

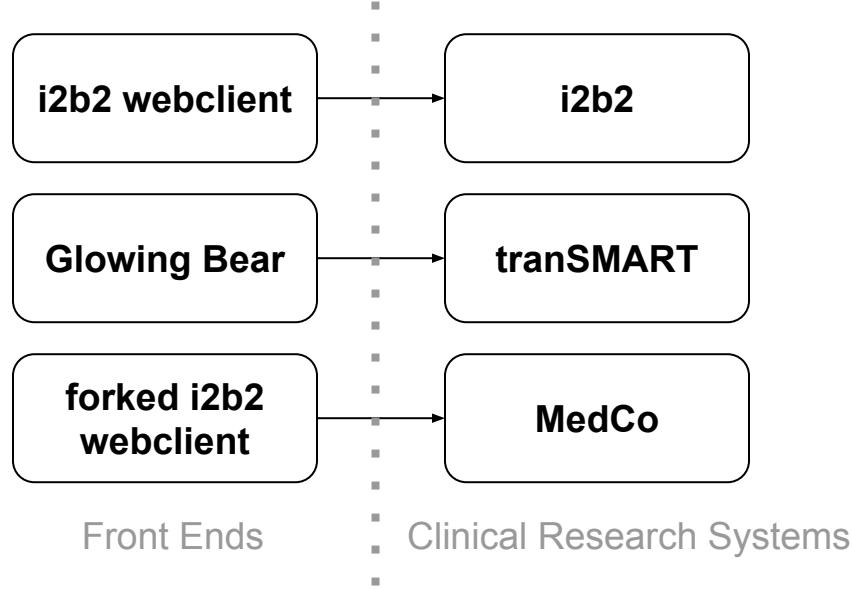
Building a common and privacy-preserving front end for open-source clinical research platforms

Presentation @ European i2b2 transSMART AUG, Geneva, 01/11/2018

**Mickaël Misbach*#, Ward Weistra#, Dr. Bo Gao#, Dr. Jean-Louis Raisaro*,
Dr. Juan Troncoso-Pastoriza*, Prof. Jean-Pierre Hubaux***

*EPFL, #The Hyve

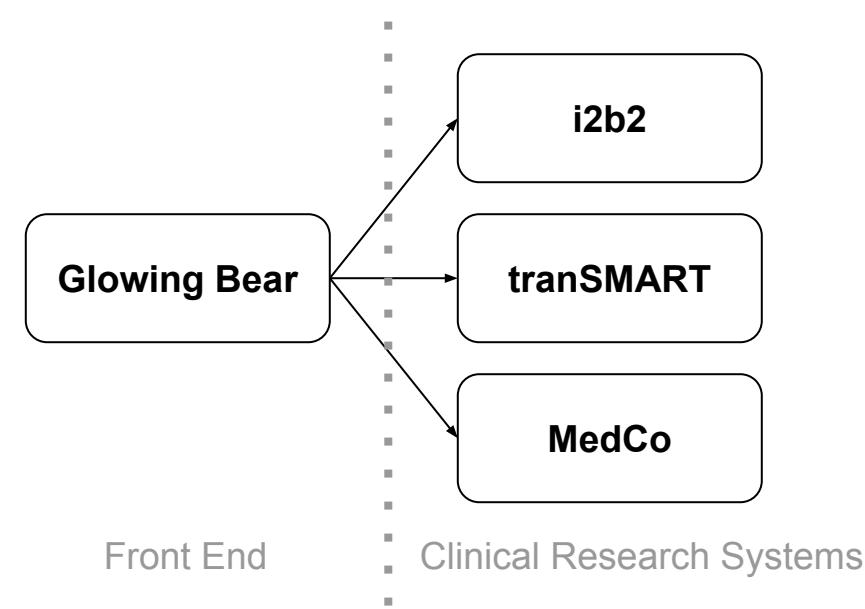
Motivation



Limitations:

- data fragmented in...
 1. location
 2. technical solution
- sensitive data not easily shared

Objectives



Goals: Extend Glowing Bear capabilities

- integrate additional clinical research platform: i2b2
- enable privacy-preserving cohort exploration: MedCo

Why: Enable scientists to access more data from a common interface by...

- expanding compatibility of data source backends
- accessing sensitive data that would otherwise be difficult to share

How: Add a layer of interoperability on top of Glowing Bear to support i2b2 and MedCo

Building Blocks

Common User Interface: Glowing Bear



The screenshot shows the Glowing Bear user interface. At the top, there's a navigation bar with tabs for "Data Selection" and "Analysis". The "Data Selection" tab is active. On the far right of the header, it says "0.0.1-SNAPSHOT" with a help icon and a back arrow. Below the header, there's a search bar labeled "Specify query name" and a "Save query" button. The main area is divided into sections:

- Current Data Selection:** Buttons for "... subjects" and "... observations" with a "Clear all" button.
- Ontology:** A sidebar with a "filter" and "clear" button, and a tree view of ontology categories:
 - Vital Signs
 - Heart Rate (4)
 - Public Studies
 - CATEGORICAL_VALUES (3)
 - CLINICAL_TRIAL (3)
 - Demography
 - Vital Signs
 - Heart Rate (3)
 - CLINICAL_TRIAL_HIGHDIM (3)
 - EHR (3)
 - EHR_HIGHDIM (3)
 - MIX_HD (3)
 - Oracle_1000_Patient (1,200)
 - RNASEQ_TRANSCRIPT (3)
 - SHARED_CONCEPTS_STUDY
 - SHARED_CONCEPTS_STUDY
 - SHARED_HD_CONCEPTS_STU
 - SHARED_HD_CONCEPTS_STU
 - TUMOR_NORMAL_SAMPLES
 - Projects
 - Private Studies
- Step 1: Define subjects**: Shows "8 / 1,246 subjects (1%) , 26 / 120,188 observations (0%)". An "Update" button is next to it.
- Inclusion criteria:** 8 subjects included. This section contains two complex search criteria:
 - Concept:** Gender (\Projects\Survey 1\Demographics) with values Female (5).
with more options
 - Study:** SURVEY1

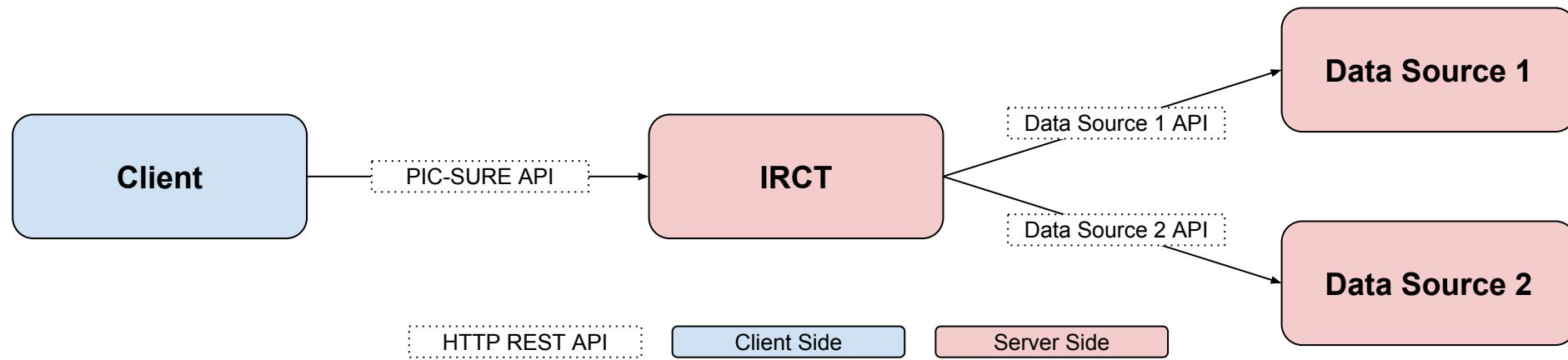
An "Import Criteria" button is located above the second criterion.

or

 - Concept:** Heart Rate (\Public Studies\CLINICAL_TRIAL\Vital Signs) with value between 20 and max.
with more options

Common Query Language: PIC-SURE API[1]

- PIC-SURE provides a common API to query any kind of *data sources*
- At the technical level, data semantic is not covered



PIC-SURE: Patient-centered Information Commons: Standardized Unification of Research Elements

IRCT: Inter-Resource Communication Tool

HMS-DBMI: Harvard Medical School - Department of Biomedical Informatics

[1]: Alex AT Bui, John Darrell Van Horn, NIH BD2K Centers Consortium, et al. “Envisioning the future of big data biomedicine”. In: Journal of biomedical informatics 69 (2017), pp. 115–117.

i2b2[1] & tranSMART[2]

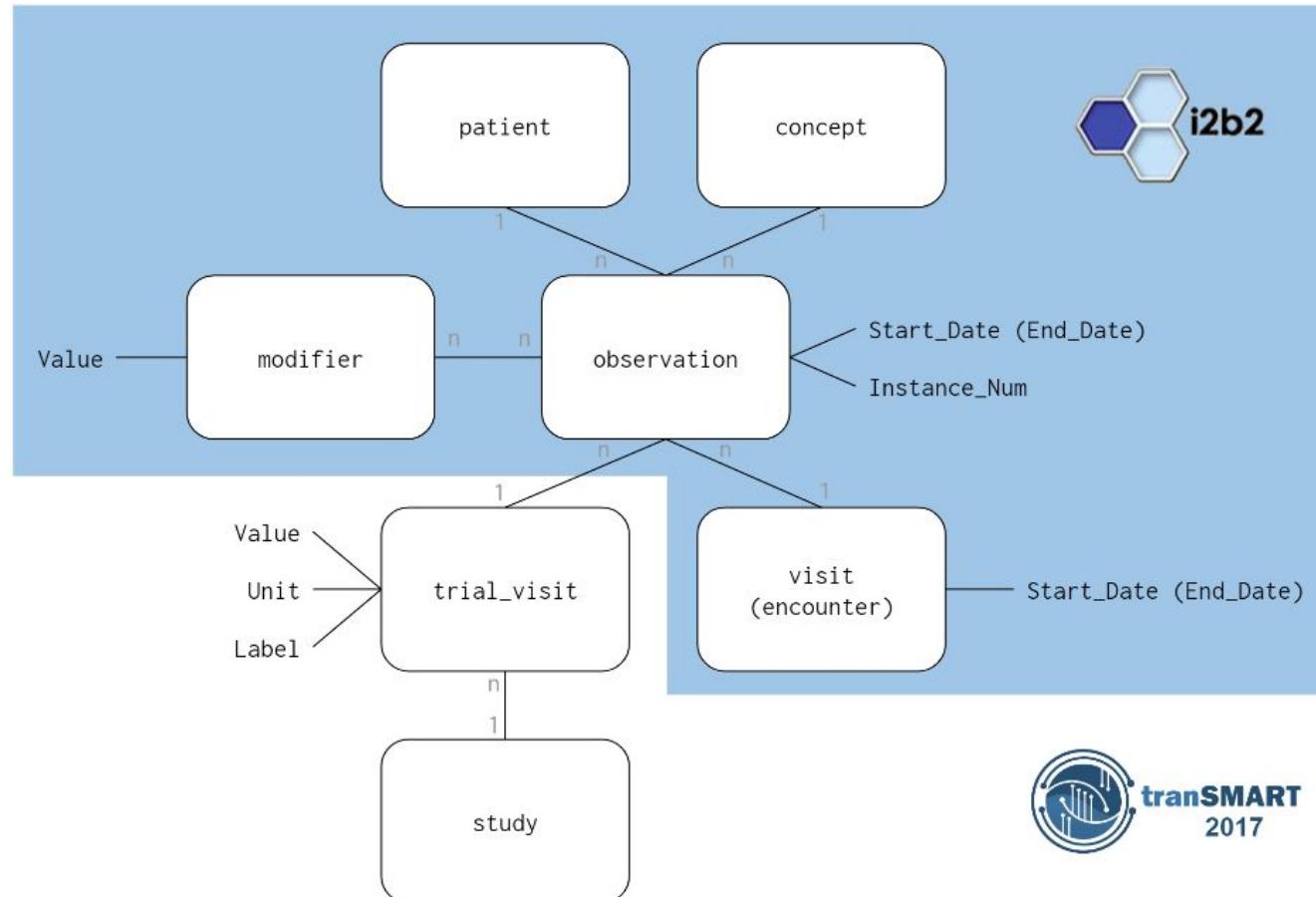


i2b2

- cohort exploration
- database: star schema
- preference from hospitals

tranSMART

- i2b2 features and...
- advanced cohort exploration features
- advanced data export
- preference from pharma
- study-based



[1]: Shawn N Murphy et al. "Serving the enterprise and beyond with informatics for integrating biology and the bedside (i2b2)". In: Journal of the American Medical Informatics Association 17.2 (2010), pp. 124–130.

[2]: Elisabeth Scheufele et al. "tranSMART: an open source knowledge management and high content data analytics platform". In: AMIA Summits on Translational Science Proceedings 2014 (2014), p. 96.

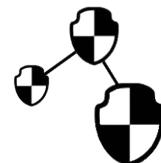
MedCo[1]



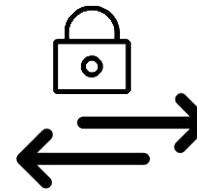
Distributed cohort exploration



Secure storage outsourcing



Trust decentralization



End-to-end data protection



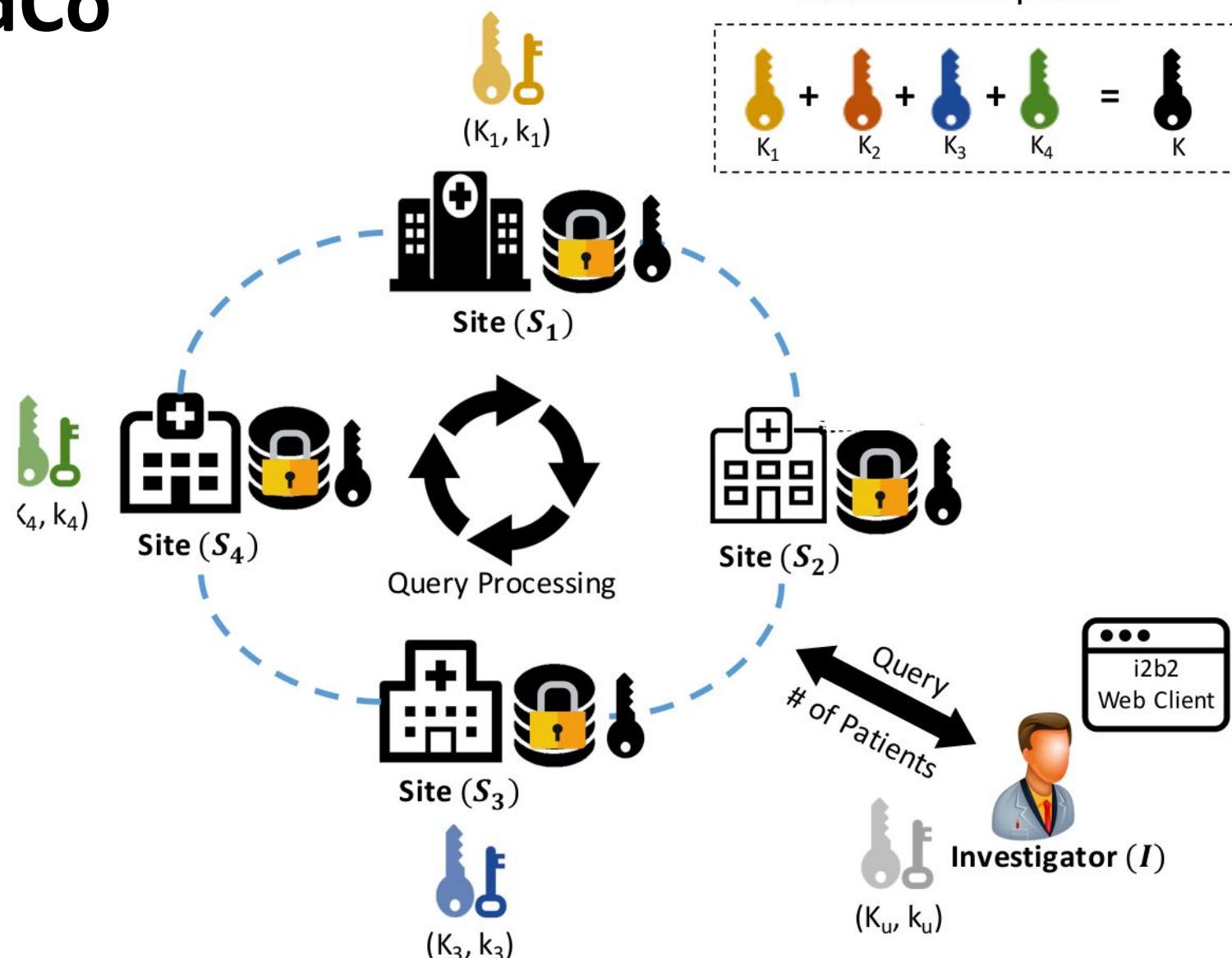
Unlinkability

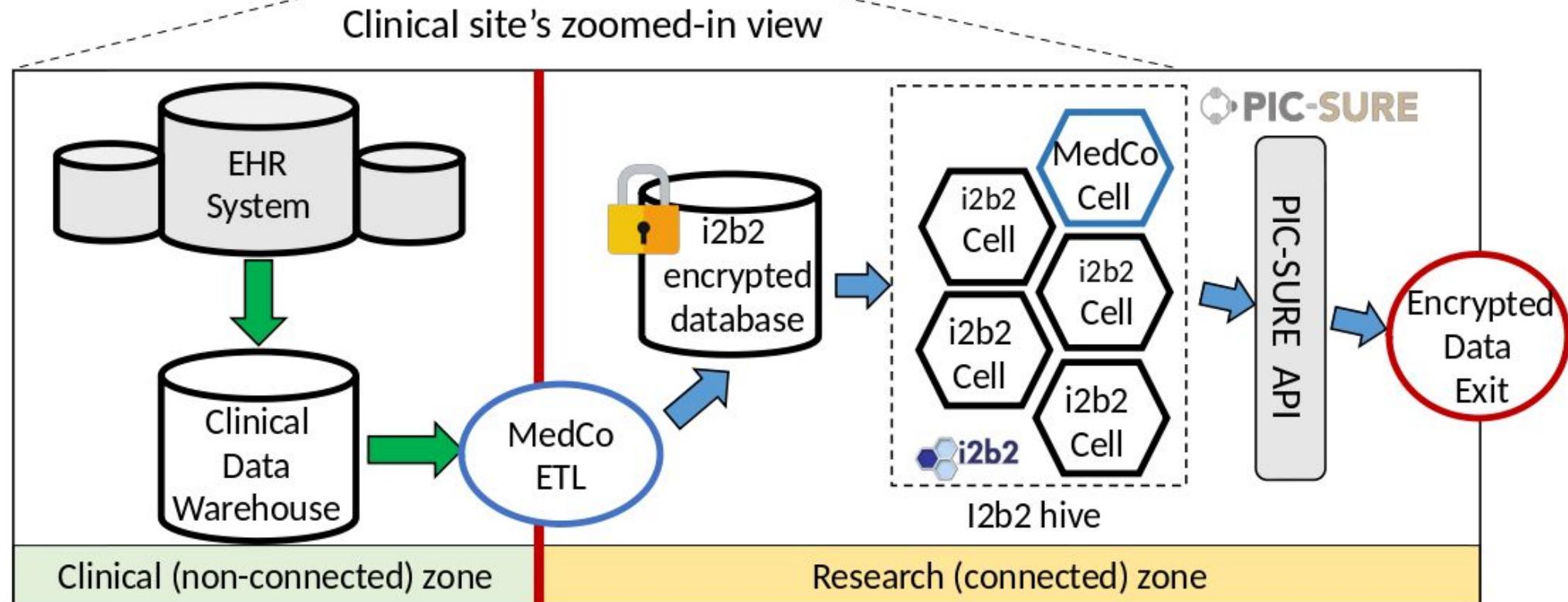


Differential privacy

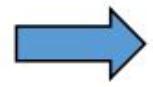
⇒ MedCo provides technical means to share data that would otherwise not be shared

[1]: J. L. Raisaro et al. "MedCo: Enabling Secure and Privacy-Preserving Exploration of Distributed Clinical and Genomic Data". In: IEEE/ACM Transactions on Computational Biology and Bioinformatics (2018), pp. 1–1. issn: 1545-5963. doi: 10.1109/TCBB.2018.2854776.





Clear data

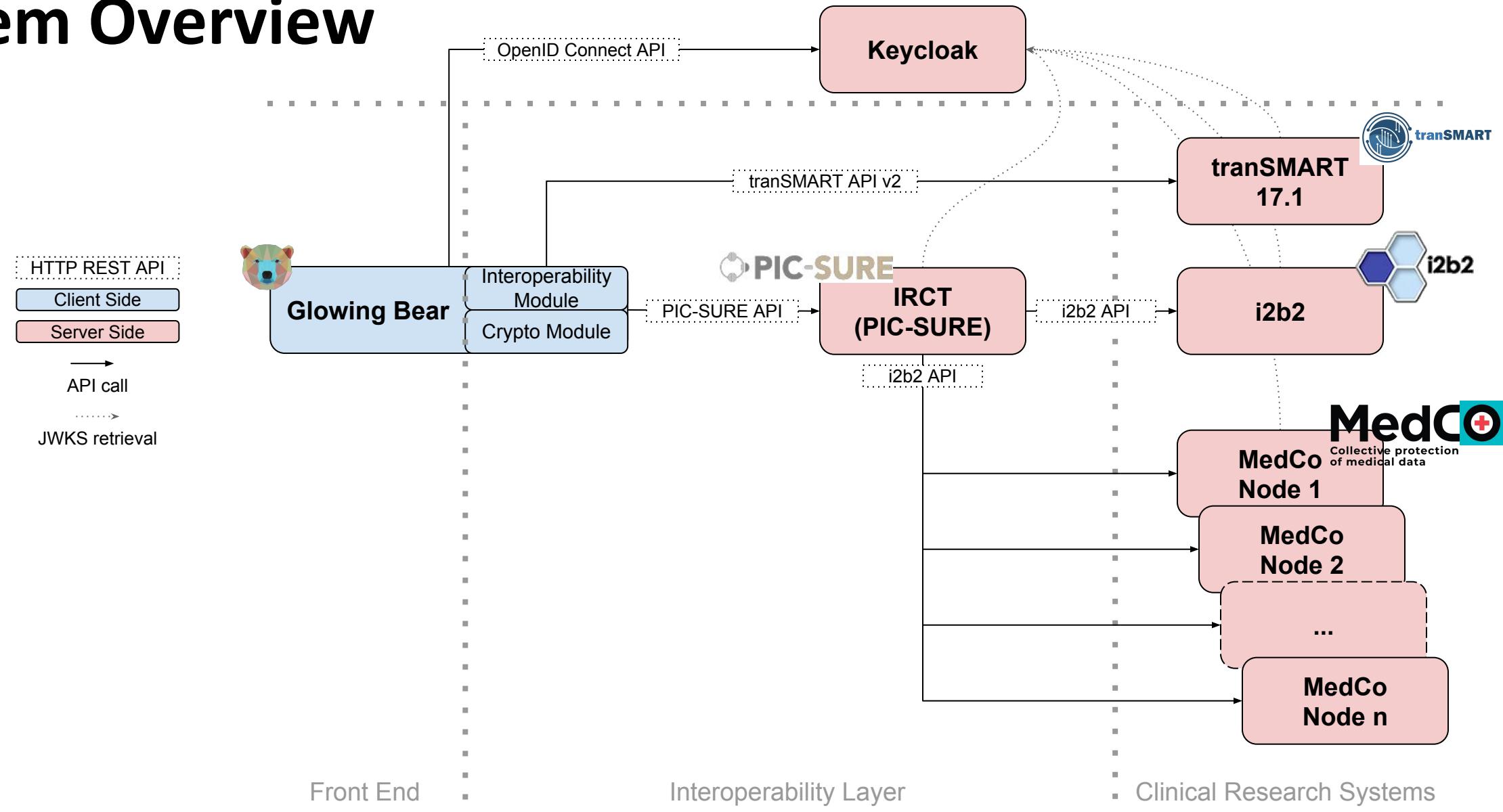


Encrypted data

ETL: Extraction Transformation
(Encryption) and Loading tool

System Overview

System Overview



Demo

Conclusion

- offer a modern front end that allows cohort exploration: **Glowing Bear** 
- compatible with **tranSMART** (v17.1) and **i2b2** 
- compatible with **MedCo** 
- be extensible for **future support of additional platforms** 
- technical considerations:
 1. easy to deploy 
 2. not degrade user experience in existing systems 
 3. enforce secure authentication 
 4. open-source 
 5. practical runtime 

Future Work

- Authentication: using a distributed ledger, to avoid single point of failure (Keycloak)
(in progress)
- Support additional systems through the PIC-SURE API
(in progress: HAIL[1], framework for exploration and analysis of genomic data)
- More features in UI for i2b2 and MedCo
e.g. data export, analysis, query saving, etc.
- PIC-SURE 2.0 upgrade

Context

Project is a collaboration between EPFL & The Hyve

- The Hyve: wanted Glowing Bear to support i2b2
- EPFL: wanted new front end for MedCo
- Within the framework of the Swiss DPPH (Data Protection in Personalized Health)

**talk with chair guy for presentation
part of work being sponsor by dpph**

User Interface before: i2b2 webclient

i2b2 Query & Analysis Tool Project: Genomics – WES User: i2b2 Demo User Find Patients | Analysis Tools | Message Log | Help | Logout

Query Tool

Query Name:

Temporal Constraint: Treat all groups independently

| Group 1 | | | Group 2 | | | Group 3 | | |
|---------------------|-------------|---------|---|-------------|---------|-----------------------------------|-------------|---------|
| Dates | Occurs > 0x | Exclude | Dates | Occurs > 0x | Exclude | Dates | Occurs > 0x | Exclude |
| Treat Independently | | | Treat Independently | | | Treat Independently | | |
| HLA-DQB1 levels < 0 | | | SNV/SNP [stop_gained] SNV/SNP [non_synonymous] | | | Gene Symbol [Contains: HLA-DQB1]] | | |

Run Query Clear Print Query 3 Groups New Group

Query Status

Number of patients
28
For Query "HLA-D-SNV/S-SNV/S@03:50:12"

Navigate Terms **Find Terms**

- Sequence Ontology Variants
 - complex substitution
 - copy number variation
 - deletion
 - indel
 - insertion
 - inversion
 - MNP
- Reference genome
- SNV/SNP
 - 3 prime UTR variant
 - 5 prime UTR variant
 - Alternate Allele
 - Chromosome
 - dbSNP RS id
 - downstream gene variant
 - exon variant
 - frameshift_variant
 - HGNC Gene Symbol
 - inframe_variant
 - intergenic variant
 - intron variant
 - non_synonymous
 - PolyPhen2 prediction
 - PolyPhen2 score
 - Reference Allele
 - Sequence End (base pair)
 - Sequence Start (base pair)
 - splicing variant
 - stop_gained
 - stop_lost
 - synonymous
 - upstream gene variant
 - Zygoticity
 - point_mutation

MedCo



Website: *medco.epfl.ch*

Roadmap

- MedCo with PIC-SURE and Glowing Bear: Nov. 2018
- MedCo with MedChains (blockchain-based authentication and access control): April 2019
- Skype-like pull model: June 2019

OpenID Connect[1] / Keycloak

OpenID Connect

- authentication and authorization protocol
- token-based
- allow any kind of services to delegate identity and access management

Keycloak

- identity provider
- implements OpenID Connect server

Why?

- many different components running on different systems, with different authentication mechanisms
- need to have common authentication

System Design Overview



Glowing Bear[1]

- User interface for cohort exploration
- And more advanced analytics
- Open-source web application
- Originally for tranSMART v17.1 only

PIC-SURE API

- Query terms of data source exposed through a *tree*
- Each data source declares its query format
- Data source has freedom of implementing anything as long as it fits the interface
- API has a SQL-like format:

```
"where": [ {  
    "field": {  
        "pui": "/resource/study/Age/",  
        "dataType": "INTEGER"  
    },  
    "predicate": "CONSTRAIN_VALUE",  
    "fields": {  
        "OPERATOR": "GT",  
        "CONSTRAINT": "20"  
    }  
}]
```

where part: constraints on data

field: path and type of query term queried
(obtained from tree)

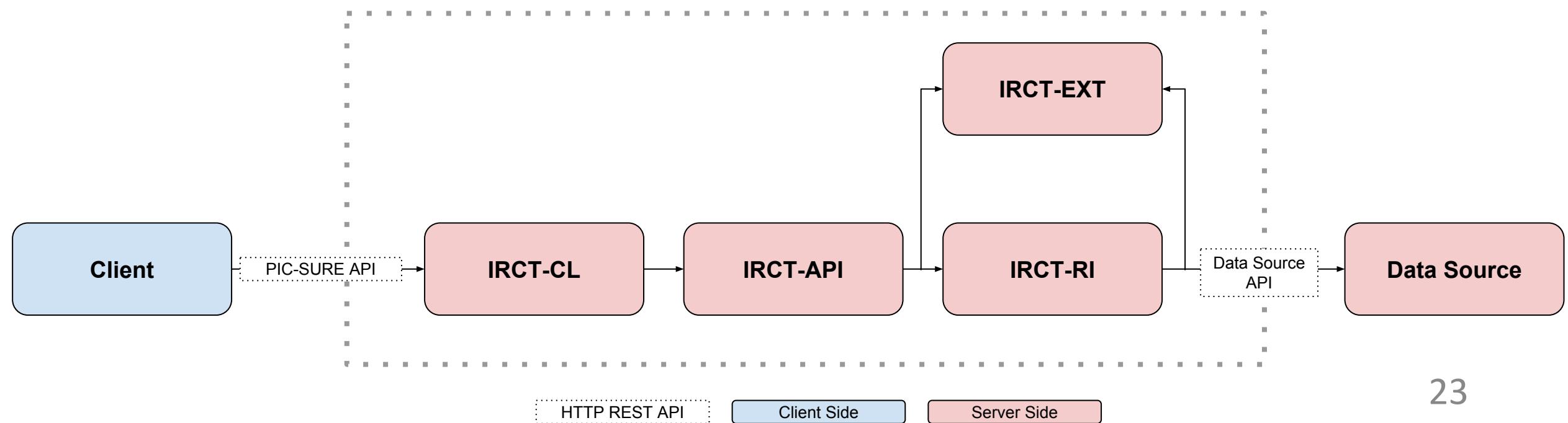
predicate used on query term

fields: additional input to predicate

IRCT

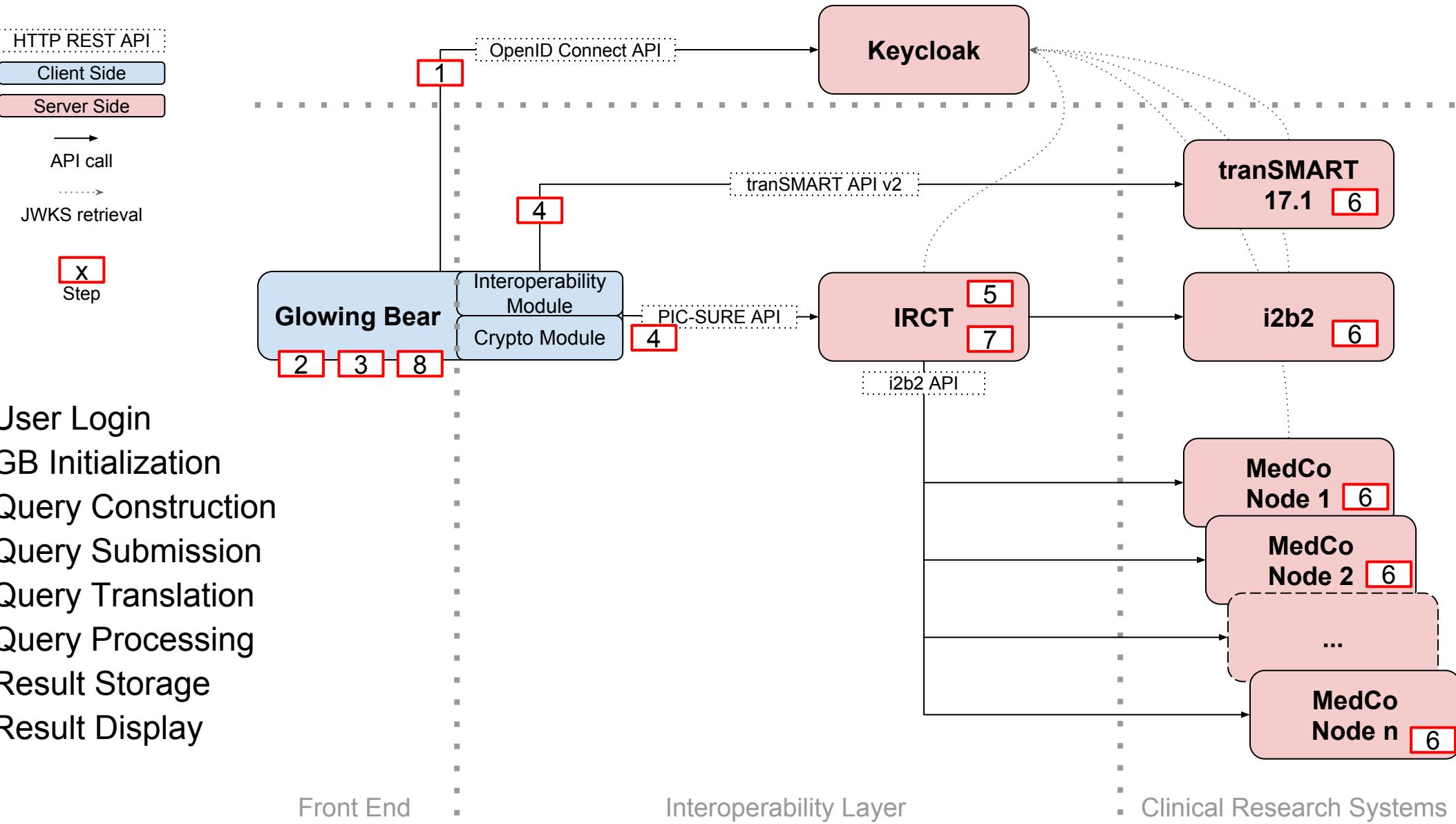
- IRCT is the official implementation of the PIC-SURE API
- 4 components:
 - IRCT-CL (REST service)
 - IRCT-API (core library)
 - IRCT-EXT (external hooks library)
 - IRCT-RI (data sources connectors)

IRCT: Inter-Resource Communication Tool
CL: Communication Layer
API: Application Programming Interface
RI: Resource Interface
EXT: EXTension

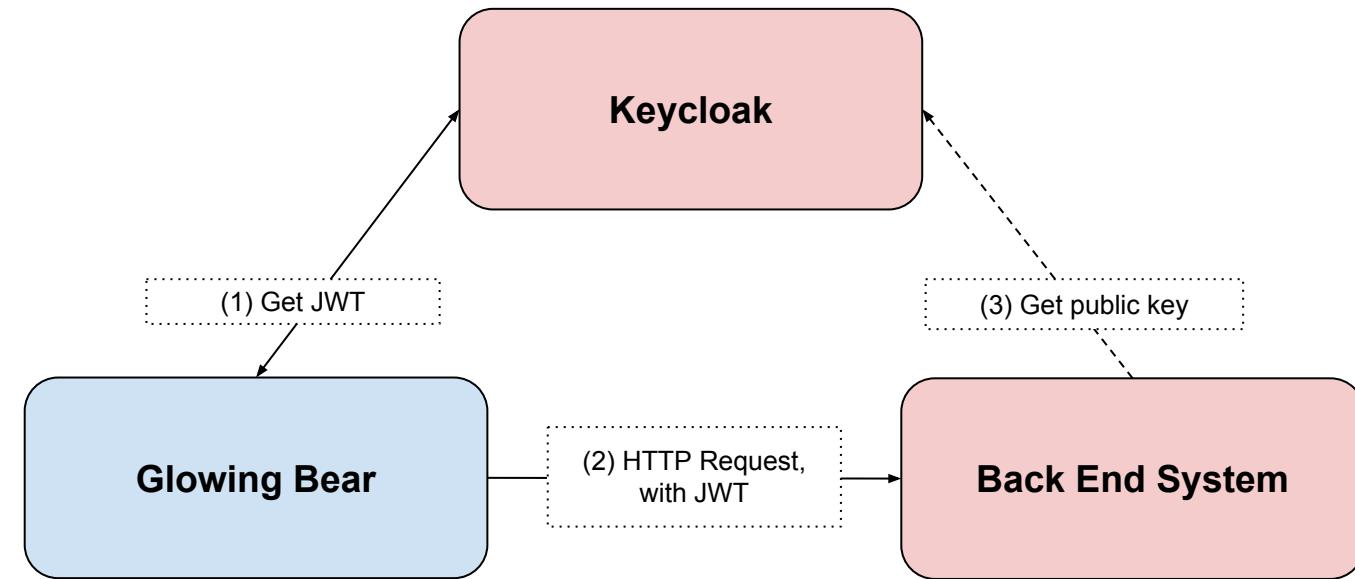


Detailed Workflows

Detailed Query Workflow



OpenID Connect: Stateless Authentication



JWT: JSON Web Token

Legend

-----> Cached Request

HTTP Request

Server Side

Client Side

OpenID Connect: JSON Web Token

JWT format

→ 3 distinct base64-encoded values

- JSON header: metadata

```
{  
  "alg": "RS256",  
  "typ": "JWT",  
  "kid": "eTFrdyrNxXLNHI7p0Ywybc7z1SBHTEcqWcMTybtqvQY"  
}
```

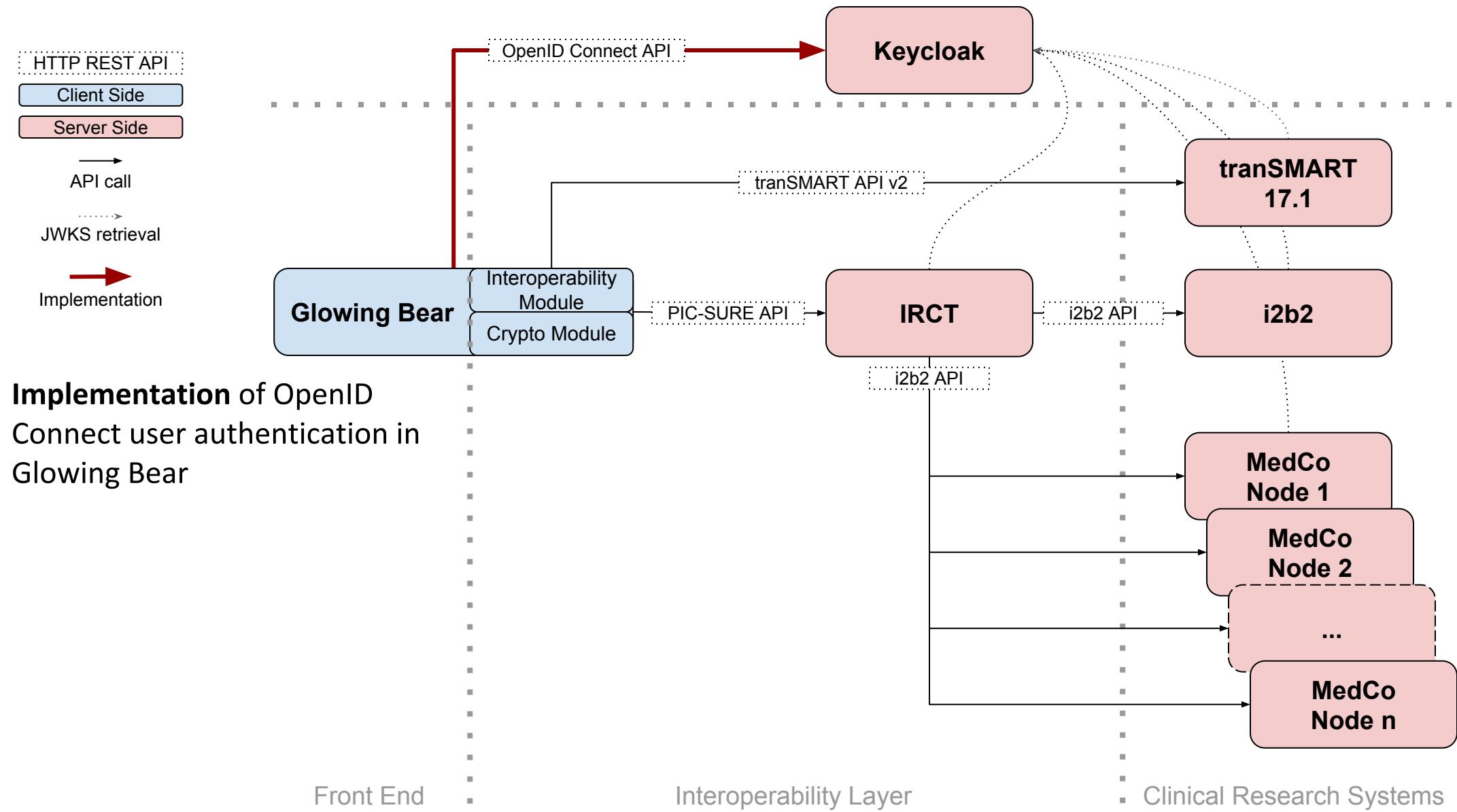
- JSON payload: identity, authorizations, validity, ...

```
{  
  "exp": 1523454086,  
  "iat": 1523453186,  
  "iss": "http://localhost:8081/auth/realms/master",  
  "aud": "glowing-bear",  
  "nonce": "N0.28573339803406971523453198656",  
  "resource_access": {  
    "account": {  
      "roles": [  
        "role1",  
        "role2"  
      ]  
    } },  
  "preferred_username": "test",  
  "email": "test@test.com"  
}
```

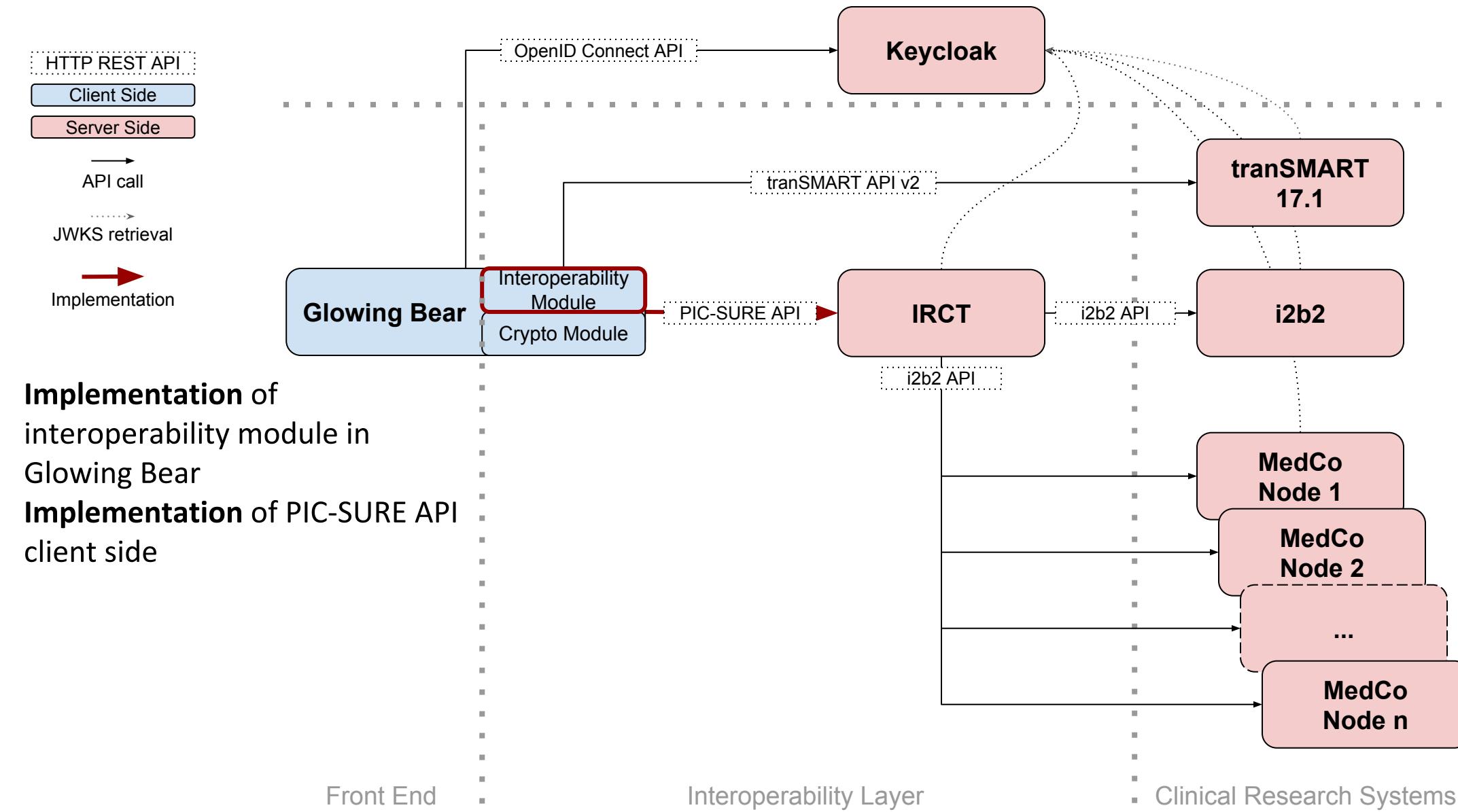
- Binary signature

Implementation

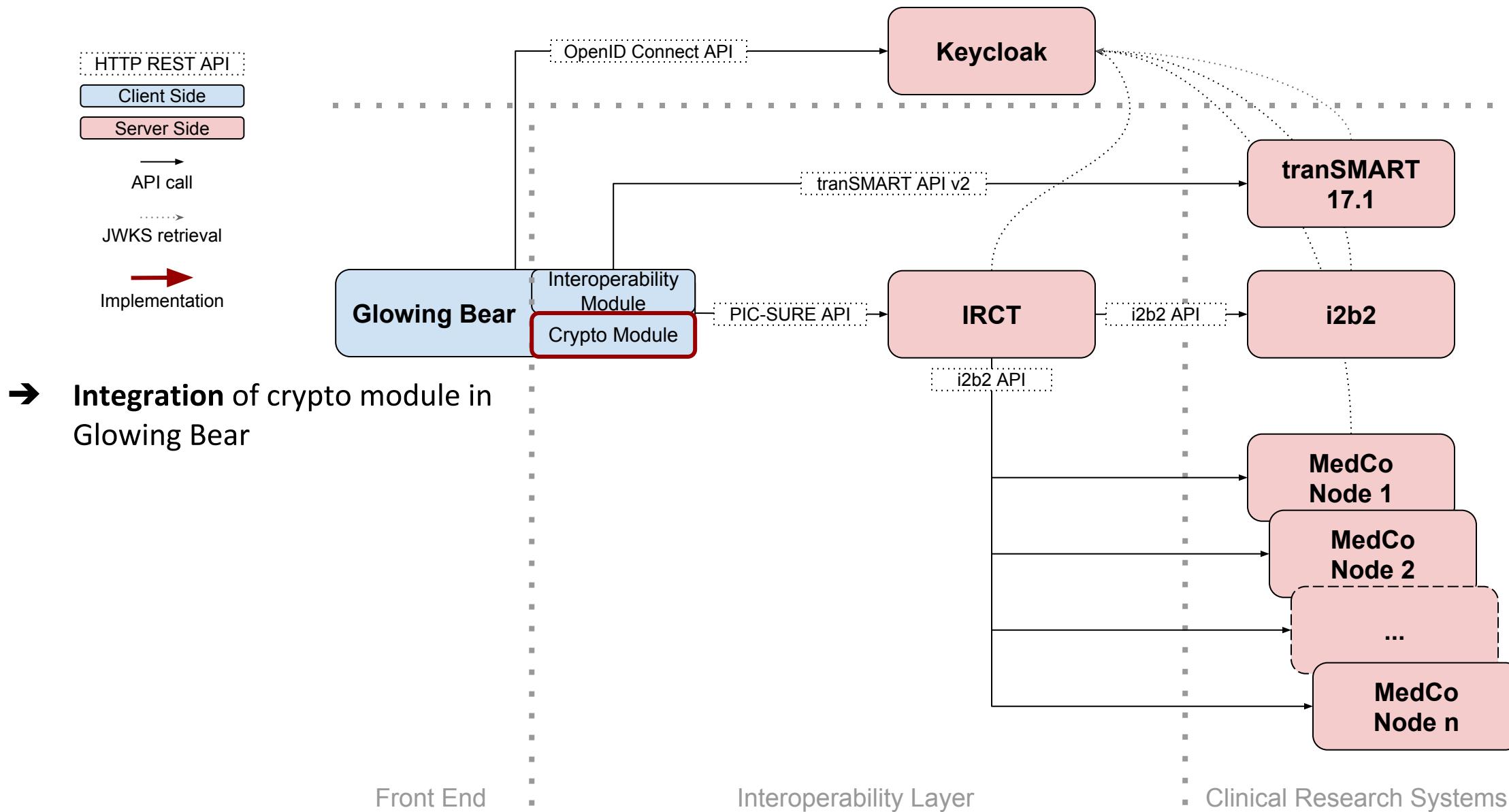
Glowing Bear: OpenID Connect



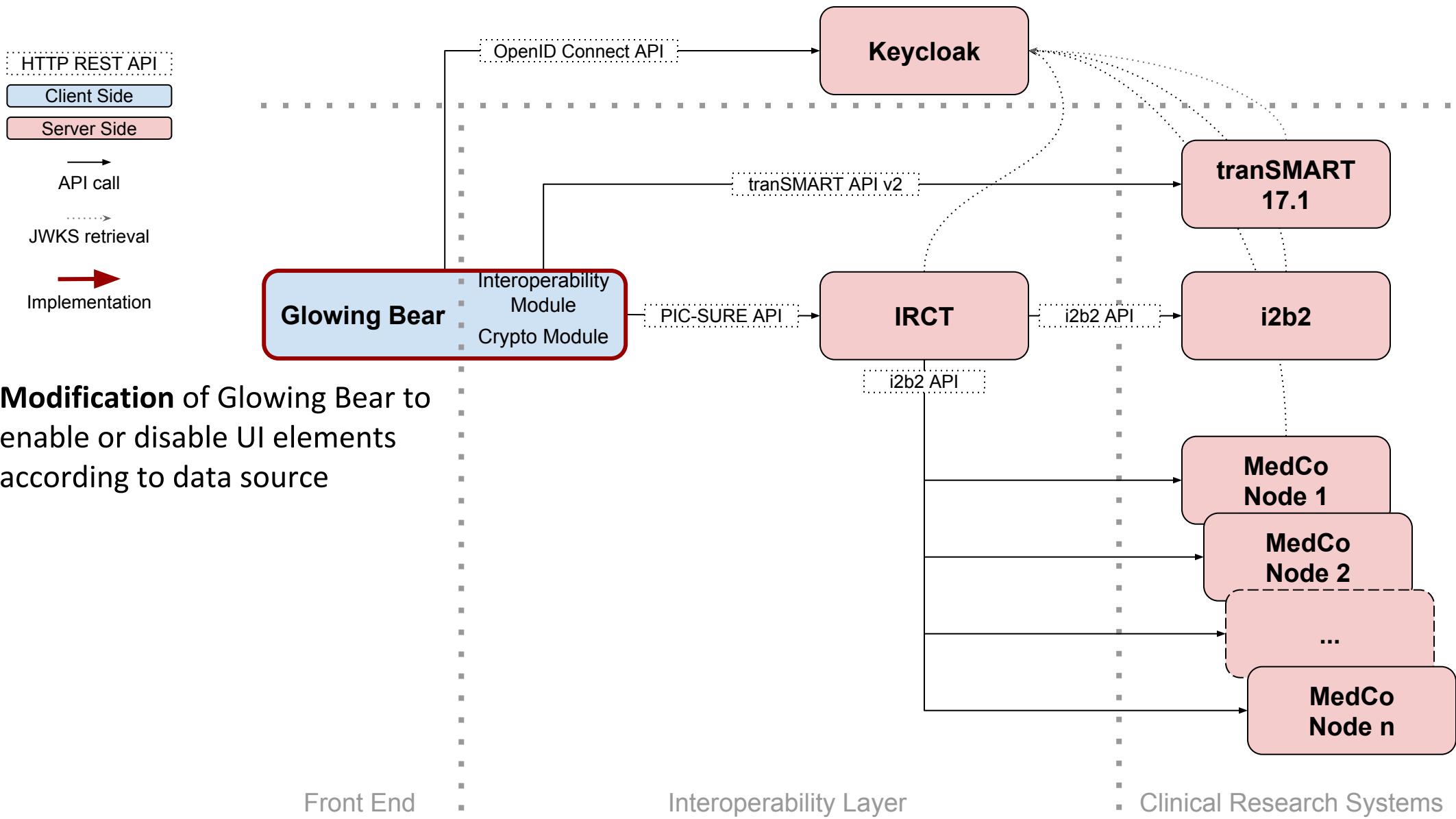
Glowing Bear: Interoperability Module



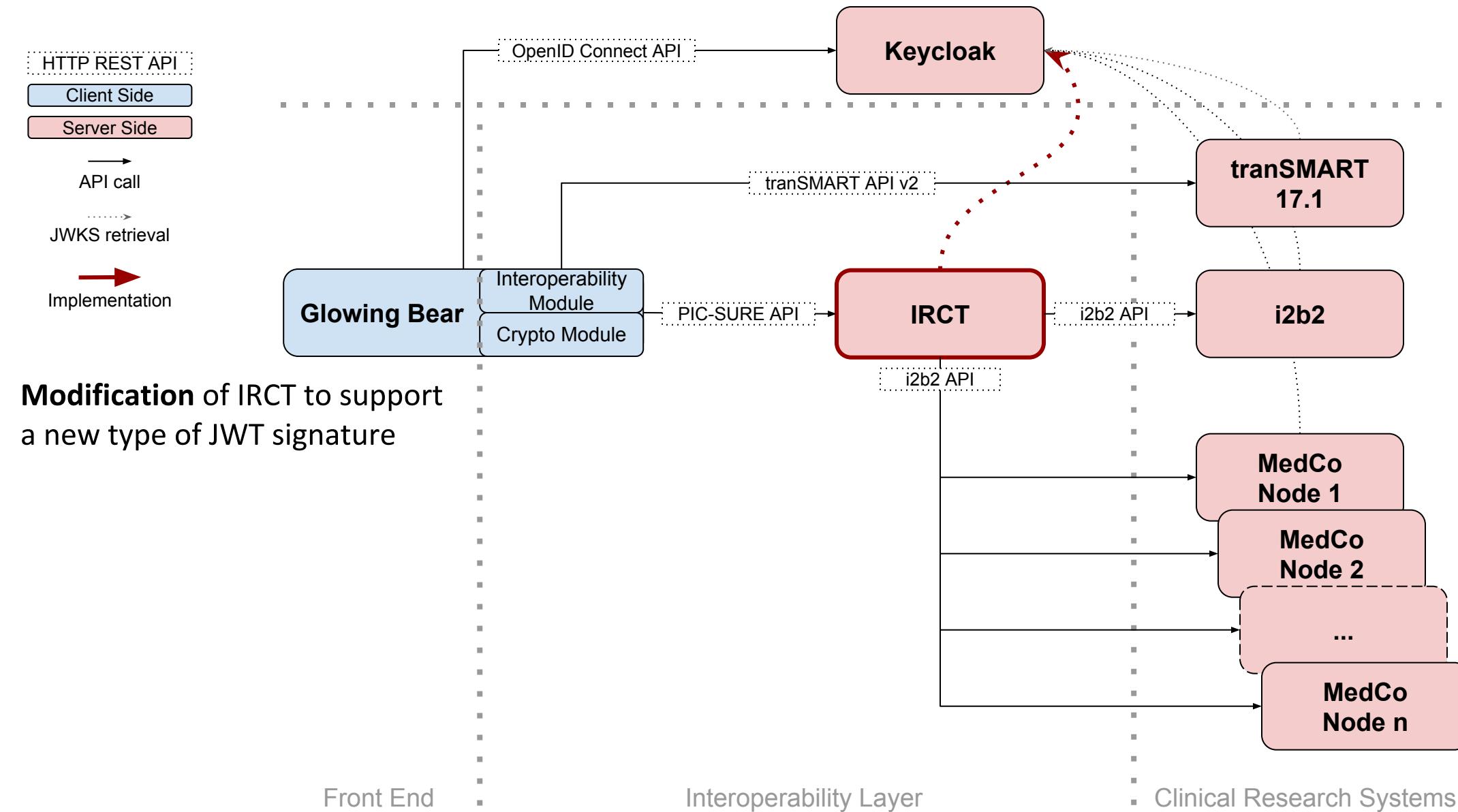
Glowing Bear: Crypto Module



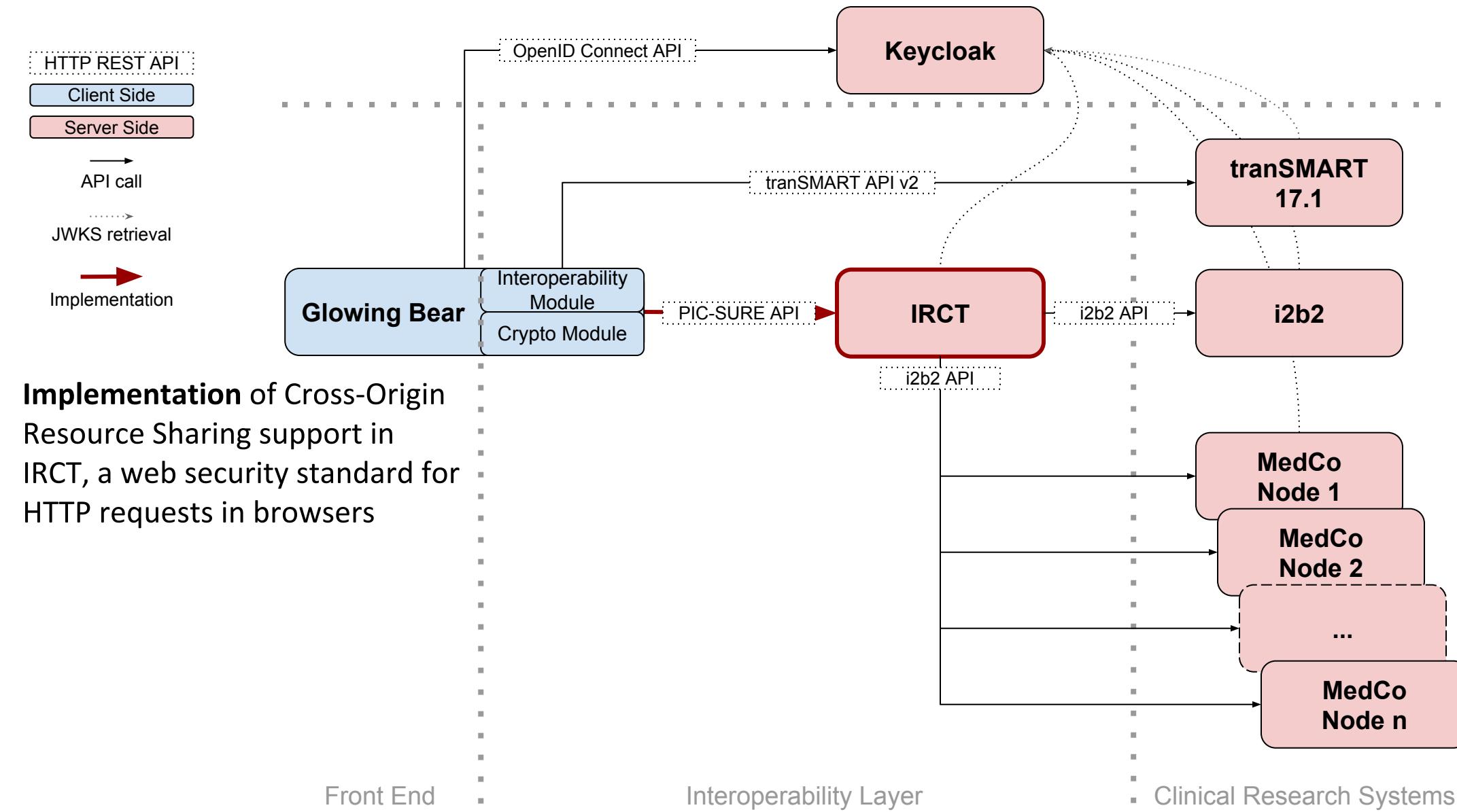
Glowing Bear: User Interface



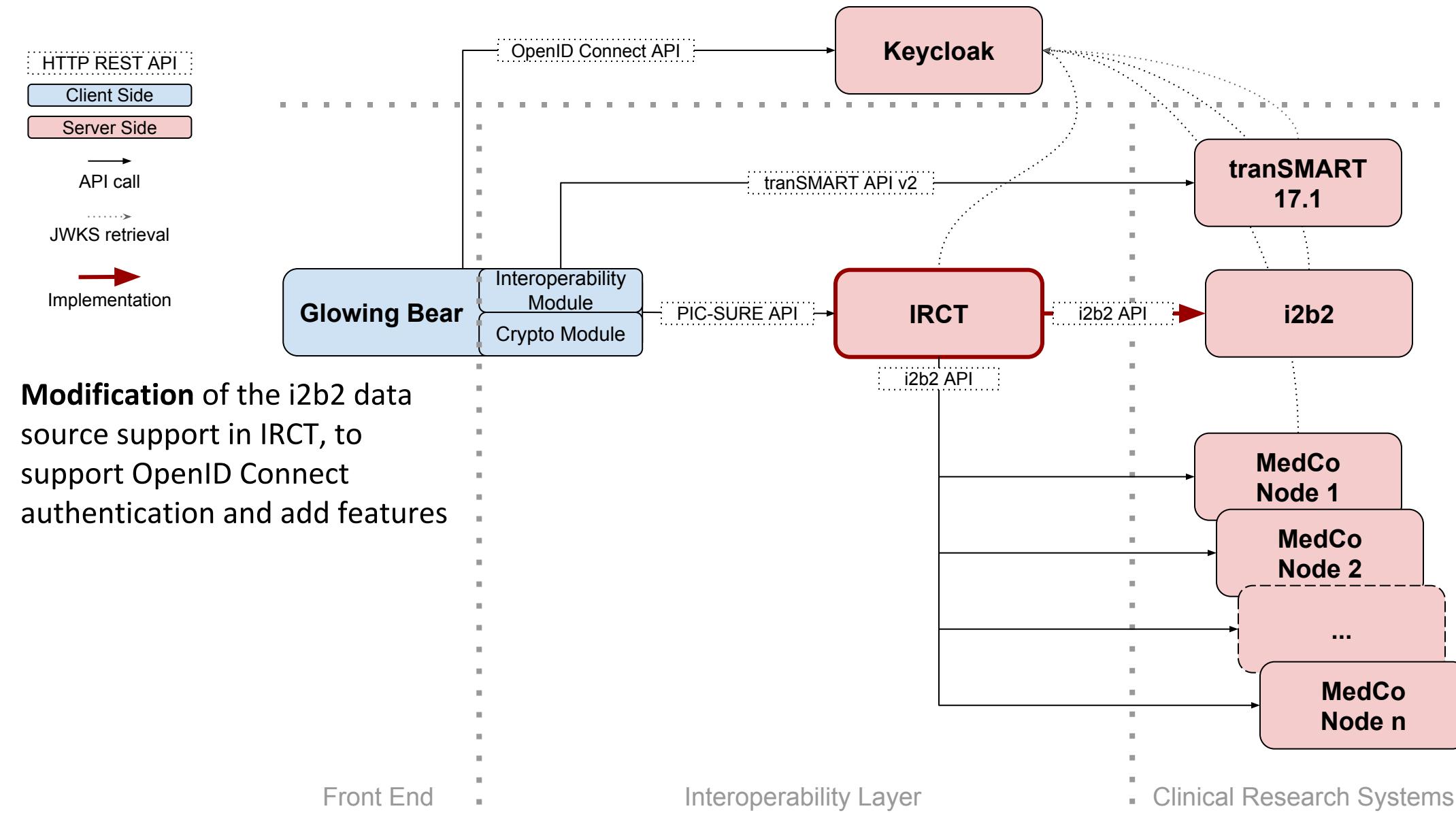
IRCT: OpenID Connect



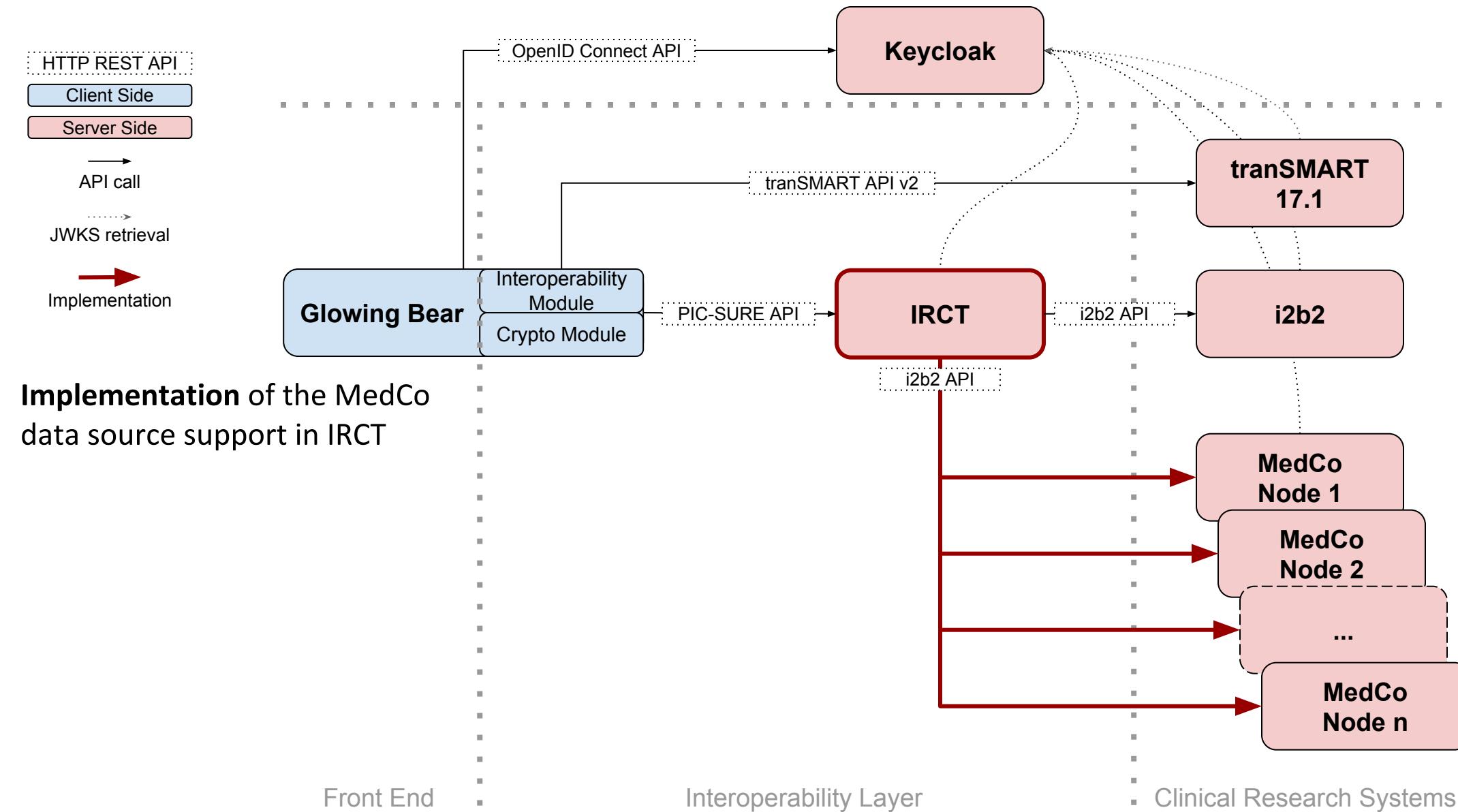
IRCT: Cross-Origin Resource Sharing (CORS)



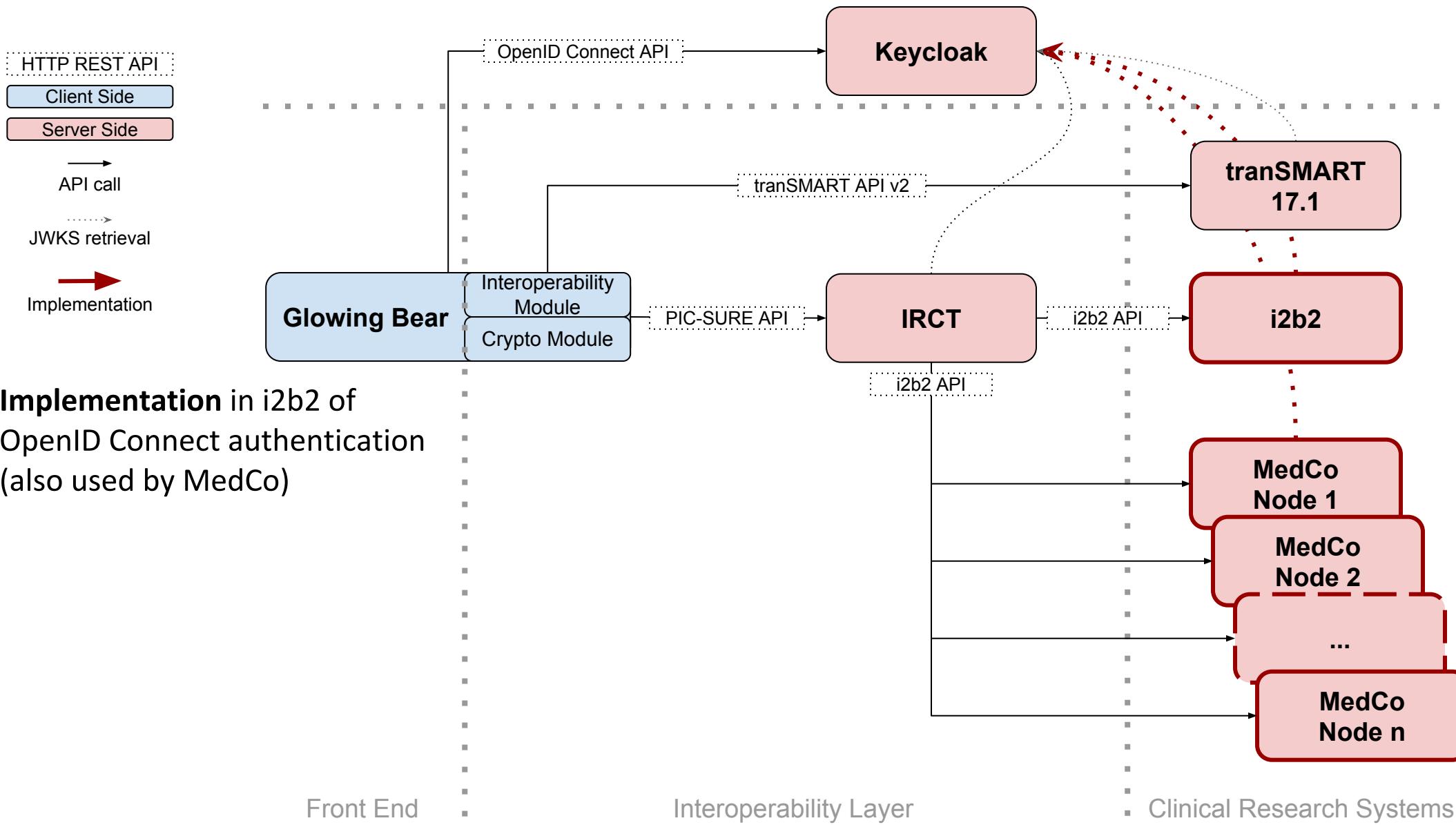
IRCT: i2b2 Data Source



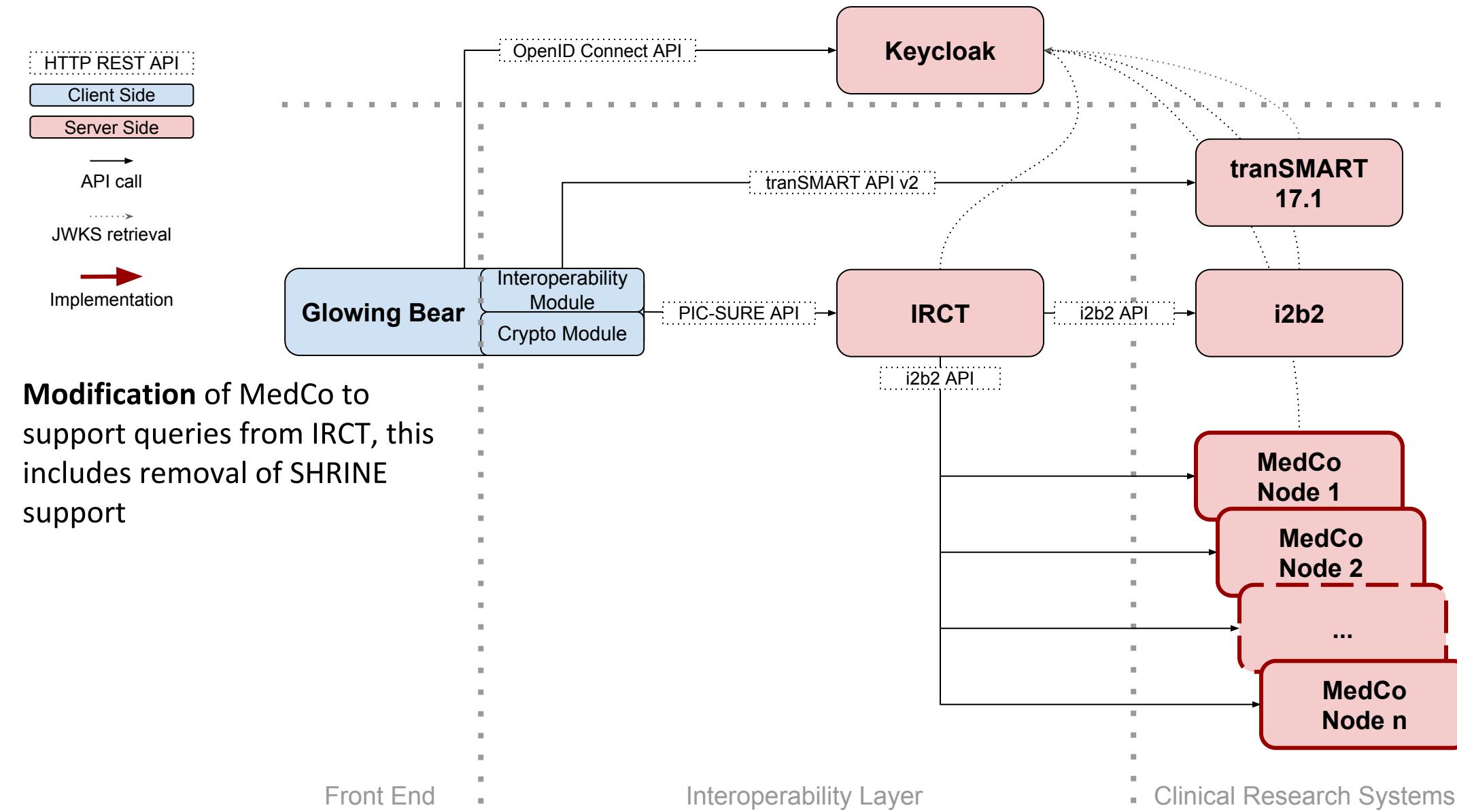
IRCT: MedCo Data Source



i2b2: OpenID Connect



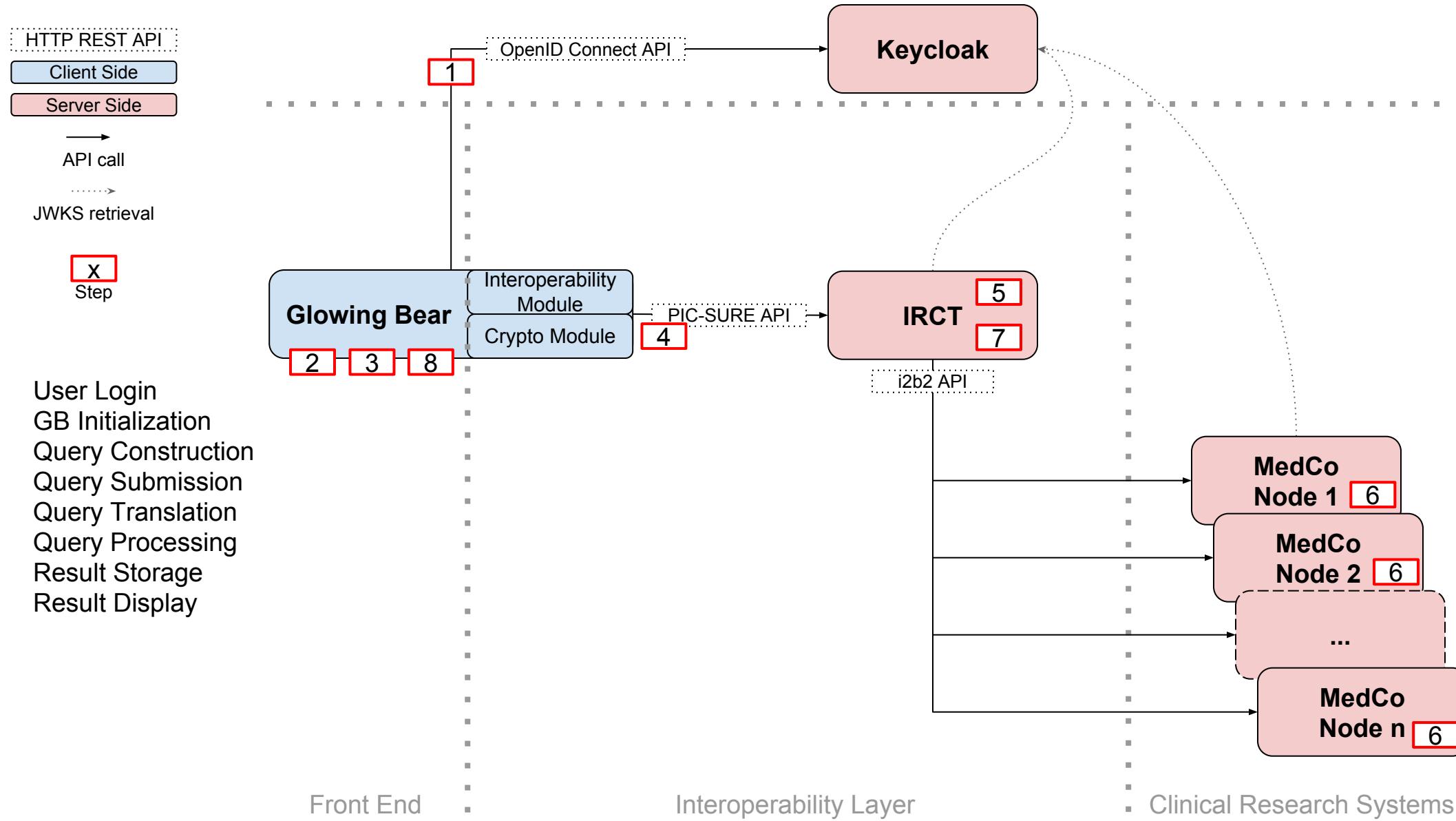
MedCo: IRCT Querying



Conclusion

Backups

Query Workflow: MedCo



Query Workflow: MedCo

Step 2: Glowing Bear Initialization

- Public key of the collective authority loaded (collective authority = all the MedCo nodes):
 Pk_c
- Pair of public/private key of user randomly generated
 Pk_u / pk_u

Step 3: Query Construction

- In the tree, each query term has an a corresponding integer
 q_v
- It is encrypted before submission with the public key of the collective authority
 $ENC_{PkC}[q_v]$

Step 5: Query Translation

- Query in PIC-SURE API format translated to i2b2 API format
- Broadcasted to all the MedCo nodes at the same time

Query Workflow: MedCo

Step 6: Query Processing (at each node, using distributed protocols involving all nodes)

- A. Encrypted query terms are “tagged”: the encryption is switched from probabilistic to deterministic (DDT = Distributed Deterministic Tagging)

$$\text{ENC}_{\text{PkC}}[q_v] \rightarrow \text{DDT}_{S_i}[q_v]$$

- B. The query is submitted to normal i2b2 (in the database, the $\text{DDT}_{S_i}[q_v]$ are stored)
- C. i2b2 answers with a patient set, but it contains dummy patients

Query Workflow: MedCo

Step 6: Query Processing (distributed protocols involving all the MedCo nodes)

D. Each patient has a “dummy flag”: an encrypted 0 or 1

→ we fetch the flags of patients from the set

$$\text{ENC}_{\text{PkC}}[f_j]$$

E. The sum of the flags is our real count, we compute it homomorphically:

$$\text{ENC}_{\text{PkC}}[R_i]$$

F. The result is encrypted with the key of the collective authority, the corresponding private key does not exist

→ we change the key of the encryption to the one of the user

$$\text{ENC}_{\text{PkU}}[R_i]$$

Query Workflow: MedCo

Step 8: Result Display

- The encrypted results are fetched by Glowing Bear
- They are decrypted using the private key of the user

R_i