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RESEARCH and CARE: FROM BENCH, TO BEDSIDE, TO COMMUNITY

Presidenza del Congresso: A. Cingolani, A. Di Biagio, M. Farinella, G. C. Marchetti



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**RESEARCH and CARE: FROM BENCH,
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Network analysis of proviral DNA mutations in People with 4-class-resistant HIV-1: Data from the PRESTIGIO Registry

S.Diotalle¹, D.Armenia², T.Clemente³, F.Saladini⁴, S.Rusconi⁵, L.Calza⁶, A. Cervo⁷, M.Zazzi⁴, R.Lolatto¹, M.C.Bellocchi⁸,
G.Marchegiani⁸, L.Carioti⁸, E.Fronti⁹, M.Fiscon¹⁰, V.Spagnuolo¹, A.Castagna³, M.M.Santoro¹¹, L.Farina¹², on behalf of the
PRESTIGIO Study Group

¹Vita-Salute San Raffaele University, Milan, Italy; ²Infectious Diseases, IRCCS San Raffaele Scientific Institute, Milan, Italy; ³National Institute for Infectious Diseases "L. Spallanzani" IRCCS, Rome, Italy; ⁴III Division of Infectious Diseases, ASST Fatebenefratelli Sacco, Milan, Italy; ⁵Infectious Diseases Unit, AULSS9 Scaligera, Verona, Italy; ⁶Unit of Infectious Diseases, Department of Medical Sciences, University of Torino, Torino, Italy; ⁷Department of Infectious Diseases, Azienda Ospedaliero-Universitaria of Modena, Modena, Italy; ⁸Unit of Infectious Diseases, Department of Medical and Surgical Sciences, S. Orsola Hospital, "Alma Mater Studiorum" University of Bologna, Bologna, Italy; ⁹Department of Infectious Diseases, Azienda Ospedaliera Papa Giovanni XXIII, Bergamo, Italy; ¹⁰Infectious Diseases Unit, ASST Ovest Milanese, Legnano General Hospital, Legnano, Italy; ¹¹DIBIC, University of Milan, Milan, Italy; ¹²Department of Experimental Medicine, University of Rome 'Tor Vergata', Rome, Italy

Potential conflicts of interest

Dr. Sara Diotallevi has no financial relationships with commercial entities to disclose.



Background

- In highly treatment-experienced people with HIV and multi-drug resistance, mutations interact within a complex system:
 - Long history of ART exposure
 - High HIV-1 DNA and RNA resistance burden¹.
- To date, network-based approach has not been used to study HIV mutations.

1. Armenia D, et al. **Viral resistance burden and APOBEC editing correlate with virological response in heavily treatment-experienced people living with multi-drug resistant HIV.** International Journal of Antimicrobial Agents, 2022.

Aim

To identify clusters of mutations archived in proviral DNA in people with HIV and 4-class drug resistance (PWH-4DR) under virological suppression.

Network Medicine



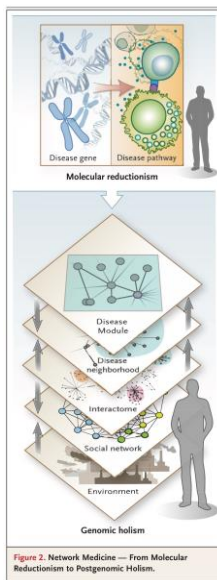
THE NEW ENGLAND JOURNAL of MEDICINE

MEDICINE AND SOCIETY

Debra Malina, Ph.D., Editor

Putting the Patient Back Together — Social Medicine, Network Medicine, and the Limits of Reductionism

Jeremy A. Greene, M.D., Ph.D., and Joseph Loscalzo, M.D., Ph.D.

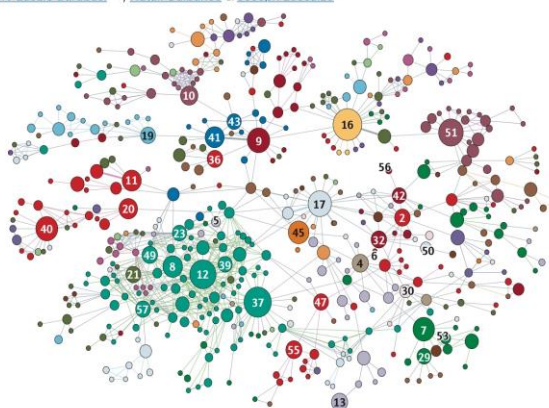


nature reviews genetics

Review Article | Published: 17 December 2010

Network medicine: a network-based approach to human disease

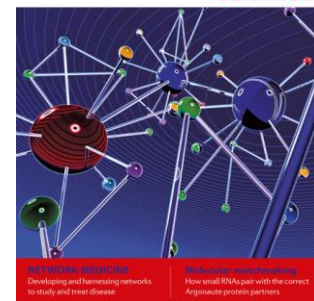
Albert-László Barabási, Natali Gulbahce & Joseph Loscalzo



- | | | |
|--|----------------------|--|
| 1 Alzheimer's disease | 51 Hemolytic anemia | 92 Myocardial infarction |
| 2 Alzheimer's disease | 52 Fanconi's anemia | 93 Myopathy |
| 3 Anemia, congenital dyserythropoietic | 53 Fanconi's anemia | 94 Nucleoside phosphorylase deficiency |
| 4 Atherosclerosis | 54 Gaucher's disease | 95 Obesity |
| 5 Axonal transection | 55 Glioma | 96 Paraplegia |
| 6 Bacterial infection | 56 Glioma | 97 Parkinson's disease |
| 7 Blood group | 57 HIV/AIDS | 98 Phenylketonuria |
| 8 Breast cancer | 58 HIV/AIDS | 99 Pseudotumor cerebri |
| 9 Cardiac myopathy | 59 HIV/AIDS | 100 Pseudotumor cerebri |
| 10 Cataract | 60 HIV/AIDS | 101 Reticular dysplasia |
| 11 Charcot-Marie-Tooth disease | 61 HIV/AIDS | 102 Schizophrenia |
| 12 Celiac disease | 62 HIV/AIDS | 103 Sphingomyelinase deficiency |
| 13 Complement component deficiency | 63 HIV/AIDS | 104 Spinocerebellar ataxia |
| 14 Coronary artery disease | 64 HIV/AIDS | 105 Stroke |
| 15 Crohn's disease | 65 HIV/AIDS | 106 Thyroid carcinoma |
| 16 Diabetes mellitus | 66 HIV/AIDS | 107 Tumor necrosis factor |
| 17 Diabetes mellitus | 67 HIV/AIDS | 108 Unilateral deafness |
| 18 Epidermolysis bullosa | 68 HIV/AIDS | 109 Unilateral deafness |
| 19 Epidermolysis bullosa | 69 HIV/AIDS | 110 Unilateral deafness |

nature
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GENETICS



Methods



- Study population: PWH with 4-class drug resistance and HIV-RNA <50 copies/mL (since >6 months) at sample collection, enrolled in the Prestigio Registry²
- NGS genotyping on PBMC samples: mutations frequency (as percentage of reads) detected in HIV-1 DNA by next-generation sequencing (NGS, Illumina MiSeq) with a 5% cut-off was evaluated³
- The following HIV-1 mutations were classified according to the Stanford HIV Drug Resistance Database (version 9.5) rules:
 - Major drug resistance mutations (DRMs)
 - APOBEC context DRMs (including stop codons)
 - Other (including accessory and polymorphic no resistance related) mutations

2. Clemente T, et al. **Cohort profile: PRESTIGIO, an Italian prospective registry-based cohort of people with HIV-1 resistant to reverse transcriptase, protease and integrase inhibitors.** BMJ Open, 2024.

3. Armenia D, et al. **Do minority resistant variants in HIV-DNA predict virological rebound in highly treatment experienced PLWH under virological control? Data from the PRESTIGIO Registry.** ICAR 2023: abstract OC 127; EACS 2023: abstract 343, pag. 355-357; EMHH 2023: abstract OP9. Manuscript under revision.



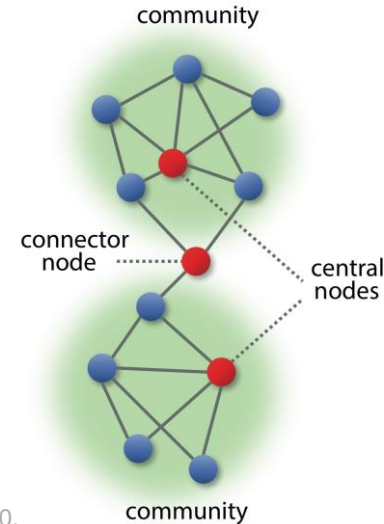
Correlation Network

A network is a visual representation of data focused on associations (links) between elements (nodes):

- Nodes: mutations
- Links: pairwise Spearman correlations, selected with both following thresholds³:
 - ✓ Correlation coefficient values were $<5^{\text{th}}$ percentile OR $>95^{\text{th}}$ percentile
 - ✓ Adjusted Benjamini-Hochberg pvalue were <0.001

Elements of network theory⁴:

- ❑ *Connected components* = sub-networks that are disconnected from each other but whose nodes are connected internally
- ❑ *Module* or *community* = highly interlinked local regions in the network
→ shared biological function?
- ❑ *Connector node* = node that connects distinct modules by acting as a “bridge”



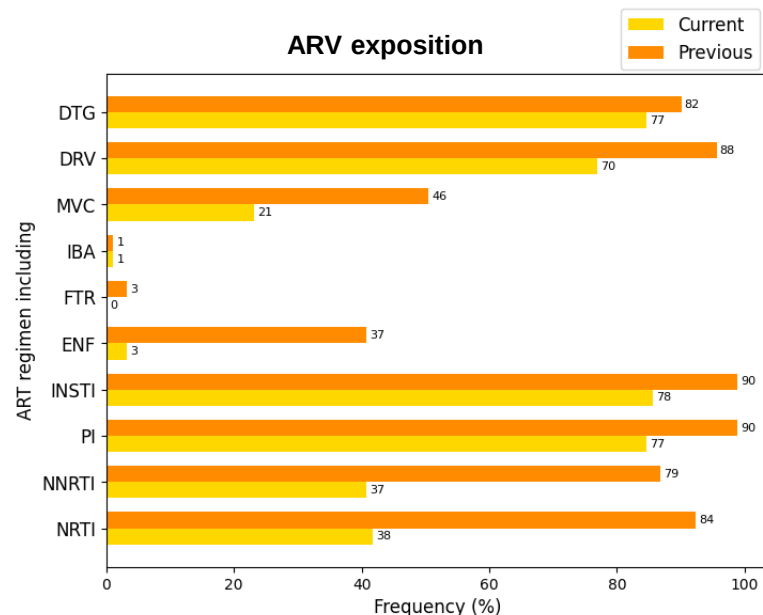
4. Silverman E, **Molecular Networks in Network Medicine: Development and Applications**. Wiley Interdiscip Rev Syst Biol Med, 2020.

5. Farina L, **Network as a language for precision medicine**. Ann Ist Super Sanità 2021, Vol. 57, No. 4: 330-342

Individuals' characteristics at sample collection

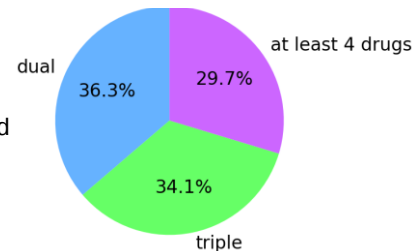


Characteristics at sample	Overall (N=91)
Age (Years), median (IQR)	54.3 [50.0;59.0]
Sex at birth: male, n (%)	70 (76.9%)
Years of ART therapy, median (IQR)	22.8 [21.0;25.0]
Years since HIV diagnosis, median (IQR)	27.0 [23.0;30.9]
Years since multiresistance, median (IQR)	5.31 [3.57;7.28]
HIV-RNA (copies/mL), median (IQR)	20.0 [0.90;36.0]
Years under virological suppression, median (IQR)	3.18 [1.66;4.99]
CD4 ⁺ T-cell nadir >200 cells/mm ³ , n (%)	25 (29.8%)
CD4 ⁺ T-cell count (cells/mm ³), median (IQR)	655 [484;890]
CD4 ⁺ /CD8 ⁺ ratio, median (IQR)	0.71 [0.49;0.97]
Total HIV-1 DNA (copies/million CD4 ⁺ T-cell), median (IQR)	2377 (1274-4949)
Number of PI drug mutations, median (IQR)	21.0 [13.5;30.5]
Number of INSTI drug mutations, median (IQR)	16.0 [12.0;20.5]
Number of NRTI or NNRTI drug mutations, median (IQR)	33.0 [25.0;38.0]
Number of previous ART regimen, median (IQR)	15.0 [9.50;19.0]



Type of the current ART regimen

22 out 27 (81%) participants under a dual regimen received boosted **DRV** plus **DTG**



Results



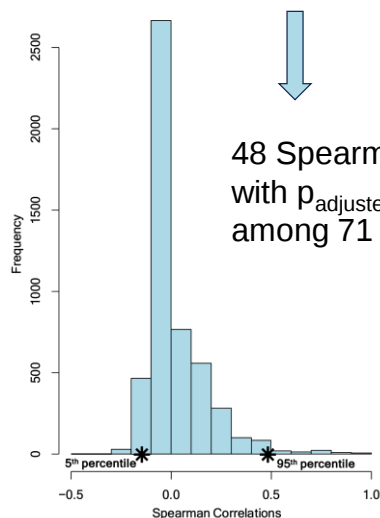
1226 mutations detected among 91 PWH-4DR with plasma HIV-RNA<50 cps/mL

71 major mutations $\geq 5\%$ NGS cut-off:

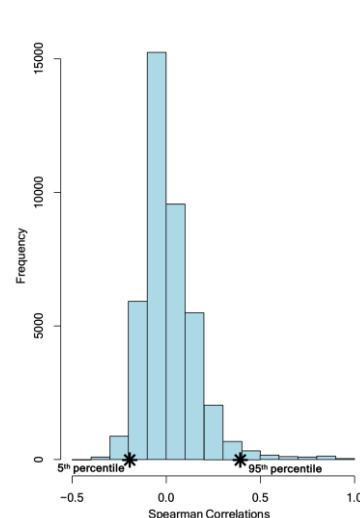
- 15 INSTI RMs
- 18 NNRTI RMs
- 13 NRTI RMs
- 25 PI RMs

131 additional mutations $\geq 5\%$ NGS cut-off and $\geq 10\%$ of study population:

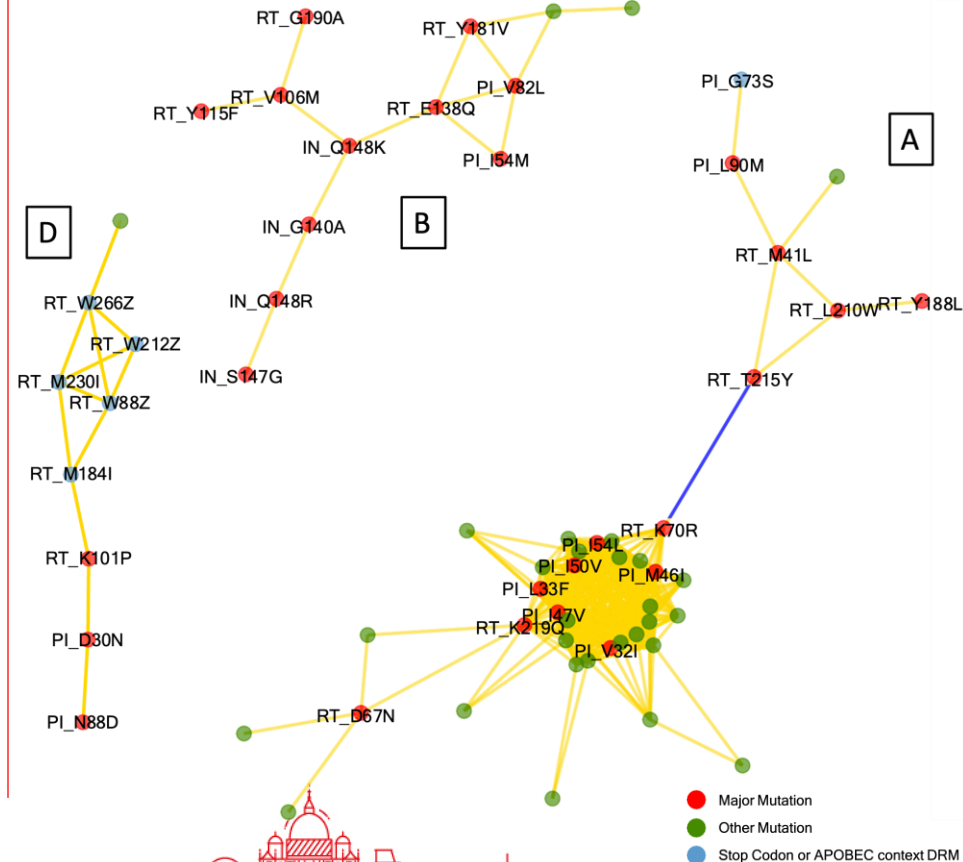
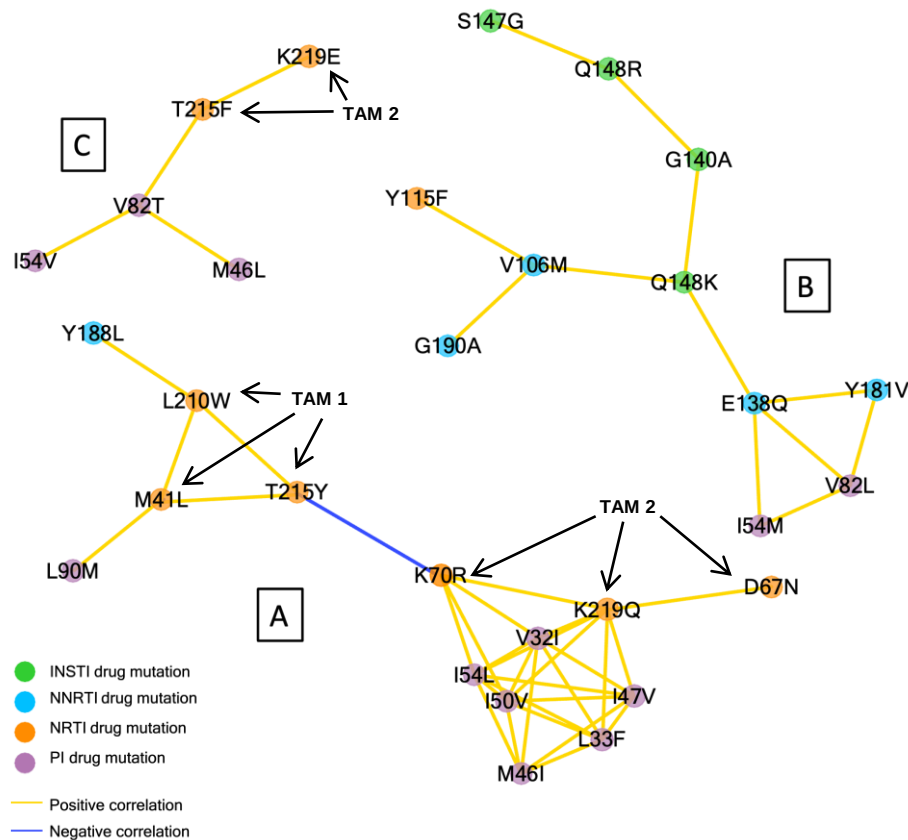
- 125 other (accessory or polymorphic) mutations
- 6 stop codons or APOBEC context DRMs



368 Spearman correlations with $p_{\text{adjusted}} < 0.001$ among 202 mutations



Correlation network of major and other mutations



Conclusions

- The present study showed that Network Analysis is a valid alternative approach to evaluate the relationships between HIV-1 mutations potentially involved in resistance.
- In virologically suppressed PWH-4DR, our analysis allowed to identify patterns of major mutations across different drug classes, reflecting their complex therapeutic history.
- Links between several stop codons and APOBEC-related context mutations were also identified. |

Next step will be to define the added value of this new methodology in predicting viral rebound in PWH and MDR virus.

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STUDY COORDINATORS: Elisabetta Carini, Sabrina Bagaglio, Girolamo Piromalli

STATISTICAL AND MONITORING TEAM: Riccardo Lolatto, Sara Diotallevi

ENROLLING CENTERS: *ANCONA:* Marcello Tavio, Alessandra Mataloni Paggi; *BARI:* Annalisa Saracino, Flavia Balena; *BERGAMO:* Laura Comi, Daniela Valenti, Claudia Suardi; *BOLOGNA:* Pierluigi Viale, Leonardo Calza, Federica Malerba, Silvia Cretella, Riccardo Riccardi; *BRESCIA:* Francesco Castelli, Emanuele Focà, Davide Minisci, Francesca Pennati; *BUSTO ARSIZIO:* Barbara Menzaghi, Maddalena Farinazzo; *CATANIA:* Bruno Cacopardo, Maurizio Celesia, Michele Salvatore Paternò Raddusa, Carmen Giarratana; *CATANZARO:* Paolo Fusco, Vincenzo Olivadese; *CREMONA:* Angelo Pan, Chiara Fornabaio, Paola Brambilla; *FIRENZE:* Alessandro Bartoloni, Filippo Lagi, Paola Corsi, Seble Tekle Kiros, Filippo Ducci, Susanna Giachè, Cecilia Costa, Alessio Bellucci, Elisa Mirabelli; *FOGGIA:* Teresa Santantonio, Sergio Lo Caputo, Sergio Ferrara, Arianna Narducci; *GENOVA:* Emanuele Pontali, Marcello Feasi, Antonio Sarà, Matteo Bassetti, Antonio Di Biagio, Sabrina Bianchi; *MILANO:* Antonella Castagna, Vincenzo Spagnuolo, Elisabetta Carini, Sabrina Bagaglio, Riccardo Lolatto, Andrea Galli, Sara Diotallevi, Rebecka Papaioannu, Tommaso Clemente, Girolamo Piromalli, Spinello Antinori, Andrea Giacomelli, Tiziana Formenti, Fabiola Schiavo, Giulia Marchetti, Lidia Gazzola, Fabiana Trionfo Fineo, Massimo Puoti, Cristina Moioli, Federico D'Amico; *MODENA:* Cristina Mussini, Adriana Cervo; *NAPOLI:* Elio Manzillo, Amedeo Lanzardo; *PADOVA:* Anna Maria Cattelan, Maria Mazzitelli; *PALERMO:* Antonio Cascio, Marcello Trizzino; *PARMA:* Elisa Fronti, Diletta Laccabue, Federica Carli; *PAVIA:* Roberto Gulminetti, Layla Pagnucco, Mattia Demitri; *PERUGIA:* Daniela Francisci, Giuseppe De Socio, Elisabetta Schiaroli; *REGGIO EMILIA:* Elisa Garlassi, Romina Corsini; *ROMA:* Roberta Gagliardini, Marisa Fusto, Loredana Sarmati, Vincenzo Malagnino, Tiziana Mulas, Mirko Compagno Carlo Torti, Simona Di Giambenedetto, Silvia Lamonica, Pierluigi Francesco Salvo; *SANREMO:* Giovanni Cenderello, Rachele Pincino; *SIENA:* Mario Tumbarello, Massimiliano Fabbiani, Francesca Panza, Ilaria Rancan; *TORINO:* Giovanni Di Perri, Stefano Bonora, Micol Ferrara, Andrea Calcagno, Silvia Fantino; *VERONA:* Stefano Nardi, Marta Fiscon

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