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Application of "Omics" Technologies for Diagnosis and Pathogenesis of Neurological Infections

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Abstract Infections of the human nervous system have substantial morbidity and mortality but also represent among the most challenging of all neurological diseases because of the difficulty in establishing a diagnosis and implementing effective therapies. Neurological infections lead to altered expression levels of a wide range of host- and pathogen-derived biomolecules both within and outside of the nervous system. Quantitative analyses of these biomolecular perturbations have been traditionally performed using "classical" molecular or analytical methods, which evaluate one or few genes or their products at a time. Recent technical developments together with the increasing availability of high-throughput/content methodologies have enabled a more comprehensive overview of these molecular alterations and thus provide new approaches to the diagnosis and/or treatment of this group of disorders. Herein, we will review recent evidence pointing to the capacity of the so-called omics techniques in studying the nervous system infections with an emphasis on genomics, transcriptomics, and proteomics technologies.

Keywords Genomics · Transcriptomics · Proteomics · Systems biology · Nervous system · Neurological infections

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Introduction

The increasing availability of the "Omics" technologies has ushered in a new era in the fields of microbiology and infectious diseases. High-throughput, high-content genomics, transcriptomics, proteomics, and metabolomics methods, combined with robust bioinformatics and computational tools have enabled researchers to obtain information about quantities and interactions of different biomolecules at system and whole organism levels [1, 2]. When applied to host-microbe interactions, these methods can provide unparalleled information about the complex nature of microbial infections' pathophysiology [3, 4]. In the field of infectious diseases, neurological infections have been a particularly important area of research and clinical care, partly due to their high morbidity and mortality rates but also due to immense challenges inherent in establishing a diagnosis and subsequent management of the central nervous system (CNS) infections. These obstacles stem from the complexities in disease presentation, relative inaccessibility of tissues, and the limited CNS penetration of some anti-microbial/viral therapies.

In this review, we will focus on the applications of the omics methods in the diagnosis and pathogenesis of neurological infections. Given the interconnected nature of biomolecular networks, the information derived from different omics methods can be integrated to provide a complete view of the system (e.g., infectious agent and host responses) under investigation. Indeed, biomedical researchers use several omics platforms simultaneously to gain more detailed and accurate insights into the biological system(s) under investigation. Nonetheless, rather than discussing different types of omics information for individual neurological infections, in this review, we will examine the available information in separate genomics, transcriptomics, and proteomics sections. In each section, the findings of omics studies for major neuropathogenic microorganisms, including viruses, bacteria, and prions will be reviewed.

Genomics Studies and Neurological Infections

Unlike the traditional Sanger sequencing in which nucleic acid sequencing was limited to few DNA samples at a time, the socalled next generation sequencing (NGS) methods have the capability to sequence millions of sequences simultaneously and expediently [5]. The ability to sequence the entire nucleic acid content (DNA and RNA) of human tissues, which is a highly complex mixture of human nucleic acids as well as that of microbial flora and microbial pathogens, is transforming the way microbes and host-microbe interactions are detected and investigated [6]. Indeed, before the advent of highthroughput sequencing, detection of microbial pathogens was almost entirely based on traditional Koch's postulates, which required isolation and culture of the microbes. Definition of natural microbial flora was similarly dependent on microbiological or low-throughput molecular methods. While the field is still in its initial stages, in this section, we will summarize some of the recent findings of "genomic" studies on nervous system-microbe interactions.

Genomic Studies on Viral Infections of the Nervous System

Viral infections of the nervous system have been a focus of medical research for generations both because of direct morbidity and mortality caused by neurovirulent viruses and due to potential association of viral infections with other nervous system disorders including neuroinflammatory disorders. NGS methods have been used both for detection of viral pathogens when classical virology or molecular methods have failed and for investigating the association of viruses with other neurological entities.

Identifying viral agents that might be responsible for encephalitis of unknown etiology represents a classical example of the application of NGS methods to neurological infections. There are a few reports highlighting the potential diagnostic value of NGS in this area. Using deep sequencing, Chan et al. successfully identified viral agents in some autopsy brain tissues from cases of encephalitis with unknown cause [7]. Using NGS analysis followed by confirmatory tests, they identified herpes virus-1 and measles virus in three encephalitis cases. In a similar study, using NGS analysis of a brain biopsy tissue, Naccache et al. were able to identify a neuroinvasive astrovirus as the cause of a fatal case of progressive encephalitis in an immunocompromised patient [8]. Likewise, through high-throughput sequencing of randomly amplified cerebrospinal fluid (CSF) nucleic acid sequences, Benjamin et al. were able to identify parvovirus 4 genome in CSF samples from pediatric cases of encephalitis with unknown etiology [9]. In addition to human samples, NGS methods have been used to survey for the presence of known viruses or evolution of new viruses in arthropod vectors as well as veterinary samples [10]. Even when the viral etiology is known through classical molecular techniques, NGS methods can be used to detect the viral strain, as well as transcriptomics changes, following infection with neurovirulent viruses. Massive parallel sequencing performed on brain tissues derived from a patient with rabies virus infection by our group showed numerous sequence tags corresponding to different regions of silver-haired bat-associated RV (SHBRV) strain 18 of rabies virus, a finding that was consistent with patient's medical history [11].

With the emergence of retroviral infections of the nervous system in late twentieth century, there has been a resurgence of interest in neurovirology and in applying more sophisticated molecular methodologies in understandings them, considering the more subtle nature of retrovirus-host interactions [12]. HIV-1 and HTLV-1 are the two major retroviruses in humans, both of which infect the nervous system and cause neurological disorders. The majority of omics studies in the context of retroviral infections of the nervous system have focused on transcriptomic analyses (see below). Nonetheless, some research effort has been put into analyzing the impact of retroviral infection and associated immunosuppression on microbial agents in the brain. In a study by our group, we analyzed the impact of HIV infection on host brain microbiome using NGS methods [13•]. HIV infection of the brain is characterized by microglial and astrocyte activation and the induction of numerous proinflammatory cytokines and mediators. Nonetheless, sequence tags derived from the brains of HIVinfected individuals showed a preponderance of human endogenized retroviral RNA sequence elements belonging to the human endogenous retrovirus-K (HERV-K (II)) family compared to uninfected individuals that were chiefly located in neurons and subsequently shown to exert neuroprotective effects [14].

Aside from the identification of viral etiologies for encephalitis, researchers have harnessed the strength of NGS in pathogen detection to test the hypotheses regarding the association of viruses with other neurological disorders. One interesting example is the controversial association between viruses and neurological malignancies, including the aggressive brain tumor, glioblastoma [15, 16]. The presence of CMV genomic DNA and transcribed mRNAs has been reported in glioblastoma samples [15]. CMV antigens have also been detected in these samples by some laboratories but not others [15]. Having important therapeutic implications, unbiased next generation sequencing has been recently applied to glioblastoma samples to find a definitive answer. In one study, high coverage DNA sequences of 34 glioblastoma samples failed to detect CMV DNA in surgically resected tumors [16]. In another study on high-grade glioma samples, NGS detected viral sequences belonging to EBV and roseolovirus (HHV-6 and HHV-7) but not human CMV in the samples [17]. Another NGS study of glioblastoma samples reported an anti-viral-like type I interferon response in some samples, yet it failed to detect any viruses [18]. Neuroinflammatory diseases are another group of neurological disorders whose association with viruses has been speculated for a long time. Multiple sclerosis (MS) is an important neuroinflammatory disease, which is caused by autoimmune inflammation directed against myelin antigens. While molecular and immunological data have pointed to association with infectious agents, including members of the herpesvirus family and endogenous retroviruses, the issue remains highly controversial [19, 20]. Several groups have used NGS to detect viral genomes in multiple sclerosis tissues or CSF. In an interesting study, Kriesel et al. performed deep sequencing of RNA extracted from 50 frozen MS brain samples as well control tissues. After subtracting sequence reads related to human transcripts, they were able to detect an overrepresentation of sequence belonging to 12 different viral taxa in some of the MS samples [21]. These included sequences from GBV-C, a virus not previously associated with MS. Interestingly, sequence hit rate was not significantly different between MS and control cases for several viral taxa that were previously associated with MS, i.e., CMV, HHV-6, EBV, and measles virus [21, 22]. In another study, Schmitt et al. used high-throughput amplicon sequencing to perform a comprehensive analysis of the transcription of HERV-W loci in MS brains. The researchers were able to identify transcription from more than 100 HERV-W loci in the brains of MS patients [23]. Our group reported that there are multiple loci of transcription for the Syncytin-1 (envelope) gene encoded by HERV-W but 7q21.2 was the principal locus using a combination of conventional and NGS approaches [24]. In summary, NGS has provided new insights into identities and actions of ancient and current viruses in the nervous system.

Genomic Studies on Bacterial Infections of the Nervous System

NGS methods have been used to investigate multi-agent bacterial infections of the CNS. In an interesting work by Kommedal et al., the investigators used NGS methods to analyze bacterial species derived from brain abscesses in 52 surgical samples. Using an ion torrent NGS method, the researchers generated an average of 50,000 sequence reads of amplified 16 s bacterial RNA per sample [25]. This method was able to detect threefold more bacterial species compared with conventional culture methods, highlighting the capacity of high-throughput genomics in unraveling the complex nature of polymicrobial brain infections. In another study, unbiased NGS was used to detect a potential pathogen in a case of meningoencephalitis in which all pathogen-specific PCRs and infectious disease investigations on plasma, urine, CSF, as well as brain biopsy yielded negative results [26•]. NGS performed on the nucleic acid extracted from the CSF of the patient detected sequence reads corresponding to a leptospira species, a finding that was later confirmed by PCR. This led to a diagnosis of neuroleptospirosis, which was successfully treated [26•].

Similar to viral infections, some bacterial infections have also been reported to be associated with nervous system autoimmune and inflammatory disorders. One key example is the reported association between Campylobacter jejuni (C. jejuni) enteric infections with Guillain-Barré syndrome (GBS) [27, 28]. Considered to be a result of "molecular mimicry" associated with particular strains of the bacterium, comparative genomic analysis methods have been used to gain information about the strain of C. jejuni in GBS cases. In a study by Taboada et al., researchers used comparative genomic hybridization to identify isolates of C. jejuni, which show an association with GBS [29]. Altogether, these studies illustrate the ability of high-throughput sequencing to generate information about microbial etiology or associations with neurological disease, which is beyond the grasp of traditional molecular methodologies.

Transcriptomics Studies and Neurological Infections

Transcriptomic analyses are the most frequently performed type of omics research in neurological infections. As a general rule, host–microbe interactions lead to altered gene expression in host tissues, which could be detected by classical lowthroughput gene expression analysis methods or highthroughput technologies including microarrays and RNA sequencing. While detection of altered gene expression might facilitate the diagnosis of neurological infections, transcriptomic methods have been chiefly used to gain insight into the molecular pathogenesis of neurological infections. Transcriptomic studies have been reported in numerous viral and bacterial infections of both central and peripheral nervous systems with viral infections of the CNS attracting more attention largely due to the emergence (or resurgence) of neurotropic viruses in the last few decades.

Transcriptomic Studies on Viral Infections of the Nervous System

HIV-associated neurological disorders are a group of nervous system diseases which occur as a consequence of HIV-1 infection of nervous system. HIV-associated neurocognitive disorder (HAND) is a neurocognitive syndrome, which results from direct infection of brain macrophages including microglia and trafficking macrophages by the virus, prompted by infiltration of infected monocytoid cells into the CNS [30].

Unlike many neurotropic viruses, HIV does not infect neurons and displays minimal productive infection of astrocytes. Nonetheless, synaptic injury and eventual neuronal apoptosis are key neuropathological features of HAND. While the HIV genome encodes proteins with direct neurotoxic properties, it is also widely accepted that transcriptional changes induced by HIV in monocytoid cells and astrocytes lead to widespread neuroinflammation with adverse effects on neuronal viability and survival [12]. Transcriptomic studies carried out by different groups have helped elucidate neuropathogenic mechanisms activated in HIV-infected brain tissue. One of the first studies was performed by Roberts et al., using the frontal lobe tissue of SIV-infected monkeys, a primate model for NeuroAIDS. They identified 98 genes including cell cycle and signaling and proteinase inhibitor genes, which showed upregulation in the brain following SIV infection [31]. Likewise, transcriptomic analysis of human brain tissue infected with HIV has shown dysregulation of numerous genes in HIVinfected brain, including increased levels of anti-viral and immune response-related gene and diminished levels of transcripts associated with synaptic transmission and neurogenesis [32]. Of note, brain transcript profiling of patients receiving anti-retroviral therapy demonstrated significant reduction in gene expression dysregulation in treated individuals [32]. Transcriptional profiling has also been performed on neural cells exposed to HIV or its proteins [33–37]. Interestingly, a meta-analysis comparing the results of transcript profiling in HAND, Alzheimer's disease, and multiple sclerosis reported similarities in gene dysregulation between these three neurodegenerative disorders, which underlines the activation of similar neuropathogenic and/or neuroprotective mechanisms in CNS despite various etiologies [38].

West Nile virus (WNV) infection of the nervous system is another example of an emerging neurological infection [39]. A flavivirus, WNV infection of the nervous system can manifest as encephalitis, meningitis, or myelitis [40, 41]. Transcriptomic studies of WNV have been performed in WNV-infected neural cells or CNS tissues derived from WNV-infected animals. In a study by Koh et al., researchers analyzed the transcriptome of human glioblastoma cells exposed to the virus and found upregulation of different groups of transcripts including transcripts involved in interferon responses and apoptosis [42]. Interestingly, they also observed suppression of several mitochondrial genes involved in energy metabolism in infected cells [42]. Another study of WNVinfected mouse brains also found enhanced levels of interferon response genes and apoptosis in brain tissues infected with highly neuroinvasive WNV strains [43].

Transcript profiling techniques have been applied to detect gene expression changes in another flavivirus-mediated neurological infection, Japanese encephalitis virus (JEV). Microarray profiling of transcripts derived from JEV-infected neuroblastoma cells by Gupta et al. found induction of apoptosis and anti-viral response genes as well as chemokines [44]. Whole genome sequencing of JEV-infected mouse brains by the same group produced differential expression of pattern recognition receptors and components of inflammasome as well as chemotactic factors following virus infection [45]. Similar findings indicating the induction of pattern recognition receptors in mouse neurons and brains tissue following JEV infection has been reported by other groups [46]. In a remarkable study by Clarke et al., researchers compared transcriptomic changes caused by three neurotropic viruses, i.e., WNV, JEV, and reovirus in mouse brain [47]. Consistent with previous studies, genes related to interferon responses and neuroinflammation as well as cell death were among the altered genes. The two flaviviruses, WNV and JEV, but not the reovirus, induced the expression of tRNA synthetases while all three viruses suppressed genes associated with glutamate signaling [47].

Host and Pathogen Transcriptomic Studies on Bacterial Infections of the Nervous System

Transcriptomic analysis of bacterial infections of the nervous system can be categorized into two groups; one group focuses on brain's transcriptomic changes following exposure to the bacteria while the other group concentrates on the bacterial transcriptional response during infection. As is the case for viral infections, host transcriptomic analyses aim to unravel both the neuroprotective or neuropathogenic molecular events at the RNA level. Using an ex vivo model of Lyme disease, Ramesh et al. applied DNA microarrays to assess the transcriptional response of primate brain cortical tissue following exposure to spirochetes. Altered expression of transcripts regulating inflammation, oligodendrocyte, and neuronal apoptosis was detected in the cortical tissues [48]. In a related study, researchers used complementary DNA (cDNA) microarrays to evaluate transcriptional changes in microglia and astrocytes following exposure to Borrelia burgdorferi in the presence of tetracycline antibiotics in culture [49]. Microarrays have also been used to assess the pathophysiology of bacterial meningitis at the transcriptomic level. Of interest, the response of human brain microvascular endothelial cells (hBMECs) to bacteria has been investigated by different groups. Banerjee et al. used microarrays to assess hBMECs response to pneumococci [50], and Wang et al. studied the response to Listeria monocytogenes [51].

In addition to host responses, transcriptomic studies focusing on the bacterial transcripts have provided information of applied importance. In a seminal study by Mahdi et al., researchers tried to identify pneumococcal virulence genes preferentially expressed during meningitis. Using a mouse model of pneumococcal meningitis, differential expression of 34 bacterial genes was identified. One differentially expressed gene, α -glycerophosphate oxidase (GlpO), showed cytotoxicity for microvascular cells and mutant bacteria lacking the gene failed to adhere to brain microvascular endothelia in vitro or cause meningitis in vivo. Immunization of mice with GlpO protected the animals against invasive infection [52•]. Such studies show the power of transcriptomic analyses in identifying candidates for vaccine development. In a similar study, transcriptional changes in *Neisseria meningitides* have been evaluated following the interaction of bacterium with epithelial cells and endothelial cells, representing two key stages of meningococcal infection [53]. Likewise, expression profiling of *Mycobacterium tuberculosis* genes has demonstrated transcriptomic changes within the mycobacterium during invasion of brain microvascular endothelial cells [54].

Transcriptomic Studies on Prion Infections

Prion infections of the CNS represent unique neurological infections because the infectious agent lacks nucleic acids but it alters host-encoded protein (PrP) conformation resulting in a pathogenic infectious agent. While prion agents cannot be subjected to NGS studies for the detection of pathogen because the encoding nucleic acids are host-derived, numerous host transcriptomic studies have been performed to investigate gene expression alterations following prion infections (reviewed in [55]). Similar to viral infections of the nervous system, transcriptional profiling has been employed chiefly to gain insights into the pathogenic mechanisms that lead to neurodegeneration during prion infection. In an interesting study, Crespo et al. identified a group of genes related to immune responses, which affect genes involved in prion replication and also neural cell death [56]. Bach et al. performed a transcriptional profiling on prion-infected neuronal cells and identified the induction of cholesterol synthesis-associated transcripts following infection [57]. Transcriptional profiling of laser capture microdissected CA1 neurons has been used successfully to determine gene expression dysregulation at the preclinical stages of disease, when there is a potential for interrupting the neurodegenerative process [57]. Moreover, to detect genes that are associated with susceptibility to prion infection, Marbiah et al. analyzed the transcriptome of prionresistant mutants of highly susceptible neuroblastoma cells, which led them to the detection of several genes with a role in extracellular matrix remodeling as potential determinants of cell susceptibility/resistance to prion infections [58].

While transcriptional studies have shed light on altered gene expression following infection at the RNA level, proteomic analyses of infected neural tissues and cells can provide further information, not accessible at the RNA level, about the pathogenesis of neurological infections. Conventional proteomic studies which use techniques including 2-D gel electrophoresis followed by mass spectrometric analyses (2DG/MS) have been used to identify differentially expressed proteins in a variety of nervous system infections. Moreover, more advanced quantitative technologies have also made it feasible to look at protein quantities during infections. Indeed, this latter approach may represent a harbinger for new perspectives on the pathophysiology of neurological disorders including infectious diseases.

Proteomics Studies on Viral Infections of the Nervous System

Similar to transcriptomic studies, a substantial part of proteomic studies on neurovirulent viruses has focused on HIVinduced neurological disorders, particularly HAND. In an effort to identify potential CSF biomarkers for HAND, Rozek et al. performed a proteomic study using cerebrospinal fluid (CSF) and were able to detect altered levels of several proteins including vitamin D-binding protein, complement C3, and cystatin C in CSF from patients with HAND [59]. Another CSF proteomic study revealed lower levels of antioxidant enzymes in CSF samples from cases with HAND [60]. Proteomic analyses of CSF from SIV-infected monkeys displayed higher levels of serine proteases including complement C3 and plasminogen together with alpha1-antitrypsin in the CSF following SIV infection [61]. Indeed, alteration in the CNS' protease-antiprotease network and the resulting variations in protein degradation have been implicated in HIV neuropathogenesis. Of interest, it has been shown previously that induction of a matrix metalloproteinase in HIV-infected macrophages leads to generation of chemokine cleavage products with significant neurotoxic properties [62].

In addition to CSF studies, several groups have undertaken proteome-level analyses on HIV-infected postmortem brain tissues or neural cells exposed to the virus or its proteins. Gelman et al. performed a focused proteomic study on the synaptosomes isolated from frontal cortex of HIVencephalitis cases. Results showed lower levels of synapsin1 and stathmin proteins and enhanced levels of 14-3-3zeta and 14-4-4epsilon proteins in HIV-infected brains [63]. 2DG/MS analysis of HIV Tat-expressing astrocytes showed altered levels of numerous proteins including cytoskeletal and signaling molecules in Tat-expressing cells [64]. HIV-infected macrophages have been demonstrated to affect brain microvascular endothelial cells' proteome, a phenomenon which might be related to perturbed BBB permeability during HAND [65]. HTLV-1 is another retrovirus which is capable of inducing neurological disorders, i.e., HTLV-1 associated myelopathy (HAM), also termed tropical spastic paraparesis (TSP). Proteomic analysis of CSF and plasma samples derived from HAM/TSP cases has identified several proteins, which could serve as potential biomarkers for disease [66].

Other neurotropic viruses including rabies have also been subject of proteomic studies. 2DG/MS proteomic analysis on postmortem human brain tissues infected with rabies virus showed altered levels of proteins related to cytoskeleton, metabolism, proteasome, and immune regulation [67]. Altered expression of cytoskeletal proteins have also been reported in 2DG/MS studies in neuronal cell lines infected with different strains of rabies virus [68]. Using iTRAQ quantitative proteomic method, Venugopal et al. detected overexpression of functionally diverse proteins including karyopherin alpha 4 (KPNA4), calcium calmodulin-dependent kinase 2 alpha (CAMK2A), and glutamate ammonia ligase (GLUL) in postmortem rabies brains [69]. Likewise, protein profiling of mouse brains infected with rabies has shown differential expression of proteins involved in ion homeostasis and synaptic function [70].

Proteomics Studies on Bacterial Infections of the Nervous System

Proteomic studies on bacterial infections of the nervous system have targeted different aspects of neuro-bacterial infections, including identification of vaccine targets, discovering bacterial virulence factors, and neuropathogenic mechanisms as well as rapid pathogen detection.

Detecting immunodominant proteins belonging to a pathogen is an active area of work in infectious disease proteomics, an area of research which is labeled "immunoproteomics" [71, 72]. Among bacteria which can cause neurological infections, N. meningitides has been subject of several immunoproteomic studies. A chief aim of these studies has been to detect parts of the meningococcal proteome that can induce a protective immune response against the pathogen. In a study by Tsolakos et al., researchers used proteomic analysis of N. meningitides type b (NMB) surface antigens to detect proteins which could be recognized by antibodies in the sera of MNB-immunized animals [73•]. Using this method, they were able to identify several new immunogenic proteins which are expressed at the surface of the bacterium [73•]. In another study, Williams et al. used an immunoproteomic approach to identify Neisseria antigens which could evoke cross-reactive antibody responses against different Neisseria strains and hence could serve as potential candidates for new meningococcal vaccines [74]. Similarly, Mendum et al. tried to identify Neisseria antigens which lead to cross-protective humoral immune responses in patients recovering from meningococcal infections [75].

Proteomics methods are making unprecedented contributions to the study of bacterial virulence factors [76, 77]. Application of quantitative proteomic methods to microbial proteins allows for organism-level determination of molecules which are expressed in virulent but not nonvirulent strains of a bacterium. This has provided microbiologists with a powerful tool for virulence factor identification. There are multiple reports of using proteomic techniques to detect virulence factors in major bacterial pathogens including Staphylococcus aureus, M. tuberculosis, and Yersinia pestis. In the context of neurological infections, proteomic-based investigations of virulence factors have been performed for N. meningitides. Gault et al. used proteomic methods to examine posttranslational modifications in Neisseria virulence factor protein, pilin [78]. Ferrari et al. have used proteomics methods to study outer membrane vesicles (OMV), bacterial-derived elements which are necessary for bacterial survival and pathogenesis [79]. In addition to examining cytoplasmic or cell surface proteins, virulence factor discovery has been accomplished through the so-called secretome analysis. This type of research applies proteomic methods to evaluate the complex set of molecules which are secreted by bacteria in culture or in infected tissues. The secreted bacterial proteins could act as virulence factors either by acting as a toxin or toxin transporters or by inhibiting immune responses [77]. Of interest, by comparing the secretome of virulent and nonvirulent strains of Cryptococcus, Campbell et al. identified proteins, which could enhance the neuroinvasiveness of a strain of these fungi [80]. Comparative secretome analysis has also been performed on secreted proteins from pathogenic N. meningitides [81].

Besides making contributions to vaccine design and virulence factor discovery, proteomic methods are revolutionizing the practice of clinical microbiology, where pathogen identification is a key objective [82]. In particular, matrix-assisted laser desorption ionization-time of flight mass spectrometry (MALDI)-TOF has proven to be a fast and reliable method for identification of bacteria in clinical samples [83]. That said, examples of proteomic-based pathogen identification in neurological infections are just emerging. In a report by Segawa et al., researchers used MALDI-TOF analysis of the CSF from a case of bacterial meningitis to detect Klebsiella pneumonia as a causative agent [84]. In another study, MALDI-TOF analysis of spinal fluid was successfully used to accurately detect the pathogen in a case of pneumococcal meningitis [85]. In addition to mass spectrometric analyses, protein microarrays generated by recombinant bacterial proteins have also been used to screen the sera of patients with meningococcal meningitis to identify potential diagnostic markers for disease [86]. Moreover, 2-DG/MS analysis of CSF as well as quantitative proteomics on brain tissue was employed for biomarker discovery in cases of tuberculous meningitis [87, 88].

Proteomic Studies on Prion Infections

Prion infections of nervous system have been subject of intense investigation by proteomic methods. Proteomic analyses have been used to address varieties of questions about prion disease, including structural analysis of prion proteins, biomarker discovery, detection of interacting molecules, and proteome dysregulation following infection [89].

In a remarkable study on human brain tissues, protein profiling of cortical and cerebellar tissues of Creutzfeldt-Jakob disease (CJD) and FFI cases by Shi et al. revealed both induction and suppression of numerous proteins in the affected brains. Pathways related to Parkinson's disease, Alzheimer's disease, oxidative phosphorylation, lysosome, protein export, and cytochrome P450 were among the affected pathways [90•]. Proteomic analysis of prion-infected mouse brain by Moore et al. showed dysregulation of proteins related to neuroinflammatory response and complement activation as well as cell death and metabolism [91]. In addition to in vivo analyses, in vitro systems in which neuronal cell lines are exposed to infectious prion particles have provided further information in proteomic studies. Of note, modified expression of cellular chaperone proteins including chaperones Grp78/BiP, protein disulfide-isomerase A6, Grp75, and Hsp60 has been reported in neuroblastoma cells exposed to prions, a finding which is consistent with induction of cellular protein misfolding by infectious prions [92]. In another line of studies, high-throughput protein interaction experiments have been performed to detect prion protein interacting proteins (PrPIPs) in cells. Using protein microarrays, Satoh et al. were able to identify 47 novel PrPIPs which were mainly involved in nucleic acid recognition [93]. Using 2-DE followed by mass spectrometry, Storm et al. also detected proteins involved in nucleic acid metabolism to interact with Prp (C) [94].

Several research groups have tried to use proteomic methods to discover biomarkers for prion disease. Creutzfeldt-Jakob disease (CJD) has been of particular interest in this area, considering that a definite diagnosis can only be made by postmortem analysis of the brain [95]. More than 15 years ago, 2D gel analysis of CSF from CJD patients led to the detection of 14-3-3 proteins as a disease biomarker [96]. Further 2D gel studies of CSF from CJD patients followed by mass spectrometric identification of proteins have later added other potential biomarkers to the list, including neuronspecific enolase, and lactate dehydrogenase in the sporadic CJD cases [97]. More recently, surface-enhanced laser desorption/ionization (SELDI)-TOF analysis of CSF from CJD and control cases has identified increased levels of ubiquitin and cystatin C in the CSF of these patients [98, 99]. Other potential biomarkers including fatty acid binding protein, FABP, have also been proposed by proteomic studies [100].

Conclusions and Future Perspectives

The advent of omics technologies has prompted the elucidation of the remarkable complexity of microbial agents and associated host responses in the CNS. Indeed, it is generally assumed that the nervous system is a sterile system/organ, devoid of any microbial flora unless a pathogenic agent entered and infected the CNS. This assumption has been challenged by NGS studies on brain-derived nucleic acids. Over the past three decades, multiple studies have shown that bacterial and viral proteins and nucleic acid sequences can be detected in human brain tissues in the absence of overt pathogenic CNS infections [101–104]. In a study by our group, massive parallel sequencing without prior amplification was performed on the cDNA derived from surgical brain resections and autopsied brain samples, which showed the presence of sequence tags belonging to different bacterial and viral species [13•]. Among bacteria, alpha-proteobacteria showed the highest frequency of sequence tags in both surgical resections and autopsy samples, a finding that was confirmed by amplifying the 16 s rRNA sequences from the samples [13•]. Similar findings in terms of microbial diversity were observed in the brains of SIV-infected macaques. These studies underscore the microbial diversity in the brain but also provide insight into the limitations of conventional technologies used for diagnosing and treating CNS infections.

There are other surfacing technologies that will contribute to the understanding of CNS infections including assays of microRNAs and metabolic products ("metabolomics"). Ongoing efforts to apply high-throughput analyses to microRNA expression in brain and plasma represent exciting opportunities to gain insights in disease pathogenesis and perhaps establish new biomarkers for disease [105–108]. Similarly, metabolomics approaches using nuclear magnetic resonance and mass spectrometry [11, 109] have been applied successfully to studying neurological infections and herald a new epoch in diagnosing and understanding these devastating diseases.

Compliance with Ethics Guidelines

Conflict of Interest Farshid Noorbakhsh, Atefeh Aminian, and Christopher Power declare that they have no conflict of interest.

Human and Animal Rights and Informed Consent This article does not contain any studies with human or animal subjects performed by any of the authors.

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