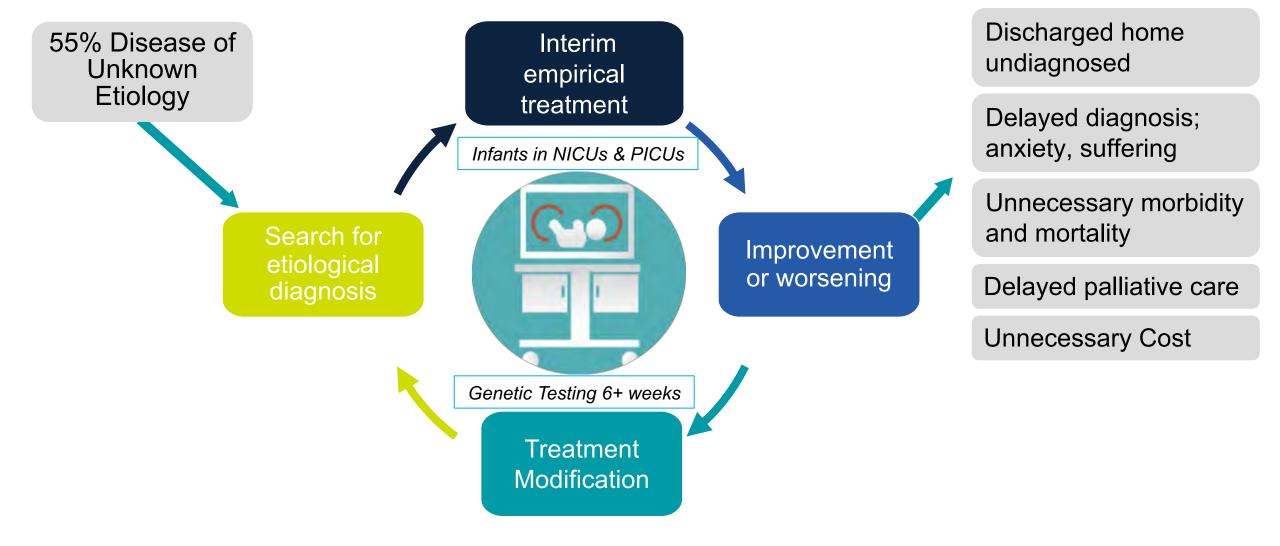


### Genome- & Al-Informed Individualized Care of infants in ICUs

Stephen Kingsmore, MD DSc

### I do not have a conflict of interest with regard to this presentation





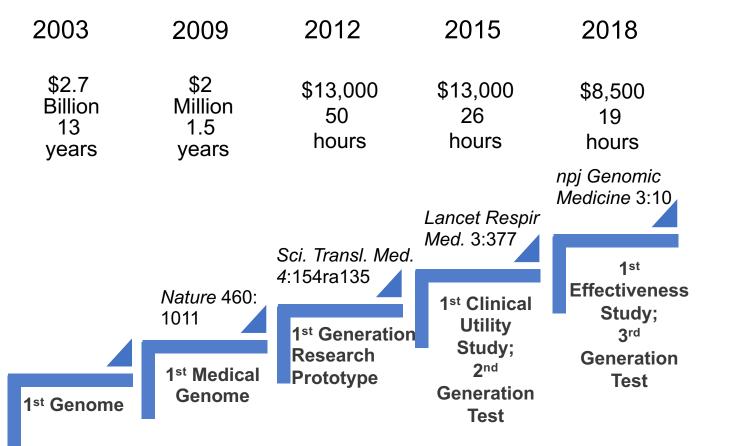
- 15% of 250,000 US NICU and PICU infants have 1 of 14,000 genetic diseases
- 60% go undiagnosed and . are mistreated; leading cause of death

NSIGHT2, ClinicalTrials.gov ID NCT03211039, 213 enrollees, 47% of NICU, 15% incidence

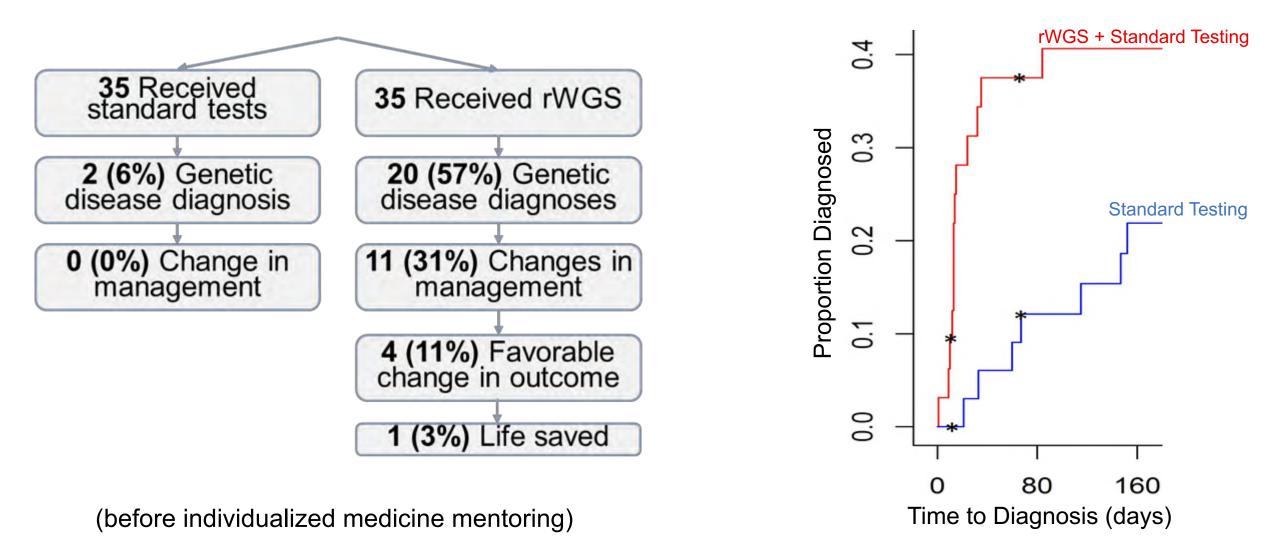


### **Evolution of Individualized Medicine in Children's ICUs**





# Two Early Studies of Clinical Utility of rWGS-based Individualized Medicine



Lancet Respir Med (2015) 3:377

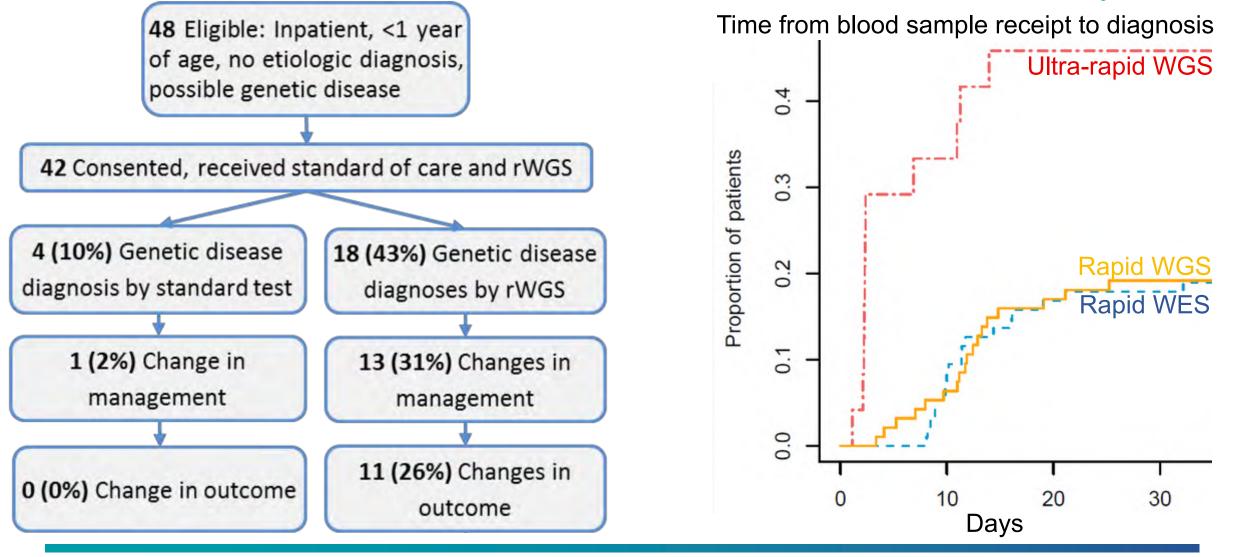
npj Genomic Med (2018 3:6)

Rady

Children's Institute

Genomic Medicine

# Two Recent Studies of Effectiveness of rWGS-based Individualized Medicine



NSIGHT2, ClinicalTrials.gov ID NCT03211039

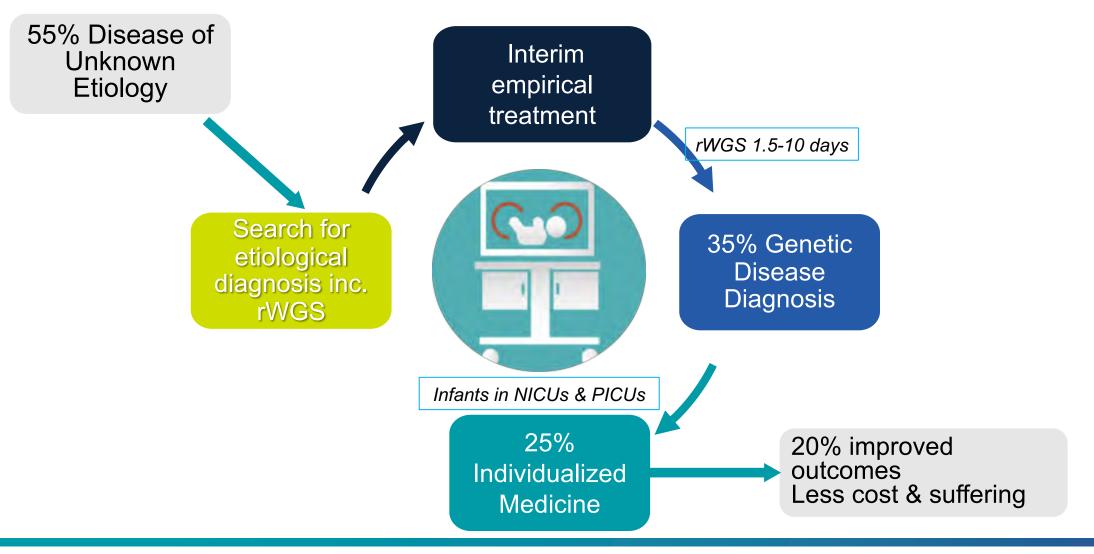
Rady

Children's Institute

Genomic Medici

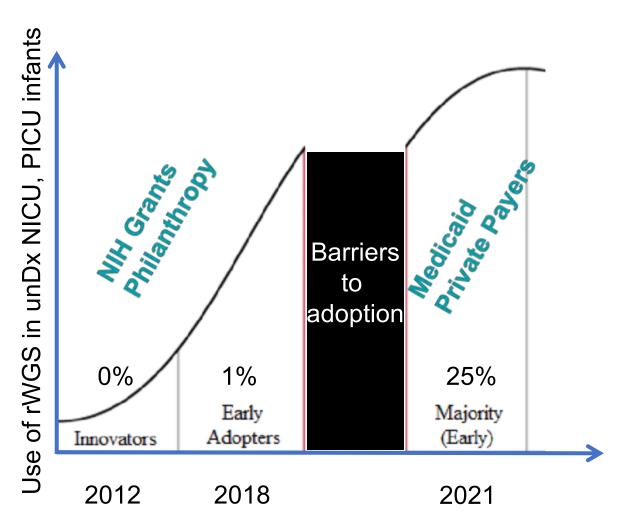
### 2019 status of rWGS-based individualized medicine for NICU and PICU Infants





# Barriers to Adoption of rWGS-based individualized medicine for NICU and PICU infants

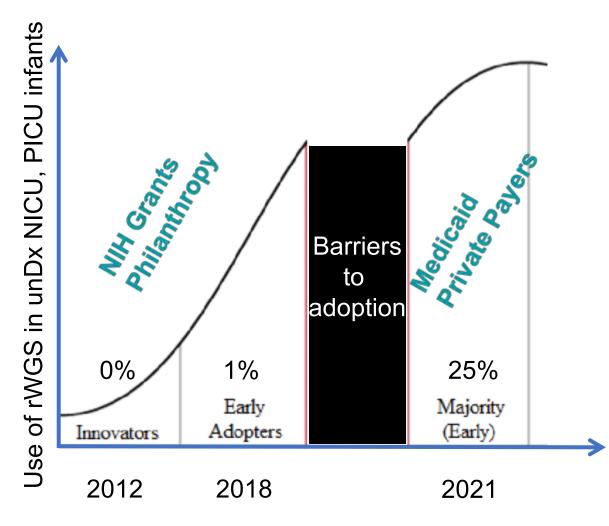




- Capital & labor intensity of individualized medicine
  - rWGS and rWES methods are too slow to guide NICU and PICU management
  - rWGS and rWES methods not scalable
  - Shortage of expert medical geneticists, laboratory directors, genetic counselors
- Lack of clinician familiarity with individualized medicine
  - Shortage of expert medical geneticists, genetic counselors
- Insufficient evidence of efficacy
  - Absence of reimbursement
- Many genetic diseases lack effective Rx
  - Most treatments lack adequate evidence

# Barriers to Adoption of rWGS-based individualized medicine for NICU and PICU infants





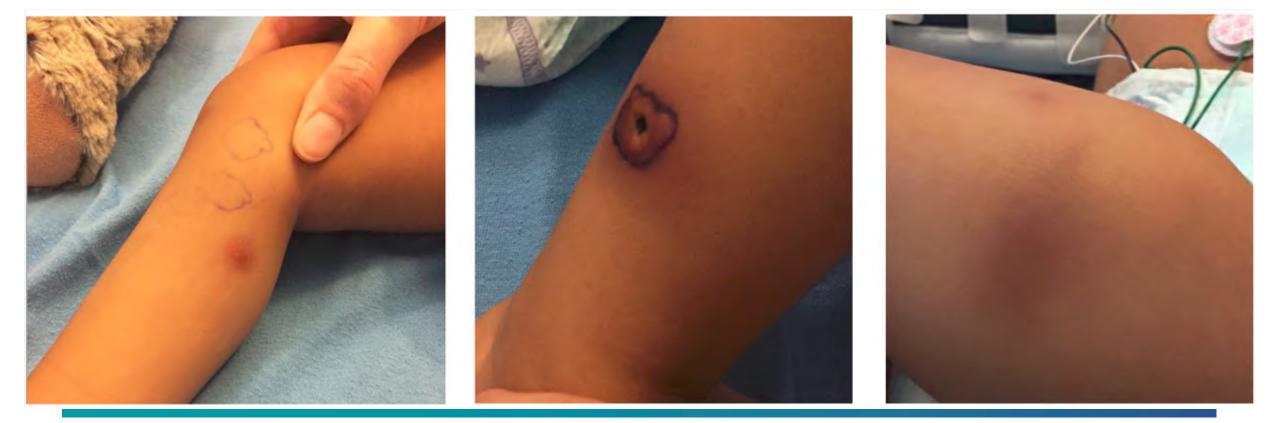
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  - Most treatments lack adequate evidence

#### 3<sup>rd</sup> generation whole genome sequencing with Rady automated genetic disease diagnosis Children's Institute Genomic Medicine DRAGEN v.2 Blood or NovaSeq DRAGEN QA, Nextera 6000 SI dried normalize sequence variant Flex Library calling & blood flow cell alignment concen-Literature Preparation Rapid Automated Order WGS Review & genotyping tration v.2 spot Individual Provisional rapid GS Diagnostic Diagnosis ized EHR CNLP, in EHR Report in Medicine EHR automated translation to HPO

Median time to result 20 hours; In Press

# 17 month old boy with fever ( $T_{max}$ 103°F) x 3 days, vomiting, diarrhea, abdominal pain, labored breathing, skin lesions x 1 day





### Rady Emergency Department Work Up



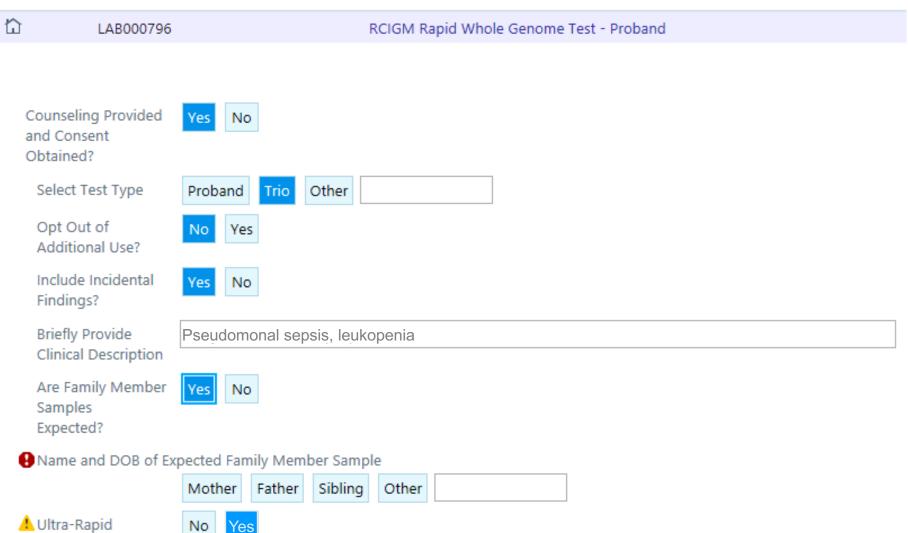
- Blood tests:
  - Metabolic panel: metabolic acidosis
  - C-reactive protein: markedly elevated
  - Complete blood count: low white cell count
- Abdominal ultrasound & computed tomography: No intussusception, possible mild colitis
- Lumbar puncture
  - Cardiovascular decompensation = hypovolemic shock  $\rightarrow$  intravenous fluids
  - SiO<sub>2</sub> 88% on FiO<sub>2</sub> 21%  $\rightarrow$  Continuous Positive Airway Pressure ventilation
  - Sepsis suspected  $\rightarrow$  intravenous vancomycin + ceftriaxone
  - Admitted to PICU  $\rightarrow$  switched to intravenous meropenem

### **Hospital Day 2**



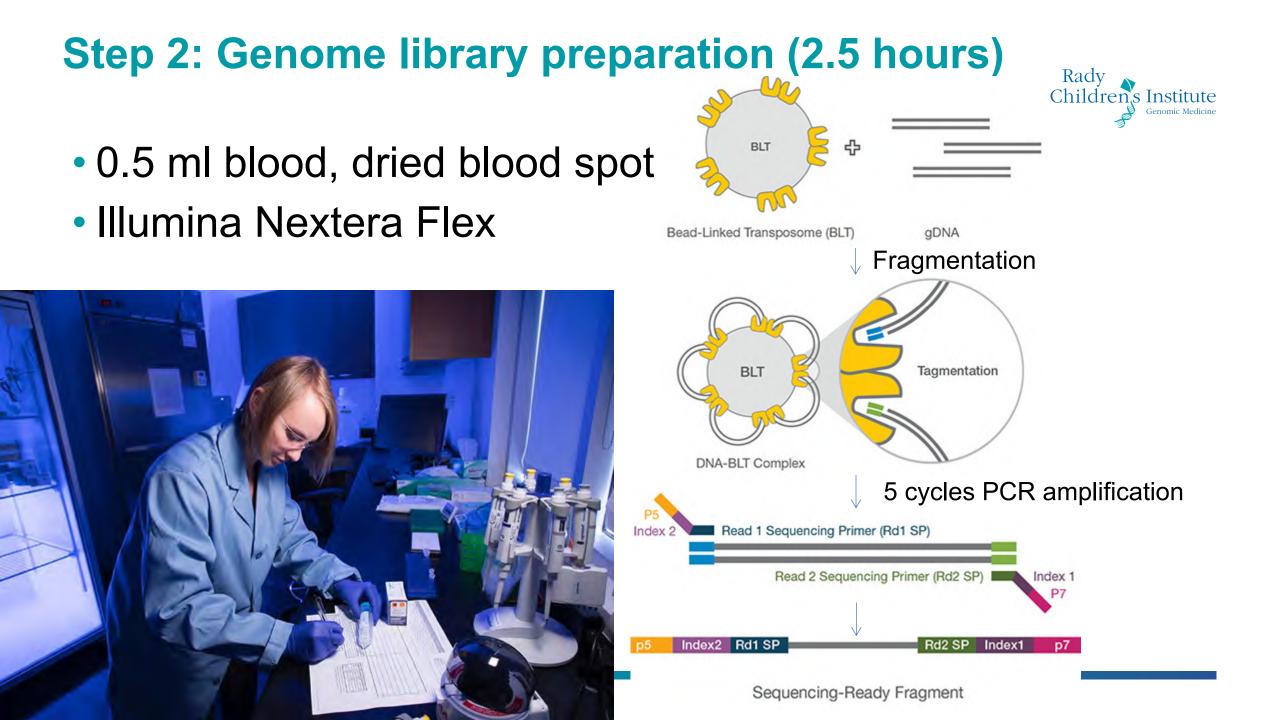
- Blood culture: Pseudomonas aeruginosa
- Skin rash diagnosed as echthyma gangrenosum
- Rapid genome sequencing ordered

### **Step 1: Order in Epic Electronic Health Record**



Processing?





### **Step 3: Genome Sequencing (15.5 hours)**



- 2 x 100 nucleotide paired sequences
- Illumina NovaSeq 6000 instrument
- S1 flowcell
- Trio or 2 Probands per flowcell
- 40X proband; 30X parents

RADY CHILDREN'S **INSTITUTE SETS** DNA SEQUENCE WORLD RECORD

Step toward faster diagnoses of puzzling, threatening illness

#### BY PAUL SISSON

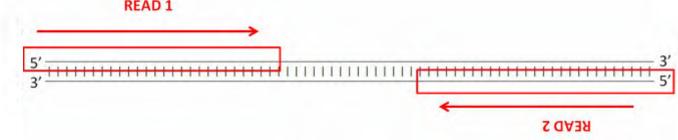
It took 13 years to build the first full set of genetic blueprints for the human race by sequencing the DNA inside our cells that governs everything from eye color to risk of debilitating disease.

But a team at Rady Children's Institute for Genomic Medicine, working closely with homegrown sequencing sensation Illumina Inc., just proved it's possible to get the job done



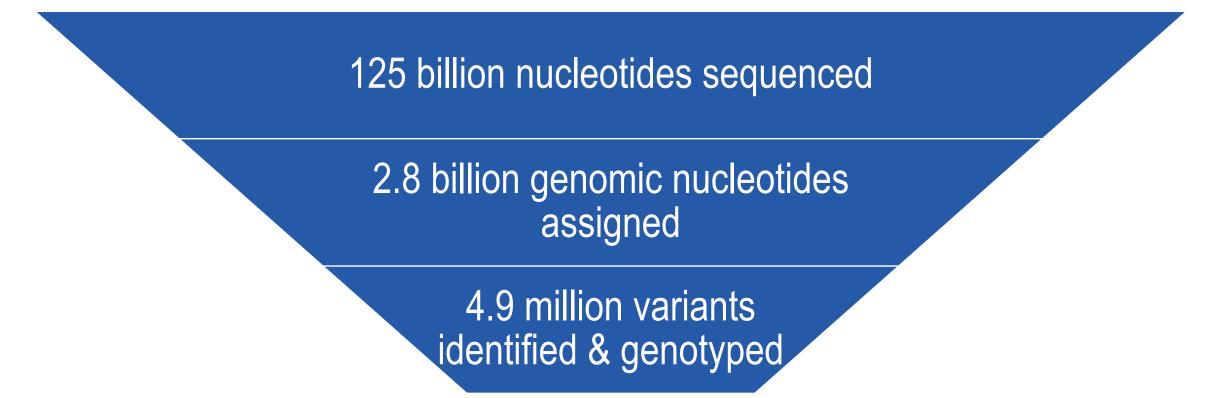


Clinical laboratory scientist Sarah White pulls a flow cell from a new genetic sequencer at Rady Children's Institute for Genomic Medicine.



## Step 4: Identify all disease-causing variants in child's genome: 45 min





Glossary: Nucleotide – a single DNA letter (base); Adenine, Cytosine, Guanine or Thymidine

Variant – a DNA change from the (normal) reference genome sequence

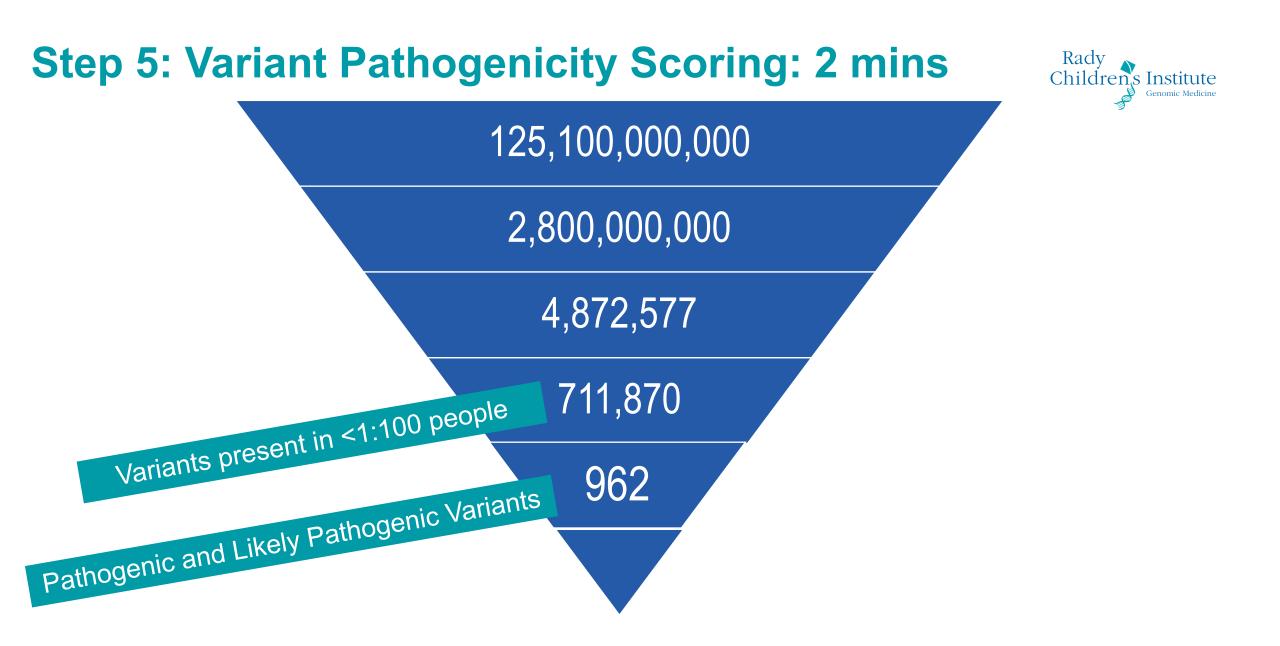
Illumina DRAGEN 2.0

### **Step 5: Variant pathogenicity scoring**



Variant Category	Criteria	Very	Null variant (nonsense, frameshift, $\pm 1$ or 2 splice site position, initiation codon,				
Pathogenic (P): 99% disease causing	1 VS + (1S or 2M/Sup) 2S 1S + (3M or 2M+2Supp)	Strong (VS) Strong (S) Moderate (M)	<ul> <li>exon deletion) in gene where LOF known to cause disease</li> <li>Same amino acid change as previously established pathogenic variant</li> <li>De novo in a patient with the disease and no family history</li> <li>Functional studies show damaging effect on the gene</li> <li>Prevalence in affected individuals significantly greater than controls</li> <li>Located in mutational hot spot/functional domain without benign variation</li> <li>Extremely low frequency in Gnomad</li> </ul>				
Likely Pathogenic (LP): 90% disease causing	1 VS/S + 1 M 1 S + (1 M or 2 Supp) 3 M 2 M + 2 Supp 1 M + 4 Supp		<ul> <li>Recessive disorders, detected in trans with a pathogenic variant</li> <li>Protein length changed by in-frame indel in nonrepeat region or stop-loss</li> <li>Novel missense at amino acid where different missense known to be pathogenic</li> <li>Assumed de novo, but without confirmation of paternity and maternity</li> </ul>				
		Supporting (Supp)	Cosegregation with disease in multiple affected family members in gene known to cause disease				
Variant of Uncertain Significance (VUS): 10% disease causing			<ul> <li>Missense variant in gene with low rate of benign missense variants and where missense variants commonly cause disease</li> <li>Multiple computational tools call deleterious</li> <li>Phenotype highly specific for disease with single genetic etiology</li> <li>Reputable source reports as pathogenic, but unpublished</li> </ul>				

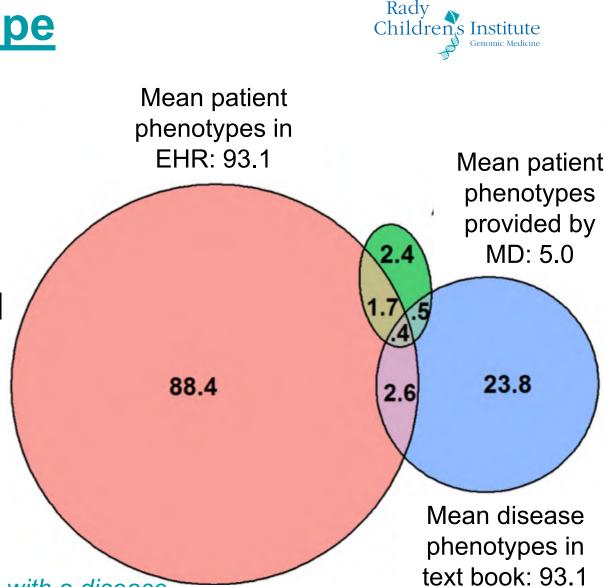
Richards S, et al. Standards and guidelines for the interpretation of sequence variants: a joint consensus recommendation of ACMG and AMP. Genet Med. 2015 Mar 5.



Diploid MOON software with InterVar post-processing

### Why collect a deep phenotype

- The clinical features of NICU infants do NOT correspond well with classical descriptions of their disease
- The ability to make a diagnosis is critically dependent on a full clinical description



Glossary: Phenotype – the clinical features of a patient with a disease

76 children with genetic diseases; natural language processing of EHR; Text book: Mendelian Inheritance in Man

### **Step 6: Deep Phenotyping by Natural Language Processing of Epic EMR: 20 sec**



Light UI

Fuliscreen

Dark UI

#### CLIXENRICH Welcome back mclark3@rchsd.org (rchsd Administrator)

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-	nervous system (100%)							
Home	HP0001041 Facial erythema (100%)							
Address of the local division of the	HP0001250 Seizuras (100%)							
Import Records	HP0001298 Encephalopathy (100%)							
and the second se	HP0001336 Myoclonus (100%)							
Manage Filters	HP0001438 Abnormality of							
Manageriners	abdomen morphology (100%)							
3710	HP0001941 Acidosis (100%)							
Run Jobs	HP0001942 Metabolic acidosis							
	(100%)							
View Results	HP0002011 Morphological							
1001100	abnormality of the central nervous							
Interactive Testpad	system (100%)							
intelactive resipau	HP0002060 Abnormality of the							
and the second sec	cerebrum (100%)							
View Status	HP0002329 Drowsiness (100°-)							
	HP0002353 EEG abnormality (100%)							
Manage API Keys	HP0002373 Febrile seizures (L00%)							
	HP0002521 Hypsarrhythmia (100%)							
Logout	HP0002527 Falls (100%)							
cogene	HP0002790 Neonatal breathing							
	dysregulation (100%)							
	HP0002928 Decreased activity of the							
	pyruvate dehydrogenase complex							

(100.4) HP0003128 Lactic acidosis (100%) HP0004305 Involuntary movements

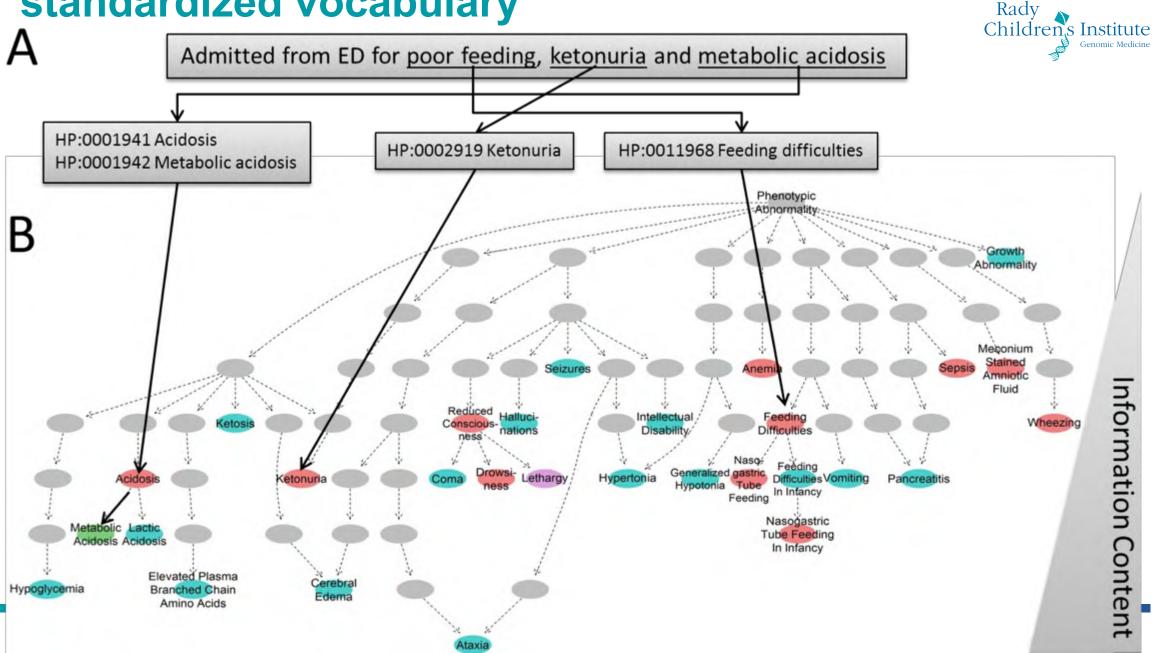
10 mg 11D depending on kidney functionstep 3: Keload levetiracetam 20 mg/kg and then maintenance of 45 mg/kg divided BLD or 15 mg TID depending on kidney functionStep 6 Reload Dilantin 20 mg/kg and start IV maintenance 5 mg/kg/day divided BID for a goal level of 10Step 7: Initiate a midazolam dripStep 8: Consider topiramate or lacosamide2) Metabolic testing:Urine organic acidsSerum amino acidsPlasma acylcarnitine profileAmmonia, lactateFrom a metabolic standpoint, there are a number of timedependent, treatable conditions that need to be addressed including:1) Vitamin dependent epilepsies including Pyridoxinedependent services. Pyridoxal 5 phosphate dependent selzures and biotinidase deficiency.--Children with these conditions and others need specific vitamin supplementation a soon as possible to prevent permanent brain injury (for example, pyridoxine, PSP, biotin)2) Transporter disorders including GLUT1 deficiency and cerebral folate deficiency -- Children with GLUT1 need the ketogenic diet started as soon as possible to prevent long-term disability. Folate supplementation may help children with cerebral folate deficiency, CSF glucose and folate levels should be sent in children with senatory epilepsy and no identified cause of Amino and organic acidopathies, most notably maple syrup urine disease -Dietary avoidance may be required in some conditions. Metabolic testing including newborn screening, urine organic acids, plasma amino acids, serum acylcarnitine profile are needed in all children with seizures and no identified cause,4) Mitochondrial disorders, most notably Leigh's disease and pyruvate dehydrogenase deficiency. All children with seizures and no identified cause should have serum and CSF lactate and pyruvate testing. Treatment may include vitamins and supplements such as co-enzyme Q10.5) Urea cycle defects. All children with setzures and no identified cause should have serum ammonia testing. Dietary avoidance may be needed.6) Neurotransmitter disorders. All children with refractory seizures and no identified cause should have CSF neurotransmitters sent, including CSF biopterin.3) Genetic genetic panel, genetics instituteFrom a genetic standpoint, there is a growing list of neonatal onset epilepsie testing: CGH that have been identified, some with specific treatments. Recent series have found diagnosable genetic epilepsies in 12% (EuroEPINOMICS-RES Consortium, Am J Hum Gen, 2014), 18% (Trump et al, J Med Genet 2016), 23% (Moller et al, Mol Syndromol, 2016), 28% (Mercimek-Mahmutoglu et al, Epilepsia 2015), to 33% (Heibig et al., Genet Med, 2016) in patients with no clear provoking cause of seizures. Many of those source report their highest yield in neonatal seizures, in the Trump study, the overall hit rate was 18% but the neonatal hit rate was 39%, while the Hieberg study had a hit rate of 43% in children with spileptic encephalopathy. Most common were the SCN family of mutations, STXBP1 and the KCNO family of genetic epileosies. Most importantly, identification of these genetic enlighters can have profound implications for immediate and long-term clinical care. For example, one review (Poduri et al, Nat Rev Neurol, 2014) included the table below showing how specific mutations influence care: From our experience and discussion with other providers (especially utilizing data from Dr. Podun), we recognize AT LEAST the following mutations that may influence care:Gene TreatmentALDH7A1 PyridoxineGRIN2A Memantine (potentially)KCNQ2 Ezogabine (potentially)KCNT1 Quinidine (potentially)PLCB1 InositolPNPO Pyridoxal-5-phosphatePRRT2 CarbamazepineSCN1A Avoid phenytoin and lamotrigineSCN2A

 $(\mathbf{\hat{n}})$ 

Clinithin! Exchange

#### CliniThink CLiXENRICH natural language processing software

# Step 7: Translate phenotypes to a hierarchical standardized vocabulary



# Step 8: Pattern Recognition creates a comprehensive differential diagnosis

Datiant's Features Diagnostic

Patient's Features.	
HPO.	Feature. 🔺
🗆 category.: Abnormal	ity of blood and blood-forming tissues (1 Item)
HP:0001882	Leukopenia
🗉 category.: Abnormal	ity of metabolism/homeostasis (3 Items)
HP:0011227	Elevated C-reactive protein level
HP:0001945	Fever
HP:0001942	Metabolic acidosis
🗆 category.: Abnormal	ity of the abdomen (2 Items)
HP:0002014	Diarrhea
HP:0002013	Vomiting
🖃 category.: Abnormal	ity of the cardiovascular system (1 Item)
HP:0011106	Hypovolemia
🗉 category.: Abnormal	ity of the immune system (4 Items)
HP:0001882	Leukopenia
HP:0100806	Sepsis
HP:0100806	Sepsis
HP:0000988	Skin rash
🗆 category.: Abnormal	ity of the integument (1 Item)
HP:0000988	Skin rash
🖃 category.: Abnormal	ity of the respiratory system (1 Item)
HP:0012418	Hypoxemia

чQ	onunin: reshik	(Unsymmetric	). 10 Features.		
m	p-value. 🔺	Disease Id.	Disease name.	Genes.	
1	0.0010	OMIM:26	#260920 HYPER-IGD SYNDROME; HIDS;;HYPERIMMUNOGLOBULINEMIA D AND PERIODIC FEVER SY	MVK (4598)	
1	0.0010	ORPHAN	LEGIONELLOSIS		
1	0.0010	OMIM:61	DENGUE FEVER		
1	0.0010	ORPHAN	LASSA FEVER		
/	0.0010	ORPHAN	EBOLA HEMORRHAGIC FEVER		
1	0.0010	ORPHAN	MARBURG HEMORRHAGIC FEVER		
/	0.0010	ORPHAN	CRIMEAN-CONGO HEMORRHAGIC FEVER		
1	0.0010	OMIM:60	STEVENS-JOHNSON SYNDROME	IKZF1 (10320	
1	0.0010	OMIM:26	RETICULAR DYSGENESIA	AK2 (204)	
1	0.0010	ORPHAN	LUJO HEMORRHAGIC FEVER		
	0.0010	OMIM:61	#611762 FAMILIAL COLD AUTOINFLAMMATORY SYNDROME 2; FCAS2	NLRP12 (916	
1	0.0010	ORPHAN	SPONTANEOUS PERIODIC HYPOTHERMIA		
1	0.0010	OMIM:13	GASTRITIS, FAMILIAL GIANT HYPERTROPHIC		
1	0.0010	OMIM:16	CYCLIC HEMATOPOIESIS	ELANE (1991)	
1	0.0010	OMIM:60	ENTEROPATHY, FAMILIAL, WITH VILLOUS EDEMA AND IMMUNOGLOBULIN G2 DEFICIENCY		
1	0.0010	OMIM:14	HYPERTHERMIA, CUTANEOUS, WITH HEADACHES AND NAUSEA		
1	0.0018	ORPHAN	SCRUB TYPHUS		
1	0.0018	OMIM:60	600643 CAROLI DISEASE, ISOLATED		
	0.0023	OMIM:25	#251000 METHYLMALONIC ACIDURIA DUE TO METHYLMALONYL-COA MUTASE DEFICIENCY;;METHY	MUT (4594)	
	0.0023	OMIM:24	#243500 ISOVALERIC ACIDEMIA, IVA, ISOVALERIC ACID COA DEHYDROGENASE DEFICIENCY, IVD D	IVD (3712)	
1	0.0023	OMIM:61	#615592 IMMUNODEFICIENCY 15; IMD15	IKBKB (3551)	
1	0.0026	ORPHAN	TYPHOID		
1	0.0026	ORPHAN	RABIES		
1	0.0026	OMIM:61	#614102 IMMUNOGLOBULIN KAPPA LIGHT CHAIN DEFICIENCY; IGKCD,; KAPPA CHAIN DEFICIENCY	IGKC (3514),	
1	0.0026	OMIM:26	260570 PELGER-HUET-LIKE ANOMALY AND EPISODIC FEVER WITH ABDOMINAL PAIN		
1	0.0030	ORPHAN	LYELL SYNDROME	-	
-	0.0000	OLANARA	ACCORDANCE INCOMPANY CONTRACTOR CONTRACTOR	0040 (000)	

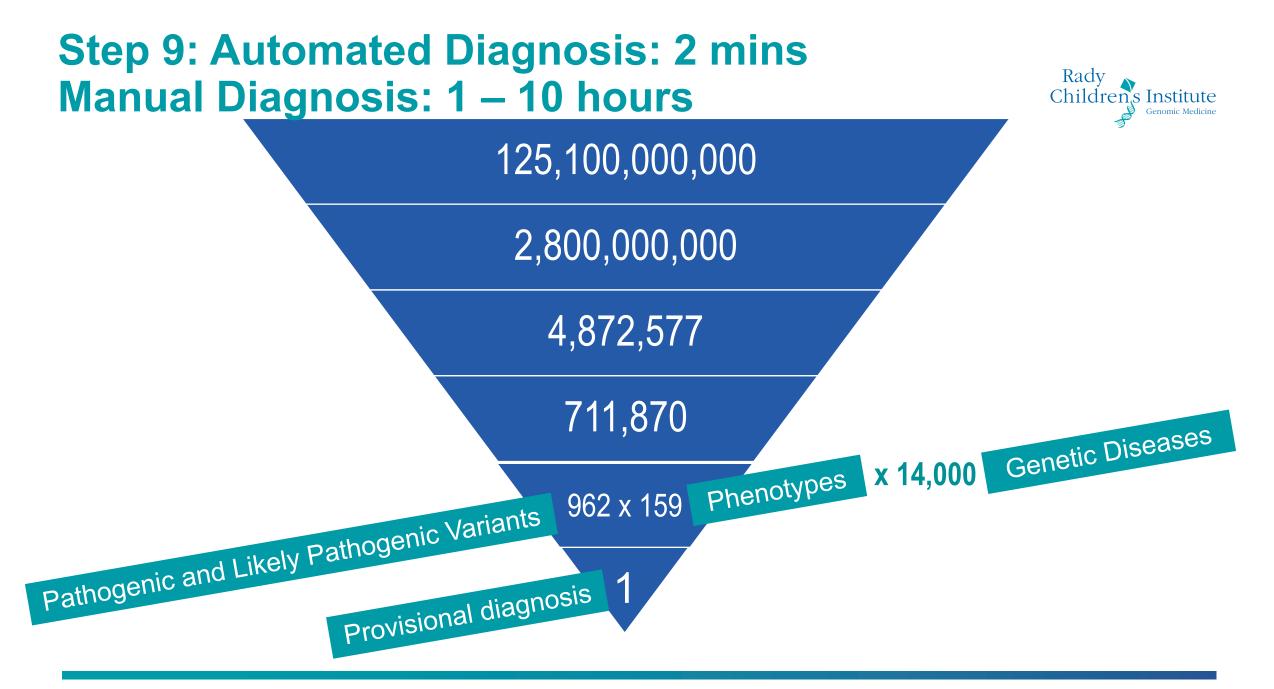
#614699 IMMUNODEFICIENCY, COMMON VARIABLE, 7: CVID7

Rady

Children's Institute

CD19 (930)

Genomic Medicine



Diploid MOON software with InterVar post-processing

Step 9: A Manual D	Rady hildrens Institute Genomic Medicine			
The patient's p	henotype mi	ight be caused by:		
BTK-	G	splice donor	Agammaglobulinemia, x-linked	2 2 0
X:100,613,603 -	ref: A	c.974+2T>C	XR	

- X-linked recessive
- Inherited from mother
- Loss of splice donor site of intron 11
- Classified as pathogenic
- Confirmed by functional studies

<135 ¥	Ref Range & Units 413-1,112 mg/dL
16 🗸	30 - 146 mg/dL
<5 ¥	21 - 117 mg/dL
2wk ago	Ref Range & Units
2962 ¥	4000 - 10500 cells/uL
<20 🖌	830 - 1880 cells/uL
1 ¥	20 - 38 %
	16 ¥ <5 ¥ 2wk ago 2962 ¥

### **Hospital Course**



- Diagnosis after 22 hours
- Individualized medicine
  - Double coverage, double duration antibiotics
  - Intravenous immunoglobulin to maintain IgG level >600mg/dL
  - Magnetic resonance imaging: no additional septic emboli
- Prognosis
  - Normal life
  - 10% have significant infections despite treatment
- Genetic counseling
  - Mother is a carrier
  - Maternal relatives at-risk
- Discharged home on day 13

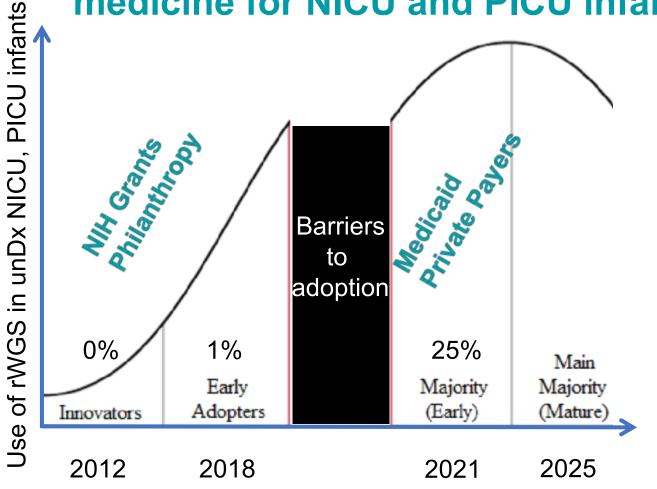
### Diagnostic performance of 3<sup>rd</sup> generation rWGS-based individualized medicine



- Retrospective, n=84 children with 86 diagnoses
  - Expert manual interpretation: Precision 98%, Recall 98%
  - Automated interpretation: Precision 99%, Recall 95%

	Retrospective Patients				Prospective Patients													
Subject ID	26	53	6124	3003	6194		290		352		362		374		7052		412	
Age	8 da	ays	14 years	1 year	5 da	5 days		3 days		7 weeks		4 weeks		2 days		17 months		lays
Abbreviated	Neon	natal	Rhabdo-	Dystonia,	Hypoglycemia Pulmonary		onary	Diab	oetic	Neonatal		HIE, anemia		Pseudomonal		Neonatal		
Presentation	seizu	ures	myolysis	Dev. delay	seizures hemorrhage ke		ketoad	cidosis	sis seizures		nic, allellia		septic shock		seizures			
Method	Auto.	Auto.	Auto.	Auto.	Auto.	Std.	Auto.	Std.	Auto.	Std.	Auto.	Std.	Auto.	Std.	Auto.	Std.	Auto.	Std.
Total (hours)	20:25	19:56	19:20	19:14	20:42*	56:03	19:29	48:46	19:11	42:04	19:10	57:21	31:02+	34:38	22:04	38:37	20:53	48:23
Molecular	Early Infantile Epileptic		Glycogen	Dopa-	None		None		Perma	anent	None		None		X-lin	iked	Benign	familial
			Storage	Responsive					neor	natal					agamma-		neonatal	
Diagnosis	Encephalo-		Disease V	Dystonia						etes							globulinemia	
Gene and			PYGM	ТН													KO	
Causative		KCNQ2	c.2262delA	c.785C>G	<b>n.</b> /	n.a.		.a.	INS c.2	INS c.26C>G		n.a.		a.	BT		KCNQ2	
Variant(s)	c.727	/C>G	c.1726C>T	c.541C>T											c.974+2T>C		c.1051C>G	

### Summary: Strategies are being implemented to address barriers to rWGS-based individualized medicine for NICU and PICU infants

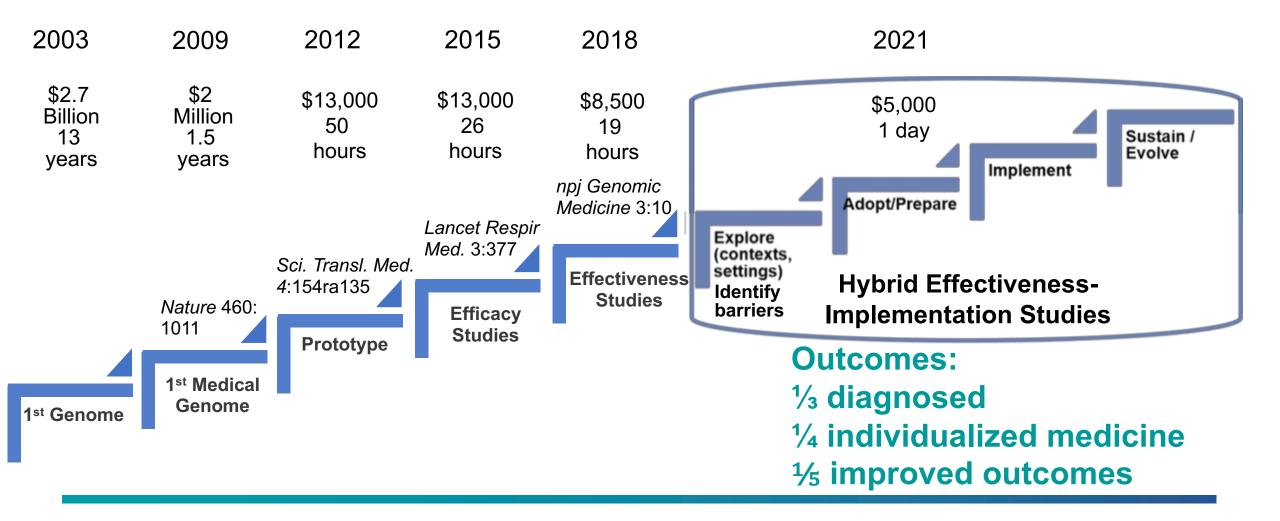




- Automated 20-hour diagnosis by rWGS
- Lack of clinician familiarity with individualized medicine
  - APIs for FAQs, counseling
  - Case-based learning via podcast/webinar
- Insufficient evidence of efficacy
  - Cost effectiveness studies
  - Payor collaborations
- Many genetic diseases lack effective treatments
  - APIs for reference individualized management guidance

# Summary: By 2021 we predict the early majority of children's ICUs to implement individualized medicine





### **Acknowledgments**

#### **Executive Team**

Stephen Kingsmore MD, DSc Wendy Benson Charlotte Hobbs, MD, PhD David Dimmock MD Matt Niedzwiecki

#### Leadership

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#### **Collaboration with:**

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NHGRI

NCATS

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