |
| Area-All                | 95 percentile of the distribution of user's area of convex hull for  |
|                         | all visited locations  |
| Area-Night              | 95 percentile of the distribution of user's area of convex hull for  |
| 11100 10910             | locations visited during night hours 22h-05h                         |
| Area-Weekday*           | Locations visited during weekday hours                               |
| Area-Weekday-Night*     | Locations visited during weekday night hours                         |
| Area-Weekend*           | Locations visited during weekend hours                               |
| Area-Weekend-Night      | Locations visited during weekend nours                               |
| Perimeter-All           | 95 percentile of the distribution of user's perimeter of convex hull |
| I enmeter-An            | for all visited locations  |
| Perimeter-Night         | 95 percentile of the distribution of user's perimeter of convex hull |
| i ennieter-night        |  |
| Depire at an Weelsdow   | during night hours   |
| Perimeter-Weekday       | 95 percentile of the distribution of user's perimeter of convex hull |
|                         | during weekday hours   |
| Perimeter-Weekday-Night | 95 percentile of the distribution of user's perimeter of convex hull |
|                         | during weekday night hours   |
| Perimeter-Weekend       | 95 percentile of the distribution of user's perimeter of convex hull |
|                         | during weekend hours   |
| Perimeter-Weekend-Night | 95 percentile of the distribution of user's perimeter of convex hull |
|                         | during weekend night hours   |
| Distance-All            | 95 percentile of the distribution of user's sum of distances derived |
|                         | from sequences of visited locations                                  |
| Out-Migration-Overall*  | Sum of all users' mobilities out of home department divided by       |
|                         | population of home department  |
| Out-Migration-1day      | Sum of users' mobilities out of home department that last more       |
|                         | than 1 day divided by population of home department                  |
| Out-Migration-2days     | Sum of users' mobilities out of home department that last more       |
|                         | than 2 days divided by population of home department                 |
| Out-Migration-3days     | Sum of users' mobilities out of home department that last more       |
|                         | than 3 days divided by population of home department                 |
| Out-Migration-4days     | Sum of users' mobilities out of home department that last more       |
|                         | than 4 days divided by population of home department                 |
| Out-Migration-5days     | Sum of users' mobilities out of home department that last more       |
|                         | than 5 days divided by population of home department                 |
| Out-Migration-6days     | Sum of users' mobilities out of home department that last more       |
|                         | than 6 days divided by population of home department                 |
| Out-Migration-7days     | Sum of users' mobilities out of home department that last more       |
|                         | than 7 days divided by population of home department                 |
| Out-Migration-8days     | Sum of users' mobilities out of home department that last more       |
| -                       | than 8 days divided by population of home department                 |
| Out-Migration-9days     | Sum of users' mobilities out of home department that last more       |
| - *                     | than 9 days divided by population of home department                 |
|                         |  |

| Sum of users' mobilities out of home department that last more<br>than 10 days divided by population of home department<br>Sum of all users' mobilities into observed department from other<br>departments divided by corresponding populations<br>Sum of all users' mobilities into observed department from other<br>departments that last more than 1 day divided by corresponding |
|---|
| Sum of all users' mobilities into observed department from other<br>departments divided by corresponding populations<br>Sum of all users' mobilities into observed department from other  |
| Sum of all users' mobilities into observed department from other  |
|   |
|   |
| populations   |
| Sum of all users' mobilities into observed department from other<br>departments that last more than 2 day divided by corresponding<br>populations   |
| Sum of all users' mobilities into observed department from other  |
| departments that last more than 3 day divided by corresponding<br>populations   |
| Sum of all users' mobilities into observed department from other  |
| departments that last more than 4 day divided by corresponding<br>populations   |
| Sum of all users' mobilities into observed department from other  |
| departments that last more than 5 day divided by corresponding populations  |
| Sum of all users' mobilities into observed department from other  |
| departments that last more than 6 day divided by corresponding  |
| populations   |
| Sum of all users' mobilities into observed department from other  |
| departments that last more than 7 day divided by corresponding  |
| populations<br>Sum of all users' mobilities into observed department from other   |
| departments that last more than 8 day divided by corresponding<br>populations   |
| Sum of all users' mobilities into observed department from other  |
| departments that last more than 9 day divided by corresponding populations  |
| Sum of all users' mobilities into observed department from other<br>departments that last more than 10 days divided by corresponding  |
| populations   |
| Sum of all users' activities (calls/SMS) in department divided by population of department  |
| Sum of all users' activities (calls/SMS) in department during   |
| weekdays divided by population of department  |
| Sum of all users' activities (calls/SMS) in department during weekends divided by population of department  |
| Sum of all users' activities (calls/SMS) in department during   |
| weekdays in 00-08h time interval divided by population of de-<br>partment   |
| Sum of all users' activities (calls/SMS) in department during   |
| weekdays in 08-16h time interval divided by population of de-   |
| partment  |
| Sum of all users' activities (calls/SMS) in department during weekdays in 16-24h time interval divided by population of de-   |
| partment  |
| Sum of all users' activities (calls/SMS) in department during weekends in 00-08h time interval divided by population of de-   |
| partment  |
|   |

| Feature Name             | Description  |
|--------------------------|--|
| Activity-Weekend-08-016h | Sum of all users' activities (calls/SMS) in department during<br>weekends in 08-16h time interval divided by population of de<br>partment                        |
| Activity-Weekend-16-24h  | Sum of all users' activities (calls/SMS) in department during weekends in 16-24h time interval divided by population of de                                       |
| Activity-Weekday-00h*    | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 00-01h time interval divided by population of de                        |
| Activity-Weekday-01h     | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 01-02h time interval divided by population of de                        |
| Activity-Weekday-02h     | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 02-03h time interval divided by population of de                        |
| Activity-Weekday-03h     | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 03-04h time interval divided by population of de                        |
| Activity-Weekday-04h     | partment<br>Sum of all users' activities (calls/SMS) in department during  |
| Activity-Weekday-05h     | weekdays in 04-05h time interval divided by population of de<br>partment<br>Sum of all users' activities (calls/SMS) in department during                        |
| Activity-Weekday-06h     | weekdays in 05-06h time interval divided by population of de<br>partment<br>Sum of all users' activities (calls/SMS) in department during                        |
| Activity-Weekday-07h     | weekdays in 06-07h time interval divided by population of department<br>Sum of all users' activities (calls/SMS) in department during                            |
| Activity-Weekday-08h     | weekdays in 07-08h time interval divided by population of department<br>Sum of all users' activities (calls/SMS) in department during                            |
| Activity-Weekday-09h     | <ul> <li>weekdays in 08-09h time interval divided by population of department</li> <li>Sum of all users' activities (calls/SMS) in department during</li> </ul>  |
| Activity-Weekday-10h     | <ul> <li>weekdays in 09-10h time interval divided by population of department</li> <li>Sum of all users' activities (calls/SMS) in department during</li> </ul>  |
| Activity-Weekday-11h     | <ul> <li>weekdays in 10-11h time interval divided by population of department</li> <li>Sum of all users' activities (calls/SMS) in department during</li> </ul>  |
| Activity-Weekday-12h     | <ul> <li>weekdays in 11-12h time interval divided by population of de partment</li> <li>Sum of all users' activities (calls/SMS) in department during</li> </ul> |
|                          | weekdays in 12-13h time interval divided by population of de partment  |
| Activity-Weekday-13h     | Sum of all users' activities (calls/SMS) in department during<br>weekdays in 13-14h time interval divided by population of de<br>partment                        |
| Activity-Weekday-14h     | Sum of all users' activities (calls/SMS) in department durin,<br>weekdays in 14-15h time interval divided by population of department                            |

| Feature Name          | Description   |
|-----------------------|---|
| Activity-Weekday-15h  | Sum of all users' activities (calls/SMS) in department during weekdays in 15-16h time interval divided by population of de  |
| Activity-Weekday-16h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 16-17h time interval divided by population of de-  |
| Activity-Weekday-17h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 17-18h time interval divided by population of de   |
| Activity-Weekday-18h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 18-19h time interval divided by population of de   |
| Activity-Weekday-19h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 19-20h time interval divided by population of de   |
| Activity-Weekday-20h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 20-21h time interval divided by population of de   |
| Activity-Weekday-21h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 21-22h time interval divided by population of de   |
| Activity-Weekday-22h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 22-23h time interval divided by population of de   |
| Activity-Weekday-23h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekdays in 23-24h time interval divided by population of de   |
| Activity-Weekend-00h* | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekends in 00-01h time interval divided by population of de   |
| Activity-Weekend-01h* | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekends in 01-02h time interval divided by population of de   |
| Activity-Weekend-02h* | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekends in 02-03h time interval divided by population of de   |
| Activity-Weekend-03h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekends in 03-04h time interval divided by population of de   |
| Activity-Weekend-04h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekends in 04-05h time interval divided by population of de   |
| Activity-Weekend-05h  | partment<br>Sum of all users' activities (calls/SMS) in department during<br>weekends in 05-06h time interval divided by population of de   |
| Activity-Weekend-06h  | Sum of all users' activities (calls/SMS) in department during<br>weekends in 06-07h time interval divided by population of de   |
| Activity-Weekend-07h  | weekends in 06-07n time interval divided by population of department<br>Sum of all users' activities (calls/SMS) in department during<br>weekends in 07-08h time interval divided by population of department |

| Feature Name          | Description   |
|-----------------------|---|
| Activity-Weekend-08h  | Sum of all users' activities (calls/SMS) in department during |
| ·                     | weekends in 08-09h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-09h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 09-10h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-10h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 10-11h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-11h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 11-12h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-12h  | Sum of all users' activities (calls/SMS) in department during |
| Activity-weekend-12ii | weekends in 12-13h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-13h  | Sum of all users' activities (calls/SMS) in department during |
| ·                     | weekends in 13-14h time interval divided by population of de  |
|                       | v 1 1   |
|                       | partment  |
| Activity-Weekend-14h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 14-15h time interval divided by population of de  |
| A                     | partment  |
| Activity-Weekend-15h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 15-16h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-16h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 16-17h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-17h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 17-18h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-18h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 18-19h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-19h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 19-20h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-20h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 20-21h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-21h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 21-22h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-22h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 22-23h time interval divided by population of de  |
|                       | partment  |
| Activity-Weekend-23h  | Sum of all users' activities (calls/SMS) in department during |
|                       | weekends in 23-24h time interval divided by population of de  |
|                       | partment  |

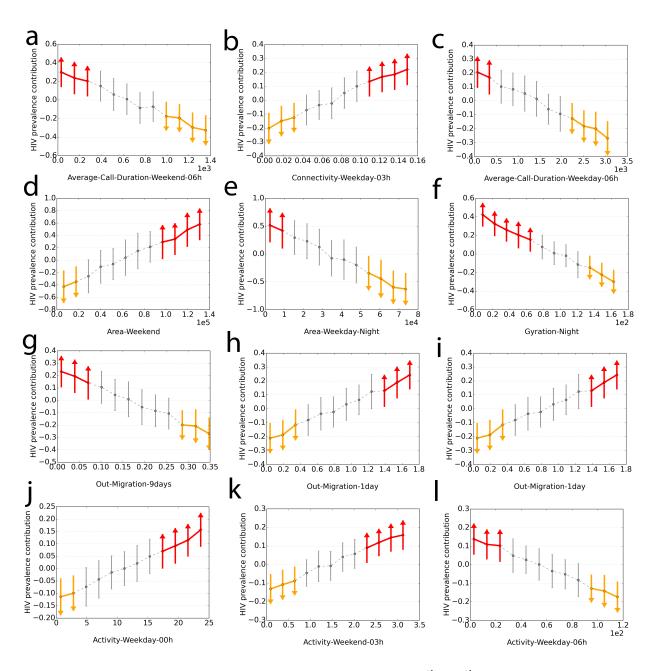


Figure S2: Feature contribution graphs for 12 features; ranked from  $4^{th}$  to  $6^{th}$  place for 4 types of features. Points correspond to mean contribution and error bars correspond to standard deviation. Red color indicates strong association to higher HIV, and orange to lower HIV prevalence.