Predicting Influenza Strains Based on Correlations Between Northern and Southern Hemispheres

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Abstract: There is research showing that influenza strains are correlated between the Northern and Southern hemispheres. If this data is corroborated, this may lead to a prediction algorithm that relies on the predominant influenza strain in one hemisphere that is coming out of its flu season in order to predict the strain in the opposing hemisphere that is going into its flu season. This may provide enough time to develop a vaccine that is more accurately targeting the correct strain than in previous years.

I. Introduction

Predicting the predominant influenza strain each season is a challenge. In order to provide the millions of vaccines necessary for the beginning of each flu season, the CDC and World Health Organization need to predict the influenza strain that is expected from 6 to 9 months in advance to verify a vaccine in the laboratory and manufacture the many samples required. There is research showing that influenza strains are correlated between the Northern and Southern hemispheres [1]. If this data is corroborated, this may lead to a prediction algorithm that relies on the predominant influenza strain in one hemisphere that is coming out of its flu season in order to predict the strain in the opposing hemisphere that is going into its flu season. This may provide enough time to develop a vaccine that is more accurately targeting the correct strain than in previous years.

II. Procedure

By analyzing the cDNA sequences of the H1N1 and H3N2 influenza strains in the northern and southern hemispheres over the past 20 years, we work to obtain a correlation between the mutated strains that arise in one hemisphere based on the previous hemisphere's influenza season. The historical data for influenza strains over the last 20 years was tabulated by the WorldHealth Organization as shown in Table 1

NH winter season	NH H1N1	SH winter season	SH H1N1	NH H3N2	SH H3N2	NH B-strain	SH B-strain
<u>November</u> 1998–April 1999[2]	A/Beijing/262/ 95(H1N1)-like virus	<u>1999[31]</u>	A/Beijing/262 /95(H1N1)- like virus	A/Sydney/5/9 7(H3N2)-like virus	A/Sydney/5/9 7(H3N2)-like virus	B/Beijing/184/93- like virus	B/Beijing/184/93- like virus
<u>November</u> <u>1999–April 2000[3]</u>	A/Beijing/262/ 95 (H1N1)-like virus	May–October 2000[32]	A/New Caledonia/20/ 99 (H1N1)- like virus	A/Sydney/5/9 7 (H3N2)-like virus	A/Moscow/10 /99 (H3N2)- like virus	B/Beijing/184/93- like virus or B/Shangdong/7/9 7-like virus	B/Beijing/184/93- like virus or B/Shangdong/7/ 97-like virus
<u>2000–2001[4]</u>	A/New Caledonia/20/9 9 (H1N1)-like virus	May–October 2001[33]	A/New Caledonia/20/ 99 (H1N1)- like virus	A/Moscow/10 /99 (H3N2)- like virus	A/Moscow/10 /99 (H3N2)- like virus	B/Beijing/184/93- like virus	B/Sichuan/379/9 9-like virus
<u>2001–2002[5]</u>	A/New Caledonia/20/9 9(H1N1)-like virus	<u>2002[34]</u>	A/New Caledonia/20/ 99(H1N1)-like virus	A/Moscow/10 /99(H3N2)- like virus	A/Moscow/10 /99(H3N2)- like virus	B/Sichuan/379/99- like virus	B/Sichuan/379/9 9-like virus
<u>2002–2003[6]</u>	A/New Caledonia/20/9 9(H1N1)-like virus	<u>2003[35]</u>	A/New Caledonia/20/ 99(H1N1)-like virus	A/Moscow/10 /99(H3N2)- like virus	A/Moscow/10 /99(H3N2)- like virus	B/Hong Kong/330/2001- like virus	B/Hong Kong/330/2001- like virus
<u>2003–2004[7]</u>	A/New Caledonia/20/9 9(H1N1)-like virus	<u>2004[36]</u>	A/New Caledonia/20/ 99(H1N1)-like virus	A/Moscow/10 /99(H3N2)- like virus	A/Fujian/411/ 2002(H3N2) - like virus	B/Hong Kong/330/2001- like virus	B/Hong Kong/330/2001- like virus
<u>2004–2005[8]</u>	A/New Caledonia/20/9 9(H1N1)-like virus	<u>2005[37]</u>	A/New Caledonia/20/ 99(H1N1)-like virus	A/Fujian/411/ 2002(H3N2)- like virus	A/Wellington/ 1/2004(H3N2) like virus	B/Shanghai/361/2 002-like virus	B/Shanghai/361/ 2002-like virus
<u>2005–2006[9]</u>	A/New Caledonia/20/9 9(H1N1)-like virus	<u>2006[38]</u>	A/New Caledonia/20/ 99(H1N1)-like virus	A/California/7 /2004(H3N2)- like virus	A/California/7 /2004(H3N2)- like virus	B/Shanghai/361/2 002-like virus	B/Malaysia/2506 /2004-like virus
<u>2006–2007[10]</u>	A/New Caledonia/20/9 9(H1N1)-like	<u>2007[39]</u>	A/New Caledonia/20/ 99(H1N1)-like	A/Wisconsin/6 7/2005 (H3N2)-like virus	A/Wisconsin/ 67/2005 (H3N2)-like virus	B/Malaysia/2506/ 2004-like virus	B/Malaysia/2506 /2004-like virus
<u>2007–2008[11]</u>	A/Solomon Islands/3/2006 (H1N1)-like virus	<u>2008[40]</u>	A/Solomon Islands/3/200 6 (H1N1)-like virus	A/Wisconsin/6 7/2005 (H3N2)-like virus	A/Brisbane/10 /2007 (H3N2)- like virus	B/Malaysia/2506/ 2004-like virus	B/Florida/4/2006- like virus
<u>2008–2009[12]</u>	A/Brisbane/59/ 2007 (H1N1)- like virus	<u>2009[41]</u>	A/Brisbane/59 /2007 (H1N1)- like virus	A/Brisbane/10 /2007 (H3N2)- like virus	A/Brisbane/10 /2007 (H3N2)- like virus	B/Florida/4/2006- like virus	B/Florida/4/2006- like virus
<u>2009–2010[13]</u>	A/Brisbane/59/ 2007 (H1N1)- like virus	<u>2010[42]</u>	A/California/7 /2009 (H1N1)- like virus	A/Brisbane/10 /2007 (H3N2)- like virus	A/Perth/16/2 009 (H3N2)- like virus	B/Brisbane/60/20 08-like virus	B/Brisbane/60/2 008-like virus

below [2].

NIL winter		SH					
season	NH H1N1	winter season	SH H1N1	NH H3N2	SH H3N2	NH B-strain	SH B-strain
<u>2010–2011[14]</u>	A/California/7/ 2009 (H1N1)- like virus	<u>2011[43]</u>	A/California/7/2 009 (H1N1)-like virus	A/Perth/16/2009 (H3N2)-like virus	A/Perth/16/2 009 (H3N2)- like virus	B/Brisbane/6 0/2008-like virus	B/Brisbane/60/200 8-like virus
<u>2011–2012[15]</u>	A/California/7/ 2009 (H1N1)- like virus	<u>2012[44]</u>	A/California/7/2 009 (H1N1)pdm09 ^{[not} • ^{1]} -like virus ^[17]	A/Perth/16/2009 (H3N2)-like virus	A/Perth/16/2 009 (H3N2)- like virus	B/Brisbane/6 0/2008-like virus	B/Brisbane/60/200 8-like virus
<u>2012–2013[16]</u>	A/California/7/ 2009 (H1N1)pdm09 ^{[n} ^{ote 1]} -like virus ^[17]	<u>2013[45]</u>	A/California/7/2 009 (H1N1)pdm09- like virus	A/Victoria/361/2 011 (H3N2)-like virus	A/Victoria/36 1/2011 (H3N2)-like virus	B/Wisconsin/ 1/2010-like virus	B/Wisconsin/1/20 10-like virus
<u>2013–2014[18]</u>	A/California/7/20 09 (H1N1)pdm09[not e 1]-like virus	<u>2014[46]</u>	A/California/7/2 009 (H1N1)pdm09- like virus	A(H3N2) virus antigenically like the cell-propagated prototype virus A/Victoria/361/201 1[note 2]	A/Texas/50/201 2 (H3N2)-like virus[note 3]	B/Massachus etts/2/2012- like virus	B/Massachusetts/2 /2012-like virus
<u>2014–2015[19]</u>	A/California/7/20 09 (H1N1)pdm09[not e 1]-like virus	<u>2015[47]</u>	A/California/7/2 009 (H1N1)pdm09- like virus	<u>A/Texas/50/2012</u> (<u>H3N2)-like</u> virus[note 3]	A/Switzerland /9715293/20 13 (H3N2)- like virus	B/Massachus etts/2/2012- like virus	B/Phuket/3073/20 13-like virus
<u>2015–2016[20]</u>	A/California/7/20 09 (H1N1)pdm09[not e 1]-like virus	<u>2016[48]</u>	A/California/7/2 009 (H1N1)pdm09- like virus	A/Switzerland/9 715293/2013 (H3N2)-like virus	A/Hong Kong/4801/2 014 (H3N2)- like virus	B/Phuket/30 73/2013-like virus	B/Brisbane/60/200 8-like virus
2016–2017 ^{[21][}	A/California/7/20 09 (H1N1)pdm09[not e 1]-like virus	2017 ^{[49][5} 0]	A/Michigan/45/201 5 (H1N1)pdm09-like virus[25]	A/Hong Kong/4801/201 4 (H3N2)-like virus	A/Hong Kong/4801/2 014 (H3N2)- like virus	B/Brisbane/6 0/2008-like virus	B/Brisbane/60/200 8-like virus
2017–2018 ^{[23][} 24]	A/Michigan/45 /2015 (H1N1)pdm09 ^{[n} ^{ote 1]} -like virus ^[25]	2018 ^{[51][5} 2]	A/Michigan/45/ 2015 (H1N1)pdm09- like virus	A/Hong Kong/4801/201 4 (H3N2)-like virus	A/Singapore/ INFIMH-16- 0019/2016 (H3N2)-like virus	B/Brisbane/6 0/2008-like virus	B/Phuket/3073/20 13-like virus
2018–2019 ^{[26][} 27]	A/Michigan/45/20 15 (H1N1)pdm09[not e 1]-like virus	2019 ^{[53][5} 4]	A/Michigan/45/ 2015 (H1N1)pdm09- like virus	A/Singapore/INF IMH-16- 0019/2016 (H3N2)-like virus	A/Switzerland /8060/2017 (H3N2)-like virus	B/Colorado/ 06/2017-like virus (B/Victoria/2 /87 lineage)	B/Colorado/06/20 17-like virus (B/Victoria/2/87 lineage)
2019–2020 ^{[28][} 29][30]	A/Brisbane/02/20 18 (H1N1)pdm09[not e 1]-like virus	2020 ^{[55][5}	A/Brisbane/02/2 018 (H1N1)pdm09- like virus	A/Kansas/14/20 17 (H3N2)-like virus	A/South Australia/34/ 2019 (H3N2)- like virus	B/Colorado/ 06/2017-like virus (B/Victoria/2 /87 lineage)	B/Washington/02/ 2019-like (B/Victoria lineage) virus

Table 1. Historical Influenza Strains for the Last 20Years In Each Hemisphere

We retrieved sequence data (cDNA data derived from RNA sequencing) from NCBI and the Influenza Research Database (www.fludb.org) of the H1N1 and H3N2 influenza strains in both the northern and southern hemispheres over the last 20 years. We then performed a multiple sequence alignment using the ClustalW algorithm on the Hemagglutimin (HA) gene in each of the strains using Mega 5 (Figure 1).



Figure 1. Multiple Sequence Alignment of all Strains From 1999- 2020

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	1	2	3	4	5	6	7	8	9	10	11	12	13	. 14
/039080.1 Influenza A virus (A/Sydney/5/1997(H3N2)) segment 7 complete sequence														
(289928.1 Influenza A virus (A/Beijing/262/95(H1N1)) hemagglutinin (HA) gene complete cds	0.457													
4821341.1 Influenza A virus (A/Wisconsin/67/2005(H3N2)) segment 4 hemagglutinin (HA) gene complete cds	0.027	0.443												
4821329.1 Influenza A virus (A/Wellington/01/2004(H3N2)) segment 4 hemagglutinin (HA) gene complete cds	0.022	0.444	0.006											
2892952.1 Influenza A virus (A/Texas/50/2012(H3N2)) segment 4 hemagglutinin (HA) gene complete cds	0.039	0.450	0.015	0.017										
J124177.1 Influenza A virus (A/Solomon Islands/3/2006(H1N1)) segment 4 hemagglutinin (HA) gene complete cds	0.466	0.028	0.445	0.448	0.450					-				
/125100.1 Influenza A virus (A/New Caledonia/20/99(H1N1)) hemagglutinin (HA) gene complete cds	0.470	0.017	0.450	0.451	0.455	0.016			_	-				
(121373.1 Influenza A virus (A/Moscow/10/1999(H3N2)) hemagglutinin (HA) gene complete cds	0.008	0.457	0.030	0.024	0.042	0.466	0.469			-				
/117023.1 Influenza A virus (A/Michigan/45/2015(H1N1)) segment 4 hemagglutinin (HA) gene complete cds	0.465	0.174	0.465	0.457	0.476	0.169	0.174	0.459						
4N857614.1 Influenza A virus (A/swine/Towa/A02478855/2019(H3N2)) segment 4 hemagglutinin (HA) gene complete cds	0.462	0.062	0.439	0.445	0.443	0.060	0.055	0.456	0.180	12 11 2				
M821324.1 Influenza A virus (A/Fujian/411/2002(H3N2)) segment 4 hemagglutinin (HA) gene complete cds	0.020	0.447	0.009	0.005	0.019	0.448	0.453	0.022	0.455	0.443				
C36660111 Influenza A virus (A/California///2009(H1N1)) segment 2 polymerase PB1 (PB1) gene complete cds	0.558	0.541	0.554	0.556	0.567	0.553	0.550	0.554	0.591	0.542	0.558	0.004		
M821334.1 Influenza A virus (A/Lalifornia///2UU4(H3N2)) segment 4 hemagglutinin (HA) gene complete cds	0.023	0.441	0.007	0.004	0.019	0.444	0.447	0.026	0.461	0.438	0.006	0.554		

Figure 2. PairWise Distance Matrix From PAM30 Analysis

Based on the PAM30 substitution matrix, a pairwise distance estimate between the strains was constructed (Figure 2) along with a phylogenetic tree (Figure 3).



Figure 3. Phylogenetic Tree Showing Relationships Between Strains

The phylogenetic tree shows how closely the strains are related based on the pairwise distance matrix. It is theorized that most mutations between strains will be less than one branch change in the tree. After examining the changes in the 20 year historical data, this assumption appears to be validated.

One newer strain of H3N2 (A\swine\Iowa\H3N2\2019) emerged in the sub-branch of H1N1 next to (A\Michigan\H1N1\2015), we suspect that the new 2019 sequences of A\swine\Iowa\H3N2\2019 may be unverified as the rest of the strains collapse into their respective H1N1 or H3N2 sub-branches as expected.

III. Prediction Algorithm

The proposal is to apply supervised machine learning in the form of neural net which uses the historical data (Table 1) as training data and the pairwise distance matrix (Figure 2) as the node weights that are used in the computational stage of the neural net. This will keep consistency between single subbranch mutations as shown in the pairwise distance matrix (and associated tree) but also incorporate historical data to account for the mutations that are more than one sub-branch away. The proposed architecture is shown in Figure 4.

Influenza Predictor Neural Net Use Historical Data over 20 Correlate to Phylogeny years which shows changes (family tree) based on DNA between strains 4 analysis Neural Net Weights Updated Yearly Train Neural Net with Enter last known strain for Historical Data and use Northern or Southern distances in family tree as Hemisphere in Neural Net to Neural Net weights (updated get the next strain in yearly) opposite Hemisphere **Predicted Strain**

Figure 4. Influenza Predictor

IV. Conclusions

Using the research performed on correlation between influenza strains in the northern and southern hemispheres to predict upcoming influenza epidemics, we believe there is evidence that the strain for each hemisphere can be predicted with some reliability. The use of historical data and genomic analysis may provide a path for machine learning to determine future predominant strains in each hemisphere based on the flu season results in the opposing hemisphere.

References

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