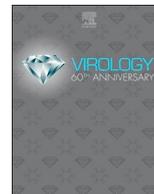




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To hit or not to hit: Large-scale sequence analysis and structure characterization of influenza A NS1 unlocks new antiviral target potential

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ABSTRACT

Influenza NS1 protein is among the most promising novel druggable anti-influenza target, based on its structure; multiple interactions; and global function in influenza replication and pathogenesis. Notwithstanding, drug development guidance based on NS1 structural biology is lacking. Here, we design a promising strategy directed to highly conserved druggable regions as a result of an exhaustive large-scale sequence analysis and structure characterization of NS1 protein across human-infecting influenza A subtypes, over the past 100 years. We have identified 3 druggable pockets and 8 new potential hot spot residues in the NS1 protein, not described before, additionally to other 16 sites previously identified, which represent attractive targets for pharmacological modulation. This study provides a rationale towards structure-function studies of NS1 druggable sites, which have the potential to accelerate the NS1 target validation. This research also contributes to a deeper comprehension and insight into the evolutionary dynamics of influenza A NS1 protein.

1. Introduction

Annual epidemics of human influenza A virus (IAV) cause a significant economic burden, morbidity and mortality, worldwide (Cox, 1999; Krammer et al., 2018). Influenza antiviral drugs are the only specific and directed available treatment, particularly important in case of a newly emerging influenza virus or in specific groups (pregnant women, immunocompromised hosts, individuals with chronic illness, children and the elderly patients) (Ghebrehewet et al., 2016). An effective antiviral therapy is determinant to improve the patient prognosis, to reduce morbidity, mortality and to minimize the economic burden in the health care system (Klepser, 2014; Putri et al., 2018).

Considering the emergence of resistance to the first class of influenza antivirals, neuraminidase inhibitors are the anti-influenza drugs of choice (Hurt et al., 2016). Current influenza antivirals present known

limitations in scope, effectiveness and emergence of resistance strains (Takashita et al., 2015). Since the virus evolve at a high rate, the clinical management of influenza is constantly threatened by the lack of therapeutic choices, which highlights the need for new antiviral drug discovery and development that explore a wider range of highly conserved targets (Penttinen and Catchpole, 2016).

The mindset of attrition during drug discovery and development is repeatedly in debate, since only about 4% of drug development projects lead to licensed drugs (Mohs and Greig, 2017; Schuhmacher et al., 2016). Undruggable targets are responsible for up to 60% of failure in this process (Mohs and Greig, 2017; Schuhmacher et al., 2016). In this context, a critical step in any new early drug discovery approach abide to predict the druggability of the target longing to explore. Furthermore, established drug targets are correlated to evolutionary conservation since highly conserved regions are often biologically

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Abbreviations		IAV	influenza A virus
aa	amino acid	LR	linker region
CDP	Consensus druggable pocket	LV	length variant
CTT	C-terminal “tail”	NS1	non-structural protein 1
DGSS	DoGSiteScorer	PDB	Protein Data Bank
ED	effector domain	PDS	PockDrug-Server
H1N1pdm09	pandemic H1N1 2009	RBD	RNA-Binding Domain
H1N1sea	seasonal H1N1	SF	SiteFinder from MOE

important for virus replication and display essential structural or functional roles during infection (Lv et al., 2015). In this regard, the identification of binding pockets within conserved regions should result in more robust antiviral targets since they are less prone to mutations and evade the host immune response.

Structure-based drug design approaches provide an efficient way to direct cost-intensive experimental efforts and have already proven fundamental in the discovery and development of several drugs, including the anti-influenza zanamivir and oseltamivir (Kirchmair et al., 2011; Mallipeddi et al., 2014).

The influenza non-structural (NS) gene corresponds to the viral RNA segment 8 which encodes both the NS1 and the viral nuclear export protein (NEP) (Engel, 2013). Structurally, the non-structural protein 1 (NS1) is comprised by two functional domains bridged by a short inter-domain linker region (LR): N-terminal RNA-Binding Domain (RBD) (amino acids 1–73); and C-terminal effector domain (ED) (amino acids 86–202) (Hale, 2014; Hale et al., 2008). The remaining residues of NS1 form a disordered C-terminal “tail” (CTT) (Marc, 2016). The protein is able to form homodimers (RBD and ED) and multimers (only for ED) (Hale, 2014; Hale et al., 2008; Krug, 2015).

NS1 emerges as a potential target for antiviral drug discovery based on its structure; interaction with host proteins and nucleic acids; and global function in influenza replication (Hale et al., 2008). NS1 protein is among the most promising novel anti-influenza targets. It is exclusively and highly expressed in virus-infected cells (both in cytoplasm

and nucleus), being absent from the virion particle (Abdelwhab et al., 2013; Marc, 2014). It mediates crucial functions in virus replication, propagation and pathogenesis by way of the interplay with multiple protein-RNA and protein-protein interactions (Marc, 2014).

The N-terminal RBD forms an obligate six-helical homodimer (the dimer interface consists of two antiparallel α-helices) which binds to several RNAs (Kerry et al., 2011).

The effector domain can also dimerize and forms distinct quaternary conformations: It is established that at the early stages of infection the NS1-ED co-exist in a monomeric and dimeric states (Carrillo et al., 2014). The monomer promotes the interaction of NS1 with cellular proteins, such as p85β subunit of phosphatidylinositol 3-kinase (PI3K) (Carrillo et al., 2014; Hale et al., 2010a). At later stages of infection, the homodimeric state of NS1 may be the predominant form. Distinct ED-ED interaction types and dimer interfaces have been observed in the influenza NS1 protein, so the precise fashion in which the ED monomers can dimerize is unclear (Bornholdt and Prasad, 2008; Carrillo et al., 2014; Hale et al., 2008; Kerry et al., 2011; Xia and Robertus, 2010). It has been suggested that the helix-helix dimer is the predominant conformation of NS1 in the homodimeric state, while the strand-strand dimer may exist as a minor form (Aramini et al., 2014; Carrillo et al., 2014; Hale et al., 2008; Kerry et al., 2011; Xia and Robertus, 2010). Additionally, the NS1-ED, but not the NS1-RBD, multimerizes in order to manage the pleiotropic function of NS1 (Hale, 2014; Wang et al., 1999).

Table 1
Length variations and C-terminal sequence of the influenza A virus NS1 protein.

	IAV Subtype	NS1 Length Variations (LV) Types											Total	C-terminus sequence: only for LV types with a prevalence >1%			
		202	212	215	217	219	220	224	225	227	228	230			237		
IAV previously established in humans	prior H1N1sea	2			4	277		1					1	1314	105	1704 (6,002%)	219 aa: ²¹² PSLPPEQK ²¹⁹ 230 aa: ²¹² PPFT(T)/(P)TQK ²¹⁹ ; ²²² RSEV ²³⁰ (pre-2009) 237 aa: ²¹² PPLTPKQK ²¹⁹ ; ²²² RSEVRRNKMD ²³⁷ (pre-1989)
	H1N1pdm09	1			4	11474								11	11490 (40,469%)	219 aa: ²¹² PSLPPEQK ²¹⁹ (post-2009)	
	H1N2					14	1								31	46 (0,162%)	219 aa: ²¹² PSLPPEQK ²¹⁹ (post-2007) 230 aa: ²²² RSKV ²³⁰ (pre-2004)
	H2N2				1			14							2	103 (0,363%)	220 aa: ²¹² PLTPKQR ²²⁰ (1967-1968) 237 aa: ²²² RSKVRRI(D)/(N)KMD ²³⁷ (1957-1968)
	H3N2					105	174	19			3	1	13713	208	14223 (50,095%)	219 aa: ²¹² PSLPPEQK ²¹⁹ (<i>major</i>) or ²¹² PPLPEQK ²¹⁹ (<i>minor</i>) (mostly post-2009) 230 aa: ²¹² PPLTPKQK ²¹⁹ ; ²²² RSKV ²³⁰ (1970-2012/2013); ²²² RSEV ²³⁰ (post-2011/2012) 237 aa: ²¹² PPLTPKQK ²¹⁹ ; ²²² RSKVRROKMD ²³⁷ (mostly pre-1990)	
Avian-to-human transmission	H5N1		1	7										277	297 (1,046%)	225 aa: ²¹² PLPPNQK ²¹⁹ ; ²²² ESEV ²²⁵ (<i>major</i>) or ²²² ESKV ²²⁵ (<i>minor</i>) [contains a 5-aa deletion - 80-84 aa] (post-2000) 230 aa: ²¹² SPLPKQK ²¹⁹ ; ²²² EPEV ²³⁰ (pre-2000)	
	H5N6					12			6						18 (0,063%)	217 aa: ²¹² PPLSPK ²¹⁷ or ²¹² SPFSTK ²¹⁷ (post-2015) 225 aa: ²²² ESEV ²²⁵ [contains a 5-aa deletion - 83-87 aa] (post-2014)	
	H7N7														4 (0,014%)	230 aa: ²²² ESEV ²³⁰	
	H7N9					490									2	492 (1,733%)	217 aa: ²¹² SPLSTK ²¹⁷ (<i>major</i>) or ²¹² PPLSPK ²¹⁷ (<i>minor</i>) (post-2013)
	H9N2					9									6	15 (0,053%)	217 aa: ²¹² SPLSTK ²¹⁷ (<i>major</i>) or ²¹² PPLSPK ²¹⁷ (<i>minor</i>) (post-2014) 230 aa: ²²² EPEV ²³⁰ (pre-2011)
Total	3 (0,011%)	1 (0,004%)	7 (0,025%)	625 (2,201%)	11939 (42,051%)	34 (0,120%)	1 (0,004%)	283 (0,997%)	3 (0,011%)	2 (0,007%)	15093 (53,159%)	401 (1,412%)	28392				

LV types with a prevalence greater than 1% are marked in bold. The predominant LV type for each IAV subtype is highlighted in blue. The C-terminus sequences are described in more detail for the most prevalent IAV subtypes (H1N1, H3N2, H5N1 and H7N9) from the aa 212-237, when applied.

The NS1-ED interacts with multiple cellular proteins and host factors including the ubiquitin E3 ligases: tripartite motif-containing 25 (TRIM25) and Rplret; the RNA-dependent protein kinase (PKR); the 30-kDa subunit of the cleavage and polyadenylation specificity factor (CPSF30); the eukaryotic translation initiation factor 4GI (eIF4GI); the poly(A)-binding protein II (PABPII); and the p85 β subunit of PI3K, etc. (Kleinpeter et al., 2018; Robb et al., 2010). These interactions will affect several cellular pathways, which will globally contribute to the major function of NS1: evade the host innate immune response predominantly by blocking the type I interferon (IFN); and lead to the inherent infection pathogenicity (Garcia-Sastre, 2017; Kleinpeter et al., 2018; Robb et al., 2010).

The ED has an intrinsic plasticity behaviour which facilitates NS1 pleiotropic functions in a spatial and temporal fashion (Aramini et al., 2014). In this regard, the NS1-ED may either regulate the inhibition of cellular apoptosis (at early stages) or the induction apoptosis (at later stages); and inhibit IFN-inducing proteins or, contrarily, promote the induction of type I IFNs in a fraction of the infected cells (Abdelwhab et al., 2013; Das et al., 2008; Hrincius et al., 2011; Kerry et al., 2011; Marc, 2014). The conformational plasticity of NS1 also contributes to stabilize the RBD. NS1 multifunctionality is facilitated by its own auto-regulation which may control the conformational, spatial and temporal distribution of the protein in distinct stages of the infectious cycle (Aramini et al., 2014; Bornholdt and Prasad, 2008; Hale et al., 2009; Hsiang et al., 2012; Kerry et al., 2011). In this context, both previously described interactions (NS1-RBD:RNA, NS1-ED:CPSF30, NS1-ED:p85 β) and other unknown NS1:RNA and NS1:protein interactions should be further elucidated and targeted for drug discovery (Engel, 2013; Hale et al., 2010a; Hsu, 2018).

To date, there are no clinical drugs targeting this protein and drug development guidance focused on NS1 structural biology is lacking since the study of anti-NS1 inhibitors is still taking its first steps.

This study aim at identifying putative antiviral target regions within the NS1 influenza protein, mainly focused on undisclosed regions in the NS1 effector domain. In this regard, we intend to identify highly conserved regions or sites located on predicted binding pockets of NS1-ED, across a wide range of human-infecting Influenza A subtypes. Such approach also intends to comprehensively characterize the sequence-to-structure NS1 features in the human-infecting influenza viruses and reveal determinants of protein structure motifs that may, in turn, disclose potential hot spots for drug targeting.

2. Results and discussion

2.1. NS1 length variation studies

A large-scale analysis of the length variation of a total of 28392 NS1 protein sequences from human-infecting influenza A viruses have shown that the protein most frequently contains 230 residues ($\approx 53,2\%$). However, the precise length diverges among influenza virus subtypes and strains: premature stop codons, or contrarily, the suppression of the most prevailing stop codon (at nucleotide 688–690) produce a protein with a length variation that may range from 202 to 237 residues, as described by other authors (Hale et al., 2008).

Aside from the predominant 230-amino acid (aa) protein, other eleven length variant (LV) types can be found among all the influenza A virus, as depicted in the Table 1. Considering the classification adopted by Dundon et al. (Dundon and Capua, 2009) the following LV types were found, in order of decreasing frequency: 219 aa (42,05%), 217 aa (2,20%), 237 aa (1,41%), 225 aa ($\approx 0,1\%$); and the 202-aa, 212-aa, 215-aa, 220-aa, 224-aa, 227-aa and 228-aa LV types (accounting for less than 0,1% each on the global length prevalence).

This analysis included a total of 27566 (97,09%) IAV isolates previously established in the human population (H1N1, H1N2, H2N2 and H3N2), and 826 (2,91%) IAV isolates of avian origin (H5N1, H5N6, H7N7, H7N9 and H9N2).

The results showed that the 230-residue protein is the predominant LV type among the prior seasonal H1N1 (H1N1sea), H1N2, H3N2 and H7N7 IAV subtypes. The great majority of variations from the 230-aa protein have been found in a shorter length: the H5N6, H7N9 and H9N2 IAV subtypes mostly exist as a 217-aa protein; the pandemic H1N1 2009 (H1N1pdm09) IAV mostly occurs as a 219-residue protein (99,86%); and the H5N1 IAV NS1 usually contains 225 aa. Only the NS1 from the H2N2 subtype has most often occurred as a lengthy type of 237 residues. The 219-aa protein is limited to the IAV isolates previously established in the human population (H1N1, H1N2 and H3N2), whereas NS1 LV types of 217 aa and 225 aa were only found in IAV of avian origin, namely: the H5N1, H5N6, H7N9 and H9N2.

From the human IAV isolates of avian origin, only the H7N9 IAV subtype ($n = 2/825$ isolates) has shown to encode a NS1 protein with the 7-aa elongation (237-aa protein), which was previously limited only to the prior H1N1sea, H2N2 and H3N2 IAV subtypes. Human IAV with a NS1 shorter than 217 aa are uncommon ($n = 11/28392$). The reported length variation can determine functional differences between virus subtypes, as previously reported by other authors (Abdelwhab et al., 2013; Dundon and Capua, 2009; Hale et al., 2010b; Marc, 2016).

In addition to the reported C-terminal deletions, some LV types exhibit a 5-aa deletion within the inter-domain LR, which impacts the protein conservation within these regions. These gaps are confined to the NS1-225 LV type, either in the H5N1 IAV subtype or in the H5N6 IAV subtype. The NS1-225 LV type from the H5N1 IAV contains a 5-aa deletion in the peptide sequence corresponding to the 80–84 aa; and the NS1-225 LV type from the H5N6 IAV encloses a 5-residue deletion in the 83–87 aa sequence.

These results support that the linker region is variable in length. Previous studies have demonstrated that this region is highly flexible, which enables the NS1 protein to adopt distinct conformations regarding its RBD and ED domains. To date, none of the available crystallographic structures of NS1 has been resolved for the linker region (Bornholdt and Prasad, 2008). This poses a major limitation for a structure-based study of this region as a potential antiviral target.

A detailed analysis of the C-terminal 212–219 aa region from human-infecting influenza A virus sequences have revealed that it might be simultaneously IAV subtype- and LV-type-specific. The C-terminal sequence ²¹²PSLPPEQK²¹⁹ is specific of the NS1-219 LV type. The considered amino acid sequence is shared by all H1 IAV subtypes (either H1N1sea, H1N1pdm09 or H1N2); and also by the H3N2 subtype from the same LV group.

Contrarily, the NS1-230 and NS1-237 LV types from the H1N2, H2N2 and H3N2 IAVs display the amino acid sequence ²¹²PPLTPKQK²¹⁹, together with the NS1-237 LV type from the prior H1N1sea. The NS1-230 LV type from the prior H1N1sea represents an exception since it encodes the sequence ²¹²PPFTTTQK²¹⁹.

In the same way, the NS1-225 LV type from the H5 IAV subtypes contains the sequence ²¹²LPLPPNQK²¹⁹; and the NS1-230 LV type from the H5 and H9 IAV subtypes encodes the sequence ²¹²SPLPPKQK²¹⁹. These results suggest that only the last two amino acids in the considered region (²¹⁸QK²¹⁹) may be conserved among all the IAV subtypes.

The ²¹²PPLSPK²¹⁷ and ²¹²SPFSTK²¹⁷ sequences are the most common C-terminus found in the NS1-217 LV type of the H5N6 IAV subtype; and the ²¹²SPLSTK²¹⁷ (major) or ²¹²PPLSPK²¹⁷ (minor) are the terminal domains for the NS1-217 LV type of the H7N9 and H9N2 IAV subtypes. The NS1-217 LV types represent shorter variants of the predominant NS1-230 LV type; and have only been recently reported in human IAV isolates.

In both NS1-230 and NS1-237 LV types, the C-terminus 227–230 aa region is widely recognized as a potential postsynaptic density 95/disc large/zonula occludens-1 (PDZ) ligand (PL) motif of the X-S/T-X-V type (the X can be any aa) (Jackson et al., 2008). Our dataset endorses the prevailing presence of the ²²⁷RSEV²³⁰ or the ²²⁷RSKV²³⁰ sequences in the NS1 protein from human-infecting influenza A viruses, as

previously reported by other authors (Golebiewski et al., 2011; Jackson et al., 2008; Obenauer et al., 2006). Contrarily, the avian-to-human IAV isolates are characterized by the avian derived NS1 PL sequences of ²²⁷ESEV²³⁰, ²²⁷EPEV²³⁰ (major contribution) or ²²⁷ESKV²³⁰ (minor contribution), as previously described by Obenauer et al. This pattern of a major common human C-terminal RSKV domain and a major common avian C-terminal ESEV domain might indicate that this region is under strong selective pressure and it may have been selected during the virus evolution (Obenauer et al., 2006).

The PL region will be addressed for each IAV subtype, as follows. The ²²⁷RSKV²³⁰ domain is shared by the NS1-230 LV types from the H1N2, H2N2 and H3N2 subtypes which have been previously circulated (before 2013) in the human population. Specifically, the H1N2 viruses belonging to the NS1-230 LV type have circulated until 2004 and have been replaced by a shorter NS1-219 LV type, which does not contain the PL motif. The H3N2 subtype has emerged as the “Hong Kong influenza” pandemic in 1968 and exhibited the ²²⁷RSKV²³⁰ sequence (Golebiewski et al., 2011; Jackson et al., 2008); It had been gradually replaced in 2012 by H3N2 IAV containing 230 aa with the ²²⁷RSEV²³⁰ domain or, to a lesser extent, in 2009 by viruses containing a NS1-219 variant lacking the PL domain. The NS1-230 LV types identified in the H5N1 and H9N2 IAV human isolates used to contain the ²²⁷EPEV²³⁰ C-termini. These variants have been replaced by shorter NS1-225 and NS1-217 variants, respectively. The NS1-225 LV type from the H5N1 IAV is characterized by the corresponding ²²²ESEV²²⁵ (major) or ²²²ESKV²²⁵ (minor) sequences, along with the NS1-225 LV type from the H5N6 IAV. The ²²²ESEV²²⁵ motif is also the PL domain harboured by the H7N7 IAV subtypes.

Finally, the NS1-237 variants are predominantly found among IAV previously established in human population from 1940. The 227–237 region is characterized by the sequence ²²⁷RS(E)/(K)VRR(D)/(N)KMAD²³⁷. However, our data suggests that the NS1-237 variant is no longer circulating among the human population: since NS1 proteins of prior H1N1sea, H2N2 and H3N2 IAV viruses (isolated since 1989, 1968 and 1990, respectively) lack the 231 to 237 sequence. This information is in concordance with other previous similar studies (Kuo et al., 2016). Recently, two human IAV isolates (2015 and 2017) of the H7N9

subtype have been found with the NS1 7-aa elongation: ²²⁷KPEVRRN-KMVD²³⁷ sequence.

The 1918 IAV (A/BrevigMission/1/1918) is a singular variant: It is a virus that contains 230 aa and the C-termini is comprised by the ²¹²PPLPPKQK²¹⁹ and ²²⁷KSEV²³⁰ motifs (Golebiewski et al., 2011), which differ from all the other described NS1 C-terminal domains.

Taken together, these results corroborate that not only NS1 length diverges among influenza virus subtypes and LV types (attributable to variations on the LR and CTT); but also the C-terminal 212–237 aa sequence is highly variable and simultaneously IAV subtype- and LV type-specific.

Viruses that circulate in the human population containing a NS1-237 variant are uncommon since the year of 1990. In this way, designing an antiviral strategy targeting this region is not suitable for the current human circulating IAV. Additionally, since the emergence of the H1N1pdm09 variant in 2009 that the NS1 from both H1 influenza subtypes predominantly exists as a 219-aa protein; although H3N2 IAV continue to circulate with a NS1 protein containing 230 aa. In this way, targeting the C-terminal 220–237 aa region would be only reasonable for a strategy directed for the H3N2 IAV subtype and a few minor variants currently found in some IAV of avian origin. This represents a great limitation, considering that such strategy would only covered a 53,159% of the viruses circulating in the human population. Previous studies have demonstrated that extending the length of the NS1-219 LV type (H1N1pdm09 IAV) to 230 aa does not appear to impact the viral replication efficiency (Hale et al., 2010b). Hence, this region does not satisfy an important criterion for a proper anti-influenza target and we recognize that targeting the C-terminal 220–230 region presents lower antiviral target potential.

NS1 have been found with length variations shorter than the 219-aa LV type, namely the NS1 LV types of 217, 215, 212 and 202 aa which represent less than 2,25% of the total viruses circulating in the human population for the considered time period. Although the prevalence of such short NS1 variants is low, the H7N9 (along with H5N6 and H9N2) IAV subtypes mostly exist as a 217-aa protein. The avian H7N9 IAV subtype was first detected in humans in March 2013 and poses a current serious threat to public health: it causes severe human illness and is

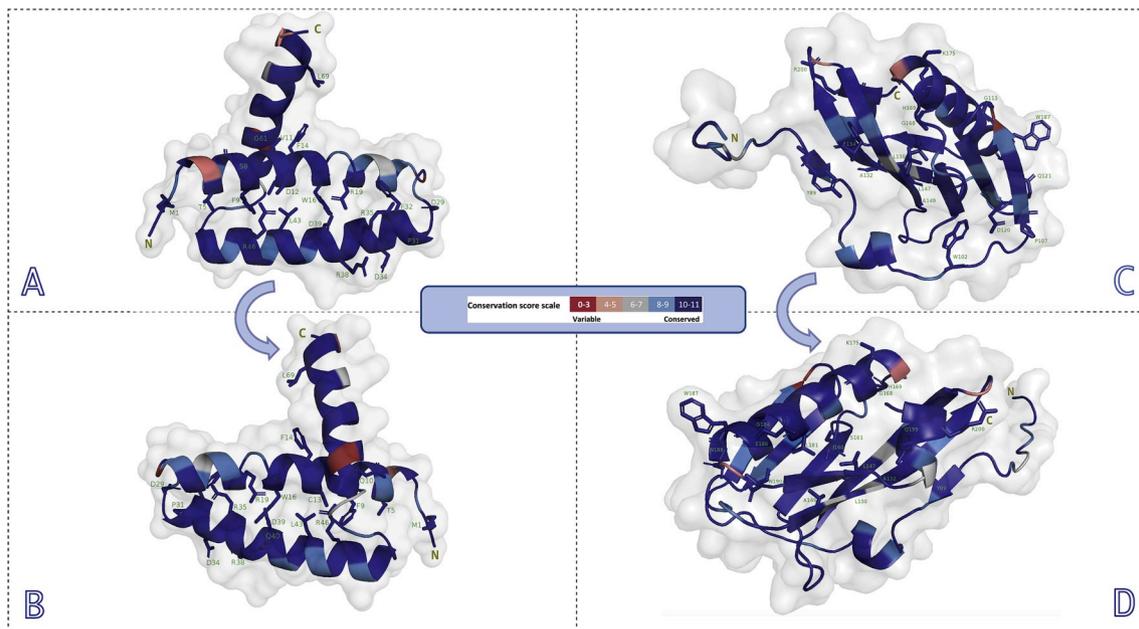


Fig. 1. Three-dimensional sequence conservation of influenza AH1N1pdm09 NS1 RBD (A and B) and ED (C and D) (PDB ID: 3M5R). The conservation scores are mapped onto the protein structures. The N- and C-terminal are indicated. The figure is coloured based on conservation scores: the highest conservation positions are highlighted in shades of blue and the red regions indicate low conservation according to the conservation score scale. Conserved residues with a percent identity score above 99,95% are labelled. Each protein domain is shown in two orientations (180° rotation). The figures were produced with PyMOL Molecular Graphics System (Schrodinger, 2015).

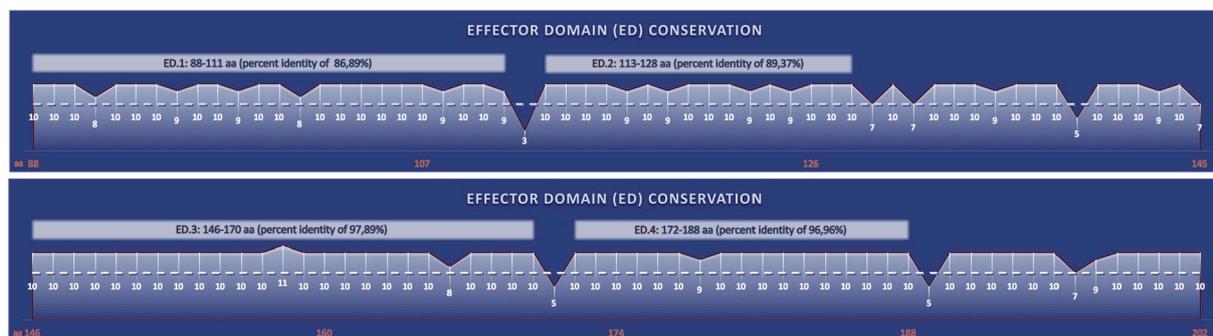


Fig. 3. Representation of the conservation-score distribution of the Effector Domain (ED) residues. The numbers in white, below each aa position, each site represent the conservation score of each individual amino acid, on a scale varying from 0 (most variable) to 11 (most conserved); a score = 11 indicates 100% identity across all human-infecting IAV subtypes. The regions composed of ≥ 10 continuous conserved amino acids (score > 7) are displayed above the conservation-score bars, where the mean percent identity of the considered region was calculated based on the amino acid frequency information at each particular position.

are surface exposed, while the remaining aa form an interface with the antiparallel β -strands. In the distal part of the ED, two additional areas of 6-residue length each are comprised by highly conserved residues: N190-to-S195 and N197-to-A202, respectively. The first area is located on the strand $\beta 7$ and the second area belongs to the helix $\alpha 6$ of the NS1 protein.

2.3. Druggability studies

Druggable pockets and sites for the NS1-ED were predicted based on the strategy described in the Materials and Methods. The druggability prediction based on the DoGSiteScorer (DGSS) server is described here in more detail. Only pockets comprised by more than 10 amino acids and with a druggability score $\geq 0,4$ were considered. Druggable pockets tend to be deeper, complex in shape and have a large volume and high enclosure (Perola et al., 2012). The size of the pocket (> 10 residues) is an important descriptor, since small cavities do not favour a proper interaction between the target and the ligand. Pockets which are not able to bind a ligand are described as “decoy pockets” and are usually composed of < 14 residues (Gao and Skolnick, 2013; Hajduk et al., 2005).

Considering the three NS1-ED conformation groups (ED monomers, helix-helix ED dimers and strand-strand ED dimers), twenty-five potential pockets were identified using the DoGSiteScorer server. Some pockets are shared by or in similar regions among the different NS1 conformations. The Supplemental Tables S-2 (supplementary data) displays the total of pockets identified for each NS1-ED conformation group, along with the pocket descriptors and druggability information. The spatial arrangement of these pockets based on the DoGSiteScorer algorithm is shown in Table 2.

The highest ranked druggable pockets predicted for the NS1-ED

monomer were pockets P1 and P2 for the 3O9U structure, with a druggability score of 0,79 and 0,70, respectively. The pocket P1 is composed of 32 amino acids with a conservation score ≥ 9 , except for residues 145 and 171. The pocket comprises the strands $\beta 3$ - $\beta 6$, the major helix $\alpha 5$ and the minor helix $\alpha 6$. The pocket P2 has 21 conserved amino acids (scores 8–10) and it is comprised by the antiparallel $\beta 3$ - $\beta 6$ strand extremities.

The highest ranked druggable pockets predicted for the NS1 ED helix-helix dimer interface were pockets P1 for the 3EE9 and P2 for the 3O9U structures, with a druggability score of 0,82 and 0,78, respectively. The pocket P1 (3EE9 structure) is composed of 32 amino acids (16 aa in each NS1 monomer) acids with a conservation score ≥ 9 . The pocket P2 (3O9U structure) is composed of 28 amino acids with a conservation score ≥ 9 , except for the residue 189. Both pockets are mostly located at the $\alpha 5$ - $\alpha 5'$ helix interface.

The highest ranked druggable pockets predicted for the NS1-ED strand-strand dimer interface were both pockets P1 for the 3M5R and 3EE8 structures, with a druggability score of 0,87 and 0,74, respectively. The pocket P1 (3M5R structure) is composed of 36 amino acids which are mostly conserved (scores 8–10), except for residues 145 and 171. The pocket P1 (3EE8 structure) is composed of 26 amino acids which are mostly conserved (scores 8–10) with exception of residues 129, 131 and 191 (score = 7); and residue 171 (score = 5). Both pockets mostly lie at the $\beta 1$ - $\alpha 5'$ and $\beta 5$ - $\beta 5'$ strand interfaces.

A linear schematic representation of the whole NS1-ED druggability is shown in the Fig. S-1 (supplementary data). This analysis was performed by merging the druggability information from the three bioinformatic tools (SF, DGSS and PDS) for each one of the NS1 conformations groups, independently: ED monomer, helix-helix ED dimer and strand-strand ED dimer. The potential druggable regions or sites were coloured in light blue and dark blue. The analysis has revealed

Table 2

Mapping results of the predicted druggable pockets onto the NS1 crystallographic structures of H1N1, H3N2 and H5N1 IAVs. The protein conformations: ED monomer and helix-helix ED dimer were considered. Top-ranking pockets obtained from DGSS are highlighted in shades of green, blue, purple and red, in descending order of rank, respectively. The complete druggability information along with the DGSS algorithm descriptors for each pocket are shown in Supplemental Tables S-2. The figures were produced with PyMOL Molecular Graphics System (Schrodinger, 2015).

	Prior H1N1sea	H1N1pdm09	H3N2	H5N1
NS1-ED monomer				
NS1-ED Helix-Helix dimer				

differences in the distribution of druggable amino acid regions in the ED, suggesting distinct modes of NS1-ED:host protein interactions. Regarding the ED monomer conformation, the positions 100-to-105 (located between the helix α 4 and the strand β 5) were found to be druggable, along with the 143–144 region of the strand β 5, the 166–169 region (between the strand β 5 and strand β 6) and part of the helix α 5 (aa: 172, 174–175, 177, 180–181).

The residues 110 and 111 (belonging to the strand β 2), part of the helix α 5 (residues 179, 180, 182, 184, 186–188) and the 189-to-191 region (between the helix α 5 and the strand β 7) were highlighted as the most druggable regions in the helix–helix ED dimer conformation.

Considering the strand-strand ED dimer conformation, the positions 91-to-94 (located between the strand β 1 and the helix α 4); the 127-to-129 region of the strand β 4; the 137-to-141 region (located between the strand β 4 and the strand β 5); part of the strand β 5 (142–145, 150–151 residues); the 166-to-169 region (located between the strand β 6 and the helix α 5); and the residues 171 and 172 of the helix α 5 were found to be druggable.

The 166–169 region (between the strand β 5 and strand β 6) and a few residues belonging to the major helix α 5 together with part of the strand β 5 seem to be global druggable regions transversal across distinct conformations, since they are shared by at least two of the NS1 conformations.

The last stage of the study consisted of a global comparative analysis of the NS1-ED druggability. The druggability consensus shared by the three NS1 conformation groups and predicted by the triple bioinformatic tool strategy (SF, DGSS and PDS) is shown in Fig. 4, together with the degree of residue conservation. The potential conserved druggable regions are marked with an asterisk and the highest-ranked hot spots are marked with a target.

The first conserved druggable cluster was found at positions 100-to-105. This region was predominantly detected in the pockets predicted for the structures of the NS1-ED monomer conformation. The regions 114–115, 126–128, 150–152 were predominantly found in the pockets predicted for the structures of the NS1-ED monomer and NS1 ED strand-strand dimer conformations. The positions 134 and 198–199 consist of a cluster predominantly found in the pockets predicted for the structures of the NS1-ED monomer and NS1 ED helix-helix dimer conformations. The 107–110, 117–123, 141–144, 155–157, 162–163,

166–170, 172–175 (mainly, 172 and 175 positions), 178–182, 184–185, 187–188, 190–194 and 201–202 clusters, along with the 147 site, are represented in the predicted pockets of all the NS1 conformations. The 148 and 159 positions have low or no representation in the predicted pockets.

Some of these regions are placed close together so they can form larger pockets, in respect to the pocket druggability information described in Supplemental Tables S–2. In this regard, three main consensus pockets (of ≥ 10 aa) were described based on the comparative study of NS1-ED druggability along with the degree of residue conservation (which were named as “consensus druggable pockets”). A consensus druggable pocket (CDP1) frequently found among the three NS1 conformations is comprised by the residues: 114–115, 134, 141–144, 147, 162–163, 166–170, 172–175, 178–182, 194, 198–199, 201–202. The consensus druggable pocket 2 (CDP2) was identified in all the NS1 conformations and comprehends the residues: 108–110, 117–123, 128, 157, 180–181, 184–185, 187–188, 190. A variant of this pocket, the consensus druggable pocket 3 (CDP3), was only found in the NS1 monomer, which includes the residues 100-to-105, as follows: 100–105, 116–123, 126, 151, 155–157, 184–185. A small pocket (SP) comprised by the residues 127–128, 150–152, 191, 193, along with other residues which do not belong to the final druggability consensus, was also found in the NS1-ED strand-strand dimer conformation.

The top-ranked hot spots for drug targeting identified in the global final analysis consisted of the following 24 residues: W102, M104, Q109-K110, P114, D120-A122, N127-I128, L141, L144, A155, V157, P167-H169, K175, V180, G184, T191, R193, F201-A202 (marked with a “target” in Fig. 4). Additionally to the hot spot residues: 122, 127, 141, 144, 167, 191 and 193 that have been previously described in the literature regarding its role in protein function (Hale et al., 2008; Li et al., 2006; Min et al., 2007; Smelkinson et al., 2017; Zhu et al., 2008), we identify, in these study, 9 residues in ligand binding sites previously reported *in silico* by Darapaneni et al. (coloured in orange in Fig. 4) (Darapaneni et al., 2009); and 8 new potential hot spot residues (P114, I128, A155, G168, H169, K175, F201, A202) which, to our knowledge, have not been described before, regarding its druggability and individual role in human IAV (coloured in blue in Fig. 4). The residues 102, 104, 120 and 157 form part of ligand binding site 1; and the residues 109, 110, 120, 121, 180 and 184 form part of ligand binding site

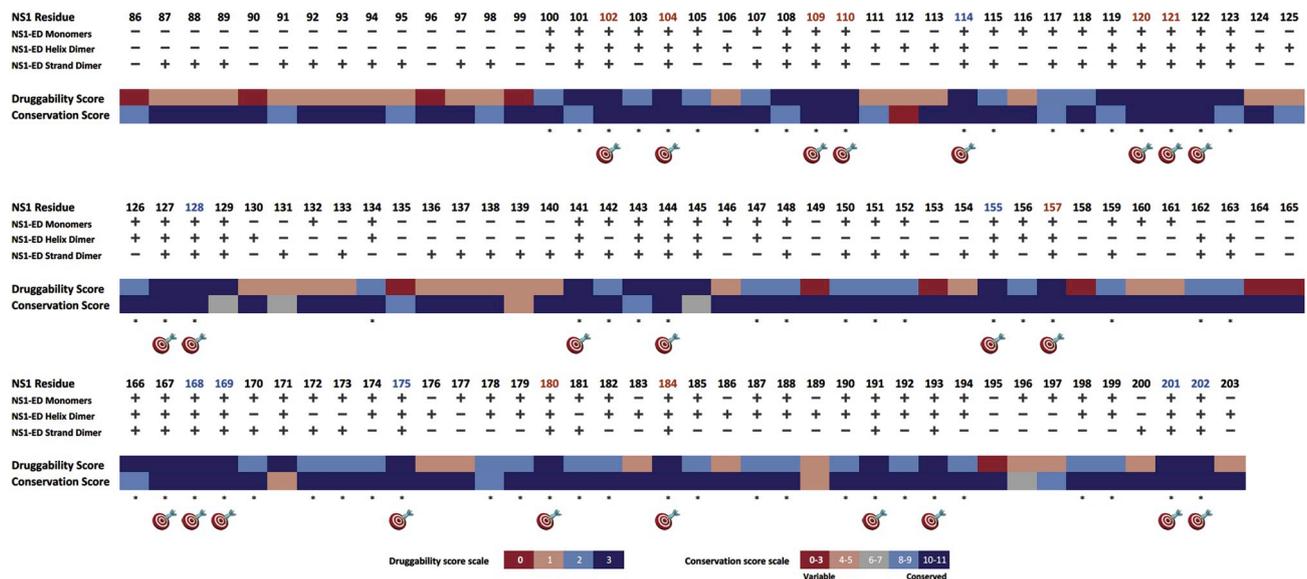


Fig. 4. Overall alignment of NS1-ED druggability along with the conservation scores for each residue position. The druggability prediction was based on the descriptors algorithm of each pocket bioinformatics tool: SF, DGSS and PDS; and for all the predicted NS1 conformations (monomer, helix-helix dimer and strand-strand dimer). The potential conserved druggable regions/sites are marked with an asterisk and the top hot spots are marked with a target. The residue numbers of the 8 new potential hot spot residues, which have not been described in the literature, are coloured in blue. The residues numbers of the 9 residues within the predicted ligand binding sites previously reported by Darapaneni et al. (which overlap with the residues identified in this study) are coloured in orange.

5 reported by Darapaneni et al. (2009). These residues should be further explored *in vitro* and *in vivo* regarding its individual role in protein function or structure on human-infecting IVA. These sites are mostly surface exposed, within pockets with high enclosure, and may represent attractive targets for pharmacological modulation since they potentially establish key interactions with host proteins or other viral factors; or might play a role in NS1 oligomerization, considering its location and the amino acid physical and chemical properties.

We have demonstrated here that highly conservation regions frequently overlap with potential binding sites/residues (characterized with high druggability scores), rendering the NS1 a very good drug-target for small-molecule antiviral drug discovery. For instance, targeting the ED dimerization and oligomerization (mainly mediated by W187), the binding pocket critical for CPSF30 binding (mediated by the residues F103, M106, E186 and W187) the NS1-p85 β interaction (mediated by Y89, M93, I95, M98, N133, E142, V145, P162 and P164) or potential binding sites near the RNA-Binding Region (R35, R38, K41, and R46) or involved in RBD dimerization (R35 and R46) have been reported as valuable promising strategies for antiviral design (Das et al., 2008; Engel, 2013; Hale et al., 2010a; Hsu, 2018; Jiao et al., 2008; Kochs et al., 2007; Lalime and Pekosz, 2014; Lopes et al., 2017; Marc, 2014; Schierhorn et al., 2017). The current analysis has revealed additional potential targets within the three main consensus druggable pockets, other than the NS1-RBD:RNA, NS1-ED:CPSF30 and NS1-ED:p85 β interaction regions reported in the literature (Engel, 2013; Hale et al., 2010a; Hsu, 2018).

A previous exquisite study based on 2620 NS1 sequences from all influenza subtypes until 2008, carried out by Darapaneni et al., has employed similar approaches in order to identify conserved binding sites predicted for the NS1 H5N1 virus structure, towards the development of anti-NS1 drugs (Darapaneni et al., 2009).

To our knowledge, there has been no published study to date, specifically addressing the conservation and druggability of NS1 protein in such a wide range of NS1 full-length sequences ($n = 28392$), until 2018, which finally includes the H1N1pdm09 virus and the newly emerging zoonotic H7N9 virus; together with the crystallographic structures of all available human-infecting influenza subtypes (prior H1N1sea, H1N1pdm09, H3N2 and H5N1). Additionally, this is the first approach where distinct bioinformatics tools and algorithms were compared and employed to integrate the conservation information with the druggability prediction for each site within the protein structure, and for all the predicted NS1 conformations (monomer, helix-helix dimer and strand-strand dimer). In this context, all NS1 conformations were taken into account in this work (contrarily to previous studies which only consider the monomeric state of the protein) (Darapaneni et al., 2009; Nayak et al., 2014) because not only the NS1-RBD dimerization is essential for RNA binding, but the effector domain can also dimerize and oligomerize to enable NS1 pleiotropic functions in a spatial and temporal fashion (Aramini et al., 2014). In fact, the homodimeric state of NS1-ED is suggested to be the predominant form at later stages of influenza infection (via either helix-helix or strand-strand dimer conformation) (Aramini et al., 2014; Hale, 2014), so it is essential to be included in NS1 structural studies.

To date, the available full-length NS1 crystal structures are limited to the H5N1 and H6N6 subtypes (Bornholdt and Prasad, 2008; Carrillo et al., 2014). Applying the methodologies used in this study to the dimerized full-length NS1 protein of H1N1pdm09, H3N2 and other IAV subtypes, along with NS1: host-proteins or NS1-RNA complexes, would significantly help to clarify the comprehension of NS1 pleiotropic and multistructural features.

In silico computational methodologies accelerate the drug design process and guide the experimental efforts, but they have limitations considering the lack of experimental validation (Cichonska et al., 2017; Sliwoski et al., 2014). Hence, the hypotheses presumed in this study should be strengthened by experimental data.

3. Conclusion

In this study, we report a promising antiviral strategy directed to highly conserved druggable key NS1 regions as a result of an exhaustive large-scale sequence analysis and structure characterization of NS1 protein across multiple human-infecting influenza A subtypes, which promotes target identification efficiency. To the best of our knowledge, this is the most comprehensive study regarding the conservation and druggability of influenza A NS1 performed to date.

The data surveyed here is a starting point to further explore the molecular mechanisms underpinning NS1 multifunction nature, with the aim of identifying the most promising cellular and viral pathways and the corresponding NS1: host-protein interaction complexes that can, in turn, be investigated and targeted for novel anti-NS1 strategies. In a broader-sense, this research also contributes to a deeper comprehension into the evolutionary dynamics of influenza NS1.

We have identified 8 new potential conserved hot spot residues in the NS1 protein which have not been described before in the literature, additionally to other 9 residues in ligand binding sites previously reported by Darapaneni et al.; and also 7 residues which have been described in the literature as playing an important role in protein structure or function. These surface-distributed sites represent attractive targets for pharmacological modulation, rendering the NS1 a promising target candidate for molecular medicine. We preconize that an anti-influenza strategy targeting potential functionally or structurally highly conserved sites, in a protein exclusively expressed in the infected cell, is less prone to the emergence of resistant variants and are expected to be useful against all influenza A viruses affecting the human host.

Our study provides a robust roadmap and a structure-based rationale that have the potential to accelerate NS1 target validation. The findings from this project contribute to enlighten the clinical applicability of the influenza A virus NS1 as an emerging therapeutic strategy. In this context, this study lays the basis for future work in the discovery and design of antiviral drugs targeting the NS1 protein.

4. Forthcoming research

Further studies are important to explore and characterize the structure–function relationship of the disclosed highly conserved residues and identify the role for individual sites.

Considering that NS1 is a multifunctional protein, which interacts with multiple host proteins and viral factors, exploring individual sites regarding the structure–function relationship studies, can make the interpretation of these data very complex, since a single (loss-of-function) mutation might exert more than one consequence regarding NS1 function during IAV infection. In this context, it would be interesting to explore the corresponding cellular and viral pathways and the underpinning mechanisms that are affecting the effective viral replication for a specific site. Hereof, the results could also contribute to a comprehensively understanding of the infection pathogenesis and dynamics of virus replication regarding NS1 multifunction.

Further studies regarding NS1 druggability should also be extended to the RBD domain.

The strategies used for NS1 protein can be broadened applied to other influenza proteins for a structure-based prediction of druggable targets in the direction of new antiviral therapy approaches.

5. Material and methods

5.1. Dataset construction and sequence analysis

NS nucleotide sequences of worldwide circulating viruses – available since 1918 until February 2018 – from human-infecting influenza A subtypes were obtained from the NCBI Influenza Virus database at www.ncbi.nlm.nih.gov/genomes/FLU/FLU.html, GISAID's EpiFlu™ database at www.gisaid.org and Influenza Research Database at <https://>

www.fludb.org/brc/home.spg?decorator=influenza (Bao et al., 2008; Shu and McCauley, 2017; Zhang et al., 2017).

All available sequences with a complete coding region were collected for the study. Duplicated sequences between the sources and sequences containing degenerate nucleotides were removed. Additionally, 51 unpublished sequences of viruses circulating in Portugal during 2009–2010 and 2010–2011 seasons were included to the final dataset. The nucleotide sequence alignment was performed using the Clustal Omega webserver available at <https://www.ebi.ac.uk/Tools/msa/clustalo/> (Kumar et al., 2016; Sievers et al., 2011).

The study of protein length variation (LV) distributions among each influenza virus subtype was performed using MEGA7 (Kumar et al., 2016).

5.2. Conservation analysis

The amino acid conservation in the multiple sequence alignment (MSA) was calculated using the Valdar scoring method from the Jalview AACons Web server (version 2.10.4) (Valdar, 2002; Waterhouse et al., 2009). The weighted scores incorporated into the Valdar conservation scoring method consider the sequence redundancy in the multiple sequence alignment, since the sequence weighting attributes higher weights to sequences that present greater diversity from the rest of the alignment. In this way, it normalizes against redundancy and bias in the MSA (reducing the effect of bias sampling and penalizing gaps) with no loss of evolutionary information (Valdar, 2002). This scoring system has been previously applied with success by other authors regarding the conservation analysis of influenza virus proteins other than NS1, since this system has been suggested to be essential for a proper conservation score analysis of influenza virus sequences (Kukol, 2017; Patel and Kukol, 2017). The conservation degree was given as a numerical score, with a range between 0 (high variable site) and 11 (highly conserved site), for each amino acid site in the protein (Valdar, 2002; Waterhouse et al., 2009). Residues with conservation score of 11 corresponded to absolute conserved sites (100% amino acid identity); residues with conservation score ≥ 10 were considered highly conserved; residues with conservation score of 7–9 were considered conserved; and residues with conservation score ≤ 4 were considered variable (Livingstone and Barton, 1993). Considering that the LR and the CTT contain several gaps and deletions, both regions were considered *a priori* as variable regions. The distribution of percent identity of all conserved regions (containing ≥ 10 aa) was also studied. The amino acid frequency percentage for each position and per region within the NS1 protein were calculated using the computer program DAMBE version 6.4.40 (Xia and Xie, 2001).

5.3. Protein structure

Crystallographic structures of influenza NS1 protein were obtained from the RCSB Protein Data Bank (www.rcsb.org) (Berman et al., 2000). Reasonable X-ray crystallographic structures of the prior seasonal H1N1 influenza (PDB entries 2GX9, 3O9U) (Kerry et al., 2011); H1N1pdm09 influenza (PDB entry 3M5R); H3N2 influenza (PDB entry 3EE9) (Xia et al., 2009); and the H5N1 influenza (PDB entries 3F5T – full length; and 3P38) (Bornholdt and Prasad, 2008) structures were selected for the study. The crystallographic three-dimensional structures were accurately prepared (including removing water and bounded ligands, protonation and energy minimization) using MOE 2015.10001 program (Molecular Operating Environment (MOE), 2016).

5.4. Druggability

The druggable sites in the effector domain of NS1 protein were predicted using the webserver DoGSiteScorer at <https://proteins.plus> and PockDrug-Server at <http://pockdrug.rpbs.univ-paris-diderot.fr/>; and the commercial software MOE-SiteFinder from Chemical

Computing Group (Hussein et al., 2015; Molecular Operating Environment (MOE), 2016; Volkamer et al., 2012).

The commercial tool SF of MOE 2015.10001 software is based on a geometry-based method. The top ranked sites with a positive score, according to the Propensity for Ligand Binding – PLB index and the hydrophobic contact count, were considered druggable (Molecular Operating Environment (MOE), 2016).

DGSS server (<https://proteins.plus>) is based on a grid-based method incorporated in a support vector machine model for druggability predictions. The algorithm is based on geometric (size, shape) and physicochemical descriptors and provides a druggability score between the values: 0 (undruggable) to 1 (druggable), for each pocket. Pockets with a druggability score ≥ 0.4 were considered druggable (Volkamer et al., 2012).

PDS (<http://pockdrug.rpbs.univ-paris-diderot.fr>) is based on a geometry-based method (Hussein et al., 2015). The PDS tool retains the best combinations of three pocket properties: geometry, hydrophobicity, and aromaticity. Pockets with a druggability score ≥ 0.5 were considered druggable (Hussein et al., 2015).

Initially, the druggability prediction for the NS1 conformation groups: (1) ED monomers (PDB IDs: 3EE9, 3F5T, 3M5R and 3O9U); (2) the helix–helix ED dimers (PDB IDs: 3EE9, 3M5R and 3O9U); and (3) the strand–strand ED dimers (PDB IDs: 2GX9, 3M5R and 3P38) has been individually studied using one by one of the three bioinformatic tools: (a) SF, (b) DGSS and (c) PDS. Subsequently, a comparative analysis was performed by merging the druggability information from the three bioinformatic tools for each one of the NS1 conformation groups.

The last stage of the study consisted of a global comparative analysis, including the most prevailing druggable sites from the three bioinformatic tools together, and shared by all the three NS1 conformation groups, in order to produce a final druggability prediction - druggability consensus. The druggability consensus was manually analysed in parallel with the conservation information in order to identify druggable binding sites/pockets or potential hot spots residues that overlap or are spatially close to the conserved NS1 regions/residues (which were named as “consensus druggable pockets”).

The coordinates of the highly score druggable pockets were mapped onto the three-dimensional NS1 structures. The figures were prepared with PyMOL Molecular Graphics System, version 1.7.6 (Schrödinger, LLC; <https://pymol.org>). (Schrodinger, 2015).

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Declarations of interest

None.

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Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.virol.2019.04.009>.

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