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Computer modeling of ischemic stroke

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The occlusion of a blood vessel in the brain causes an ischemic stroke. Current treatment relies on restoration of blood flow within 3 hours. Substantial research has focused on neuroprotection to spare compromised neural tissue and extend the treatment time window. Despite success with animal models and extensive associated clinical testing, there are still no therapies of this kind. Ischemic stroke is fundamentally a multiscale phenomenon where a cascade of changes triggered by loss of blood flow involve processes at spatial scales from molecular to centimeters with damage occurring in milliseconds to days and recovery into years. Multiscale computational modeling is a technique to assist understanding of the many agents involved in these multitudinous interacting pathways to provide clues for *in silico* development of multi-target polypharmacy drug cocktails.

Introduction

Stroke is a major cause of death or disability, the 5th leading cause of death in the US with prevalence of ~2.6% of the adult population [1]. Around 85% of strokes are ischemic [2]. Neuroprotective strategies would target the myriad destructive processes that occur following a stroke, including spreading depression, excitotoxicity, cytotoxic edema, accumulation of free radicals, etc., in order to extend the treatment time window and reduce the volume of damaged brain

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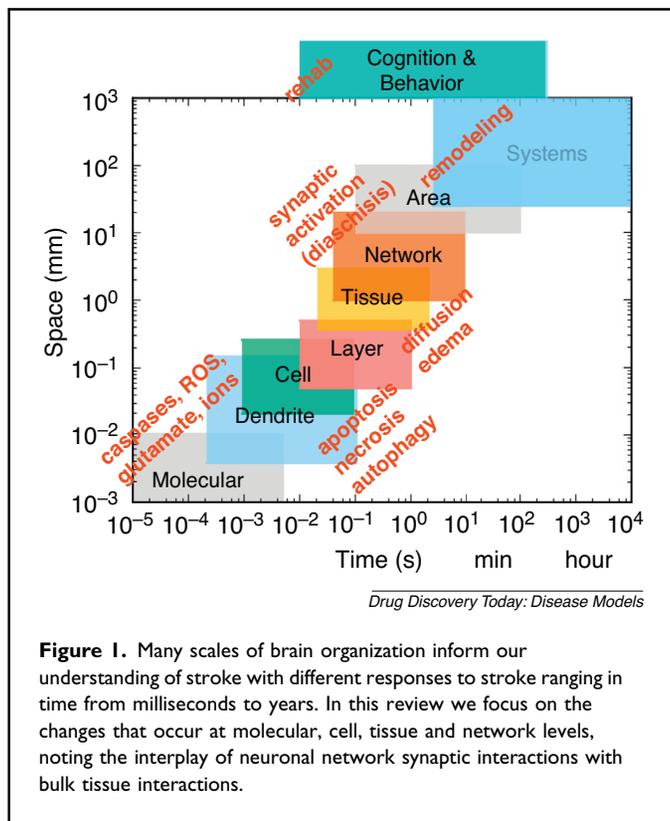
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tissue. Here we review current computational modeling efforts and consider their usefulness as a bridge for drug discovery which will help close the current gap between animal models and clinical trials.

Background

The many causes and types of stroke require vastly different approaches to prevention and treatment, and vastly different approaches to the type of multiscale modeling (computer simulation) that is used. For example, prevention of hemorrhagic stroke due to a blood vessel aneurysm must be understood in terms of laminar or turbulent blood flow under pressure and the various layers of the blood vessel that must fail, to give rise to this type of stroke; treatment would then be surgical prophylaxis for aneurysms deemed prone to bursting. Modeling ischemic stroke could also focus on the vascular system but would include pathophysiology of platelets, clotting cascades in the blood, to determine the likelihood of thrombosis formation. Such a kind of modeling approaches are particularly valuable to further understanding of the current standard of care through reperfusion. By contrast, cardiogenic stroke syndromes and preventive therapy would best be understood by modeling the left atrium of the heart. In this review, we will not look at either of these stroke types

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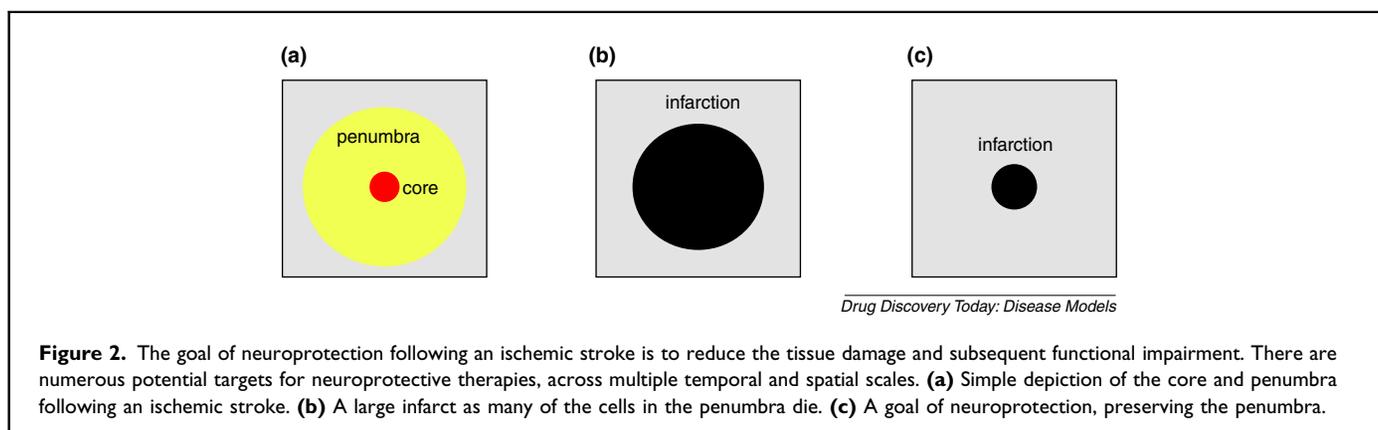
but will instead focus on the effects of ischemia on brain tissue. Of course, even the brain sans blood and blood vessels is itself a complex subject with many scales of interactions from molecular to tissue and network levels (Fig. 1). Within the brain, study of stroke includes additional topics of brain response, relevant to neurorehabilitation and recovery, as we have discussed elsewhere [3,4].

Damage to tissue in ischemic stroke is divided into three regions: (1) an infarct core where cells suffer irreparable damage and death, (2) a penumbra where cells may recover with reperfusion or with the assistance of neuroprotective therapy, (3) a further region of edema (benign oligemia) where spontaneous recovery is expected (Fig. 2).

The penumbra, vulnerable but salvageable, is the target of *neuroprotection strategies* (Fig. 2c). Unfortunately, despite thousands of experimental studies on neuroprotection, and hundreds of clinical trials, there are no approved neuroprotective drugs [5]. Agents that have been tried include Ca^{2+} antagonists [6], NMDA receptor antagonists [7] and free radical scavengers [8]. Neuroprotective agents that achieve substantial tissue sparing in animal models have resulted in high profile clinical-trial failures. The *clinical translation* problems result both from discrepancies between the experimental and clinical treatments and from underlying biological differences between test animals and humans.

Multiscale mechanistic computer simulation has the potential to bridge the gap between animal models of ischemic stroke and patient outcomes and to facilitate development of drug cocktails by improving our understanding of the many agents and processes involved in cell death. Computer modeling will elucidate the many nonlinearities in time (early, mid, late death) and in space (multiple cores and multiple penumbra). The volume of penumbra decays exponentially as cells die and the core expands. It has been estimated that ~ 2 million neurons die every minute following a stroke [9]. However, the many causes of cell damage and death are produced by feedback loops which are highly nonlinear (Fig. 3), and this average value of 2 million is expected to be unevenly distributed in both time and space.

Multiscale computational modeling in neuroscience is based on biophysically detailed models of neuronal circuits with pharmacologically relevant parameters [10], with spatial scales from brain regions to a single synapse and time-scales spanning single action-potentials to hours or even days. Such detailed models can identify key additional data required, provided quantitative predictions and hypothesis testing [11] and potentially provide an *in silico* platform for drug discovery [12]. Computational neuroscience has traditionally built models focused on electrophysiology, synaptic signaling and corresponding network activity [13]. However, multiscale modeling for ischemic stroke must involve not only neuronal



membrane depolarisation and subsequent influx of Ca^{2+} via voltage-gated calcium channels. Depolarization leads to a rise in extracellular K^+ , which may cause other neurons to depolarize in a phenomenon known as spreading depression. Influx of Ca^{2+} is augmented by calcium induced calcium release from endoplasmic reticulum. Elevated intracellular Ca^{2+} causes vesicles release, and glutamate that spills out into the ECS can extrasynaptically excite surrounding neurons. Both synaptic process and extracellular glutamate contribute to *excitotoxicity*, a neuronal damage through excessive stimulation [15]. Excitotoxicity is particularly potent in the low nutrient environment of the penumbra since impaired cells cannot keep up with the increased metabolic demands. Cytotoxic edema (accumulation of water inside cells) results from osmotic movement of water into cells [16]. Astrocytic swelling reduces the volume fraction of ECS, causing further increase in concentration of damaging agents [17]. The rapid changes trigger several perpetrators, agents believed to be responsible for the functional and structural changes that lead to cell death, such as calpain (part of a family of calcium dependent enzymes that break down the cytoskeleton and may damage ion channels), and phospholipase activation that breaks down cell membranes [14]. Free radicals are a key perpetrator and include ROS and reactive nitrogen species (RNS). ROS are produced in mitochondria when the electron transport chain fails and are removed by scavenging enzymes. Oxidative stress occurs when the production of ROS exceeds the cell's ability to remove them. Nitrogen oxide (NO) is a neurotransmitter and neuromodulator; though it is necessary to maintain vascular tone and cell homeostasis, it is rapidly cleared with a half-life of a few seconds. Production of NO by nitric oxide synthase (NOS) increases $\sim 20\times$ in ischemic stroke. Toxicity then occurs directly or via the formation of peroxynitrite, a RNS.

There are many models that focus on cell damage and death under a variety of pathological conditions, which are relevant to the understanding and model development for ischemic stroke. For example, in a model of mitochondria of a pancreatic β -cell, suspension of the electron transport chain (as would occur in ischemic conditions) leads to the failure of proton pump and subsequent high mitochondria membrane potential, resulting in an increase in proton leak and a corresponding increase in ROS [18]. Models of oscillations between the protein Mdm2 and gene p53 showed that Ca^{2+} induced increases NOS shift the systems from sustained oscillation to an oscillation death regime [19], emphasising the importance of considering noise in the system because of the low copy number. Detailed biophysical models of apoptosis, particularly focus on caspase, the principle signalling pathway for cell suicide. Caspase is activated by binding of surface receptors or in response to oxidative stress. Modeling has to identify factors that lead to the heterogeneity of cell fates, protein interactions that can promote or suppress

apoptosis and have the potential for *in silico* drug development [20–23]. Intracellular Ca^{2+} plays a vital role in neuronal signalling and biophysiology, so it has been extensively modeled in both physiological [24] and pathological conditions [25], and it is also a principle agent in the ischemic cascade (Fig. 3), penumbra responsible for much of the subsequent toxicity. Such models are valuable for future development of multiscale models of ischemic stroke.

Tissue scale modeling

Spreading depression is a wave of depolarization that propagates through tissue at 2.5–7 mm/min and can last at a particular location for ~ 1 min. Spreading depression results from several causes but one that is best explored is due to the leak of K^+ from cells with spread through ECS and subsequent depolarization with further release from affected cells, with extracellular K^+ levels exceeding K^+ a threshold ~ 27 mM that is modulated by NO [26]. Spreading depression is seen not only in ischemic stroke, but also in migraine and epilepsy. In the latter disorders, there is sufficient energy so that the depolarized cells will repolarize once the excessive extracellular K^+ is cleared by astrocytes. In ischemic spreading depression, this clearance and repolarization will fail. Phenomenological models have attempted to capture the key events while abstracting away from the biophysical details. One model for spreading depression used functions to represent blood flow, energy (available and required), cellular damage and ability to repair, with the mode of cell death determined by simple thresholds. The model showed a correlation between the temporal frequency of spreading depression waves and the rate of expansion of the core. Repeated spreading depression waves increased core size by $\sim 30\%$ [27]. Mathematical modeling indicated an essential role for the Na^+ - K^+ pump, which fails in ischemic causing K^+ to leak into the ECS [28] and cellular swelling, which greatly reduces the volume of the ECS while increasing the tortuosity [29].

At the tissue scale it is necessary to consider the extracellular changes in the ischemic cascade. Concentration changes of ions and molecular signals of cell damage diffuse through the ECS at various rates influencing a large volume of tissue. Within minutes of ischemic stroke the cells at the core are fatally damaged and undergo necrosis, cells in the penumbra will also perish if not protected until blood supply is restored. Measurements from diffusion weighted MRI (DWI) indicate a rapid growth in the core over the first 3 hours after stroke [30]. Inflammation is triggered following ischemic stroke. At early stages, inflammation is harmful, increasing the concentration of free radicals and intracranial pressure. Later, inflammation may be beneficial as it clears dead cells to allow rewiring. Two key cell classes for inflammation in the brain are microglia and leukocytes. Microglia are rapidly activated following an ischemic stroke and will eliminate dead cells via

phagocytosis. In doing so, they release free radicals, NO and pro-inflammatory cytokines. Cytokines attract leukocytes from the blood. Within hours of the stroke, neutrophils enter which can be harmful as they enzymatically degrade cells. After around 24 hours, macrophages enter and perform further phagocytosis, clearing dead tissue from the infarct core. A detailed mathematical model was developed that considered the densities of these cells in different tissue states – healthy, necrotic, apoptotic and undergoing apoptosis [22]. That model revealed a nonlinear relationship between initial core volume and the ultimate size of the infarction. These data could then be used to predict the efficacy of anti-inflammatory therapy.

Ischemia triggers yet another positive feedback loop as vasoconstrictor substances such as endothelin are released and further reduces blood flow. Some models have incorporated the blood flow implicitly in terms of available energy and oxygen [27,28]. More detailed multiscale models of cerebral blood flow have also been developed [11]. Some of these can use patient-specific computational fluid dynamics to determine regions at risk for thrombosis development [31] and could identify patient-specific drug responses [32].

Multiscale modeling for neuroprotective drug discovery

Targeted nanotherapy will provide the ability to target specific brain regions or specific cell types. Synthetic polymers have been developed for improved drug delivery. Stimuli-responsive polymers can respond in a given way in accordance with the change of cell shape, permeability or electrical properties, or in response to temperature, pH or electrical fields [33]. Given the acidification that occurs in ischemic stroke, such stimulus-response polymers have the potential to deliver therapeutic agents to particular parts of the penumbra where efficacy is predicted by detailed modeling of the pH changes expected under certain circumstances [34]. As noted above, many processes of cell death and tissue disruption associated with ischemia are highly nonlinear in both time and space. For this reason, we propose that drug delivery might best be targeted in space according to specific criteria. Although targeting drug delivery at particular delivery times may also be valuable, we note that the many processes of penumbra evolution will be distinct across the affected region so that different regions will be at different stages of evolution in the peri-infarct period. We propose this type of drug discovery as another form of medical *precision*. *Precision medicine* refers to the selection of particular groups of patients according to various grouping which often depend on the patients' genomes. *Precision drug targeting*, already used for tumors, refers to the precise targeting of particular sets of cells according to these cells' shared attributes over the course of disease progression.

Spreading depression causes cells in the penumbra to expend energy they can ill afford to waste, increasing their vulnerability to cell death. Preventing spreading depression is of interest not only to treatment of ischemic stroke, but also for migraine and epilepsy. This suggests that antimigraine drugs, which prevent spreading depression, could be tried in ischemic stroke. However, differences in the state of the tissue can substantially alter the efficacy of such a treatment so here again targeting therapy to particular states of the penumbra defined by location relative to the core or by the time after the stroke initiation could be valuable. For example, NMDA receptor antagonists are effective at limiting the waves of spreading depression in normal tissue. However, excessive extracellular K^+ is sufficient to cause spreading depression with little influence from synaptic transmission under pathological conditions [35]. Here again, precise targeting of an NMDA antagonist that depends on the details of the local tissue environment may be valuable. Computational modeling will be used to inform the relative contribution of the different causes of spreading depression, and to identify and modify the relevant parameters to provide an estimate of efficacy at particular times following the stroke, perhaps in combination with other therapeutic agents.

Many other proposed neuroprotective strategies could be assessed by modeling [36]. Examples include (1) Ca^{2+} channel antagonists [37]. Multiscale modeling could here evaluate the relative efficacy in inhibiting the different routes by which excessive Ca^{2+} can enter the cell, distinguishing pre- and postsynaptic processes. These would include presynaptic voltage-gated channels and NMDAR which would increase glutamate release, calcium-induced calcium release from organelles, stretch-activated calcium channels that might respond to the stretch associated with edema, and acid-sensing ion channel. Other factors that could be considered would be the effects of channel antagonists on blood pressure reduction. (2) Inhibiting the aquaporin-4 (AQP4) water channels [38]. Non-steroid anti-inflammatory drugs (NSAIDs) have a large number of effects which are not restricted to inflammatory agents but include effects on the aquaporin channels. This wide variety of NSAID effects have been the subject of modeling [39], which could now be extended to the special considerations encountered in ischemic brain tissue. For example, the effects on aquaporins could reduce cytotoxic edema and thereby reduce local extracellular concentrations of toxic molecules and decrease tortuosity so as to increase clearance of these molecules to sites beyond the penumbra. NSAIDs also inhibit some types of Ca^{2+} channels and could reduce in Ca^{2+} influx [39]. NSAIDs reduce prostaglandins which play a variety of roles mediated by at least 10 receptor subtypes. (3) Inhibiting leukocytes interaction with endothelial cells [40]. Inflammation is a response to injury which causes further injury, particularly in the skull-case which provides no room for expansion. General cell

density models for inflammation can distinguish between microglial and leukocyte inflammation to begin to calculate how inhibition of aggregation could affect infarct size in each case [22]. However, these models lack key features that are peculiar to the brain and to ischemic stroke, such as the effects of production and diffusion of ROS, which activate microglia and can be produced by them. The disruption of endothelial cells and of the blood brain barrier in ischemic stroke leads to particular patterns of accumulation of leukocytes such as polymorphonuclear cells. Other components of the neurovascular-unit will also contribute to immune responses following ischemic stroke.

Conclusion

Individually, several of the existing ischemic stroke models have the potential for *in silico* experiments and drug development focusing on a single aspect of stroke pathology, for example, thrombosis formation [31] or inflammation [22]. Future developments should seek to combine the multiple features together with sufficient biophysical detail to facilitate the search for multi-target drug cocktails.

Conflict of interest

The authors have no conflict of interest to declare.

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