# Master of Technology in Enterprise Business Analytics (Web Analytics Elective)

# Introduction to Web Analytics

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### What is Web Analytics?

#### Web Analytics

- The measurement, collection, analysis and reporting of web data for purposes of understanding and optimizing web usage (Wikipedia)
- The study of visitor, traffic and navigation patterns to discover the success of a particular website
- GOALS ~ increase website traffic, improve the user experience (UX), ensure website meets its business goals



Web Analytics Tools: Google Analytics, WebTrends, ....

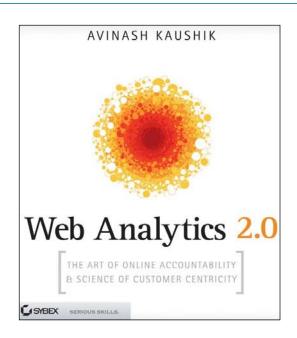


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### Web Analytics 2.0?

#### Web Analytics 2.0 is defined as:

- The analysis of qualitative and quantitative data from your website and the competition
- To drive a continual improvement of the online experience of your customers and prospects
- 3. Which translates into your desired outcomes (online and offline)







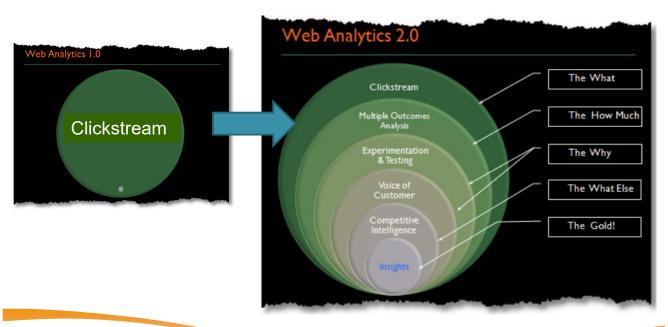
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### Web Analytics 2.0

https://www.kaushik.net/avinash/rethink-web-analytics-introducing-web-analytics-20/





#### **On-site vs Off-Site Web Analytics**

- On-Site Web Analytics
  - Analysis of visitors behavior once they are at your website analysis of webserver logs
  - Example tools include Google Analytics, Adobe Site Catalyst, WebTrends etc
- Off-Site Web Analytics
  - Analysis of your *potential* website audience and how you website compares to others
  - Main Tools and Methods:
    - Panels: Companies such as comScore and Nielsen recruit panels of users who install
      monitoring software to measure their web activity. Panelist demographics are known but
      they are mostly home users.
    - **ISP Data:** Companies such as Hitwise aggregate anonymous data provided by ISPs the ISP web log data. Covers all visitor types: home, work, mobile, educational, public access etc. This data is anonymous hence demographics are not available.



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# The Bigger Picture: Web Mining

- Web Usage Mining
  - Understanding and modeling how users interact with the web, determining what their interests are and what they are looking for
  - Focus on: website optimisation, improved search, behavioral modeling, content personalisation, making recommendations, ....
- Web Content Mining
  - What can we learn from the content that is on the web?
  - Focus on web crawling & sampling, text mining
- Web Structure Mining
  - What can we learn about the interconnection between websites and between entities on the web?
  - Focus on graph & network mining, e.g. social network mining



### Agenda for the Elective

- Day1: Web Site Analytics (Barry)
  - Website Analytics methods and tools
  - Google Analytics Workshop
- Day2: Web Usage Mining (Barry)
  - Mining Web Server Logs (page-view and search query logs)
  - Mining Online User Behaviors (Search relevance prediction, Ad click prediction, Content Recommendation)
- Day3 & 4 & 5: Web Structure Mining (Dr Li Xiaoli, I2R)
  - Graph & Network Mining concepts
  - Link Analysis, Social Network Mining
  - Day5 (pm) will be presentations for Xiaoli's assignment project





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# **On-Site Web Analytics: How is it done?**



ISS Website Users (shown using Google Analytics)



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### On-Site Web Analytics: How is it done?

#### Log File Analytics

- Whenever a webserver delivers a webpage to your browser this is recorded into a web server log
  - Typical fields = Date-time, IP-address of client, Browser Type, URL requested.....
- Every served page (page-view) is logged log size can hence be huge
- Usually performed in-house you buy and maintain the analytics software

#### Page Tagging

- You insert some small tracking code (usually JavaScript or Flash) onto every important web page in your website
- When the users browser displays the webpage it executes the tracking code which send a message back to the Web Analytics Server
  - Typical fields = Page-ID, Date-time, IP address of client, Browser Type, Screen Resolution ....
- Can be performed in-house, but usually provided as a third-party service





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### Advantages of log file analysis

#### Pros

- No changes to website required, the raw data is already available
- Easy to switch web analytics tool, the data is on the company's own servers, in a standard, not proprietary, format
- The web server records every transaction it makes, e.g. serving PDF docs - does not rely on the visitors browser cooperating - does not require JavaScript to be enabled
- Search engine spiders get logged, can be useful information for SEO
- Doesn't slow page loading, no external server calls (e.g. DNS lookups)

#### Cons

- Search engine spiders and robots get logged – they must be detected in the logs and removed for normal analysis
- Web caching isn't logged; if a person revisits a page that can be retrieved from the browser cache, then the web server gets no request. The person's path through the site is hence lost. Caching can account for up to onethird of all page-views, omission can seriously skew many site metrics.
- Can be more expensive to set up Web Log Analytics tools: can require specialist knowledge of web logs
- Web logs can periodically be purged



### **Advantages of Page Tagging**

#### Pros

- Available to companies who don't have access to their own web servers
- Also records visits to cached pages
- Can record events which do not involve a request to the web server, e.g. interactions within Flash movies, partial form completion, mouse events, visitor screen sizes, even (potentially) price of goods the visitor purchased.
- The page tagging service manages the process of assigning cookies to visitors; with log file analysis the server has to be configured to do this

#### Cons

- Require JavaScript to be enabled in the visitor's browser
- Requires an additional DNS look-up by the user's computer to determine the IP address of the collection server.
   Delay or failure in completing a DNS look-up may result in data not being collected





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# **Web Analytics Tools Survey**

#### Self-hosted software [edit]

#### Free / Open source (FLOSS) [edit]

This is a comparison table of web analytics software released under a free software license.

Name <b>♦</b>	Platform <b>♦</b>	Supported databases ♦	Tracking Method ♦
Analog	С	Logfile-based	Web log files
AWStats	Perl	Logfile-based	Web log files
Open Web Analytics	PHP	MySQL	JavaScript or PHP pagetag
Piwik	PHP	MySQL	JavaScript or PHP pagetag or Web log files
W3Perl	Perl	Logfile-based	Web log files
Webalizer	С	Logfile-based	Web log files

From: http://en.wikipedia.org/wiki/List\_of\_web\_analytics\_software



# **Web Analytics Tools Survey**

#### Proprietary [edit]

This is a comparison table of web analytics proprietary software.

Name <b>♦</b>	Company <b>♦</b>	Platform <b>♦</b>	Tracking Method \$	1 \$
Mint	Mint	PHP	Cookies via JavaScript	
Sawmill	Flowerfire Inc	Windows/Linux/BSD/POSIX	Web log files	etary
Splunk	Splunk Inc.	Windows/Linux/BSD/Solaris	Web log files	
Tealeaf CX	IBM	Windows/Linux	Network traffic monitor	
Unica NetInsight	IBM	Windows/Linux/Solaris	Web log files & Cookies (with or without JavaScript)	
Urchin	Google	Windows/Linux/BSD	Cookies & Logs	





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# **Web Analytics Tools Survey**

#### Hosted / Software as a service [edit]

This is a comparison table of hosted web analytics software as a service.

Name <b>♦</b>	Company <b>♦</b>	Tracking Method ♦	Latest stable release \$	Price in USD
Adobe Analytics	Adobe Systems	Cookies via JavaScript	15	Negotiable
Bing Webmaster Tools	Microsoft	Cookies via JavaScript	N/A	Free
Analyzer	AT Internet	Cookies via JavaScript	N/A	Negotiable
Bango Mobile Web Analytics	Bango plc	Mobile ID and cookies	4.0	From \$49/month
Data Workbench	Adobe Systems	Cookies via JavaScript	6.51	Negotiable
Google Analytics	Google	Cookies via JavaScript	N/A	Free (Standard), \$150,000 Annual (Premium)
Kissmetrics	Kissmetrics	Mobile libraries; Cookies via JavaScript	N/A	\$159-\$599 Monthly Plans
LiveChat	Livechat Software	Cookies via JavaScript	N/A	from \$36/month
Logentries	Logentries	Web log files; Mobile libraries; JavaScript	Continuous	Free
Mapmyuser.com	Mapmyuser, LLC	Cookies via JavaScript	N/A	Free
Mixpanel	Mixpanel	Cookies via JavaScript	N/A	Free (Start)/ Monthly Plans
Nullstack Analytics &	Nullstack Labs	Javascript, Cookies via Server	14	Free / Monthly Plans
Piwik Cloud	Piwik PRO	User ID, fingerprint and Cookies	2.14.0	\$29+/month
Quantcast	Quantcast Corporation	Cookies via JavaScript	N/A	Free
SimilarWeb	SimilarWeb Ltd.	Cookies via JavaScript	N/A	Free / Monthly plans (from \$199)
StatCounter	StatCounter	Cookies via JavaScript	N/A	Free - \$5/month \$119/month
Webtrekk Q3	Webtrekk	Cookies via JavaScript	N/A	From \$202/month
Webtrends	Webtrends	Cookies via JavaScript	N/A	N/A
Woopra	iFusion Labs LLC	Cookies via JavaScript	1.2	Free - \$499.95+/month
Yahoo! Web Analytics	Yahoo!	Cookies via JavaScript	Not available anymore	Free



# **Enterprise Web Analytics Tools**

Vendor	Product evaluated
Adobe	Adobe Analytics Premium
AT Internet	Analyzer III
Google	Google Analytics Premium
IBM	IBM Digital Analytics
SAS Institute	Adaptive Customer Experience (ACE)
Webtrends	Analytics On Demand
	Segments
	Streams
	Action Center
	Webtrends Explore

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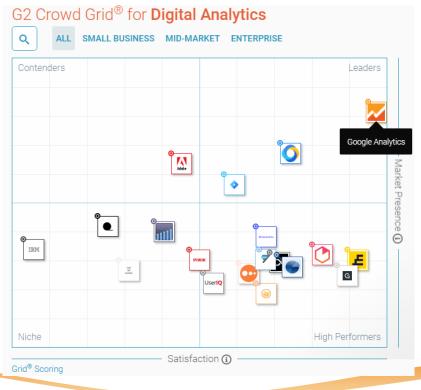
Forrester Wave<sup>™</sup>: Web Analytics, Q2 '14



**Digital Analytics Tools** 

"Digital analytics software tracks website visitors and measures web traffic."

https://www.g2crowd.com/categories/digital-analytics





### **On-Site Web Analytics: Main Objectives**

- How popular is your website how much traffic?
  - Basic site usage & traffic metrics. **GOAL = Monitor website health**
- What types of people visit your website?
  - Demographics & interests
  - GOAL = Reach the right people / tailor your website to your audience
- How did they get to (find) your website?
  - Search engine, referral, bookmark. **GOAL = Increase traffic / monitor campaigns**
- What do they do on your site?
  - How long do they stay? Most/least popular pages? Is it easy to use?...
  - GOAL = Ensure the website meets the customer/visitor needs
- Does your website achieve its business goal(s)?
  - Measure Conversions, downloads, sign-ups etc.
  - GOAL = Ensure the website meets your needs



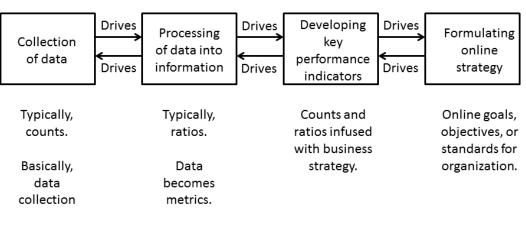


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### **Basic Web Analytics Process**



#### Examples:

- Time stamp
- Referral URL
- Query terms

#### Examples:

- Time on page
- Bounce rate
- Unique visitors

#### Examples:

- Conversion rate
- Average order value
- Task completion rate

#### Examples:

- Save money
- Make money
- Marketshare

From https://en.wikipedia.org/wiki/Web\_analytics#/media/File:Basic\_Steps\_of\_Web\_Analytics\_Process.png



### **Getting Started with Google Analytics**

- Create your own Google Analytics (GA) demo account
  - This will give you access via GA to Google's e-commerce store traffic data
  - To set up the account: https://analytics.google.com/analytics/web/demoAccount



The GA demo account allows you to explore traffic data from a real e-retail site

shop.googlemerchandisestore.com





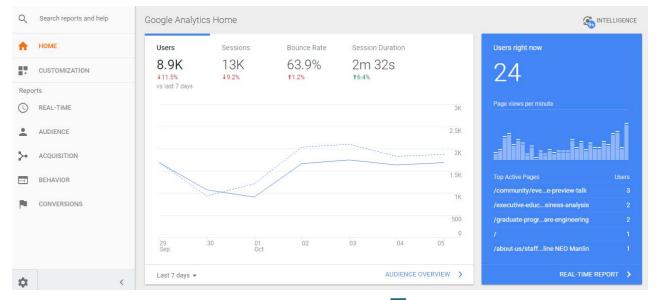
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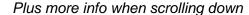
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#### **Getting Started with Google Analytics**

Once you have the account created you should see something like this.....

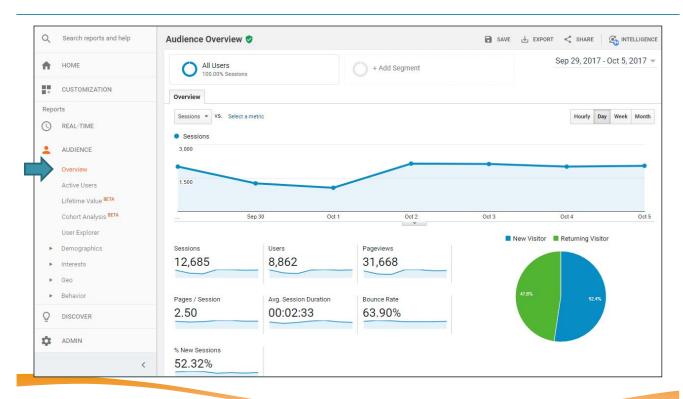








# **Basic Website Metrics (Audience)**







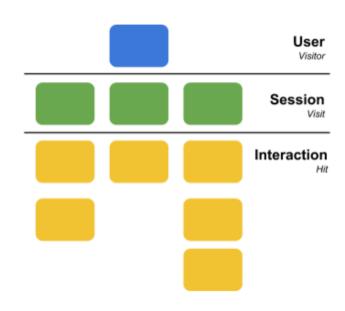
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#### The GA Data Model

- User (visitor)—the client that visits the site, such as the browser or mobile phone operated by a person.
- Session (visit)—the period of time during which the visitor is active on the site.
- Interaction (hit)—the individual activities that send a GIF request (hit) to the Analytics servers. These are typically characterized by a pageview, but can include:
  - a pageview
  - o an event (e.g. click on a movie button)
  - o a transaction
  - o a social interaction





#### **Basic Website Metrics (Audience)**

#### **Page View Metrics**

A request for a file, or an event such as a click, that is defined as a page in the setup of the web analytics tool. An execution of the page tagging script

- Number of Page Views
- Page View Duration

Difference between time of the request for a page and the time of the next request. Not recorded if there is no next request

Number of Hits

A request for any file from the web server. Available only in log analysis. Overestimates site popularity since webpage usually comprise many files

Note: All metrics require you to define a date range



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#### **Visit (Session) Metrics**

A series of page views from the same user during the same web "session"

- Number of Visits
- Average Visit Duration
- Average Page Depth (pages per visit)
- Bounce Rate (%visits to single page only)

#### **Visitor Metrics**

Visitors are usually identified by cookies OR the unique combination of IP address and User Agent (browser). Not same as unique person – many people can share the same computer and a user may have many machines.

- Number of Visitors
- New vs Returning Visitors (%new visits)
- Conversions & Conversion rate
   (any action on the site you define as a goal)

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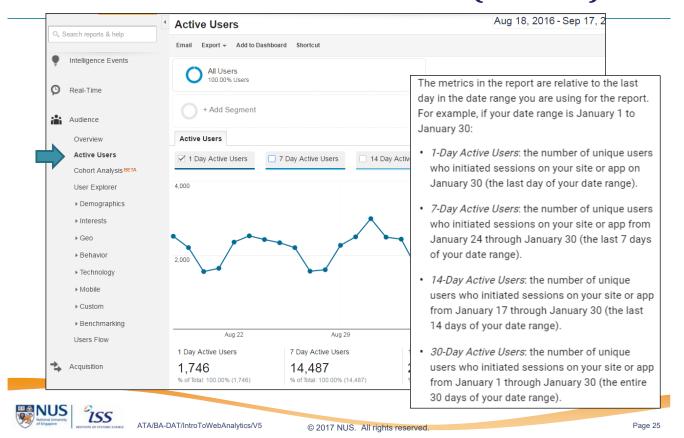
### **Basic Website Metrics: Time Dimension**

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- Day-of-week, week-of-month, month-of-year, season these may all be expected to impact site usage in (potentially) predictable ways
- But, also look for unexpected changes in any of the metrics, this may indicate something on the website or elsewhere has changed and perhaps needs fixing, e.g.
  - Removal of popular pages or products (decrease in visit duration, conversions, ...)
  - Addition of new pages or products (increase in visit duration, conversions, ...)
  - Positive changes in the structure of the site (pages viewed increases, visit duration increases ...)
  - Negative changes in site structure (evidence of navigational difficulty, repeat page views, looping, initial increase in page views but then decrease ...)
  - Negative changes to homepage or poorer targeting/marketing (bounce rate increases)
  - Improvements to homepage or better targeting/marketing (bounce rate decreases)
  - Better marketing (# visitors increases, % of new visitors increases ...)



### **Basic Website Metrics: Users (Visitors)**



# **Counting Users: issues (1)**

- Metrics such as page-views are additive, you can add up the days
- Unique Users cannot be easily added over days, weeks, months
- E.g. A hotel has two rooms (Room A and Room B). How many unique visitors were there over the 3 days period?

	Day 1	Day 2	Day 3	Total
Room A	John	John	Mark	2 Unique Users
Room B	Mark	Jane	Jane	2 Unique Users
Total	2	2	2	?



#### **Counting Users: issues (2)**

- New visitors + Repeat visitors do not equal total visitors
- If a user makes their first visit to the website then they are (correctly) a new visitor.
- But if they revisit the site again that day or week then they appear to be a returning user on the same day or week



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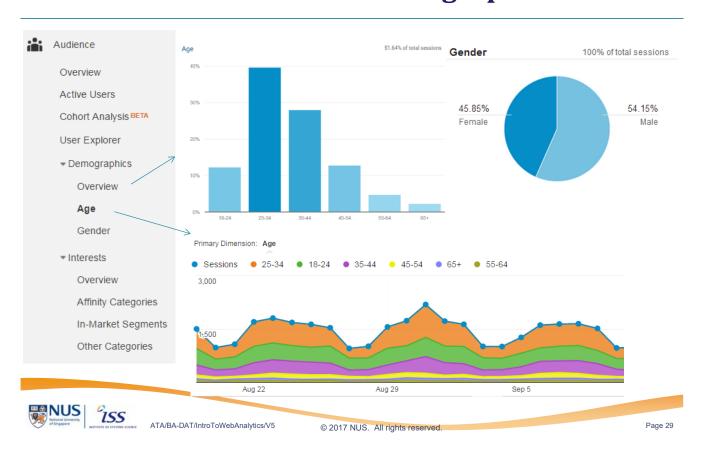
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### **Counting Users in GA**

- GA will automatically select which of the following two calculations to use depending on the report being viewed.
- Pre-Calculated Data
  - A set of unsampled, pre-aggregated data tables, updated on a daily basis.
  - Fast Enables you to quickly select reports for any date range
  - Derived by counting sessions
- On-The-Fly Calculations
  - Takes much longer and is used when you choose to view users over any non-date dimension
  - Uses cookies to identify unique users
     (warning: counting unique cookies overestimates unique users potentially by up to 25% or more)



# Who is the Audience? Demographics in GA



#### **Interests**

Affinity Category (reach)	69.32% of total sessions	In-Market S	Segment	65.80% of total sessions
3.86% Technophiles		3.76%		Consumer Electronics/Mobile Phones
3.41% Movie Lovers		3.45%		Financial Services/Investment Services
3.30% TV Lovers		3.25%		Travel/Hotels & Accommodations
2.94% Shutterbugs		2.72%		Employment
2.87% Mobile Enthusias	ts	2.24%		Education/Post-Secondary Education
2.85% News Junkies & A Celebrity News J	Avid Readers/Entertainment & unkies	2.17%		Computers & Peripherals/Computers/Laptops & Notebooks
2.72% Travel Buffs		2.08%		Travel/Air Travel
2.38% Avid Investors		1.77%		Real Estate/Residential Properties
2.35% Music Lovers/Po	Music Fans	1.74%		Software/Business & Productivity Software
2.26% Political Junkies		1.72%		Autos & Vehicles/Motor Vehicles/Motor Vehicles (Used)

Affinity Categories	Lifestyles similar to TV audiences, for example: Technophiles, Sports Fans, and Cooking Enthusiasts
In-Market Segments	Product-purchase interests
Other Categories	Provides the most specific view of your users. For example, Affinity Categories includes Foodies, while Other Categories includes Recipes/Cuisines/East Asian



### **Obtaining Demographics & Interests**

- Inferencing: Whenever you visit a website that has partnered with the Google Display Network this is stored in a cookie on your machine. Different sites are associated with different demographics hence the list of sites you have visited can be used to infer gender and age etc. Note that cookies identify a web browser on a specific computer, not a specific person
- Volunteered to 3<sup>rd</sup> Party Sites: some sites might provide Google with demographic and interests information that people share on certain websites, such as social networking sites
- Volunteered to Google: demographics derived from Google profiles



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### **Obtaining Demographics & Interests**

Once you update Analytics to support Advertising Reporting Features, Analytics collects Demographics and Interests data from the following sources:

Source	Applies to	Condition	Result
Third-party DoubleClick cookie	Web- browser activity only	Cookie is present	Analytics collects any demographic and interests information available in the cookie
Android Advertising ID	App activity only	You update the Analytics tracking code in an Android app to collect the Advertising ID	Analytics generates an identifier based on the ID that includes demographic and interests information associated with users' app activity
iOS Identifier for Advertisers (IDFA)	App activity only	You update the Analytics tracking code in an iOS app to collect the IDFA	Analytics generates an identifier based on the IDFA that includes demographic and interests information associated with users' app activity

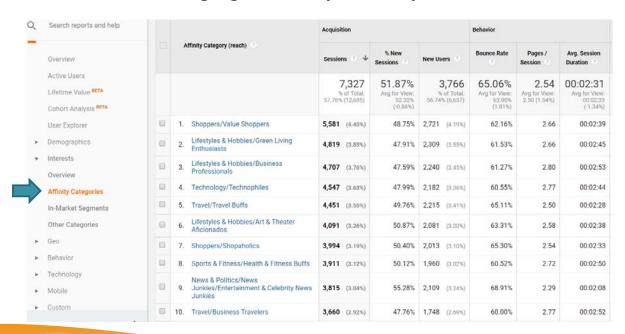
Demographics and interests data may only be available for a subset of your users, and may not represent the overall composition of your traffic: Analytics cannot collect the demographics and interests information if the DoubleClick cookie or the Device Advertising ID is not present, of if no activity profile is included.



By enabling the Advertising Features, you enable Google Analytics to collect data about your traffic via *Google advertising cookies* and *anonymous identifiers*, in addition to data collected through a standard Google Analytics implementation.

### **Affinity Categories**

These are marketing segments that you can buy





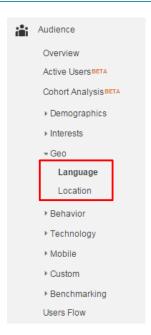


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#### **Geo: Identifying User Location**



- Usually based on reverse-IP technology, your IP address is used to infer your location
- In general, reverse-IP is very accurate at country-level ( $\sim$  99%), less accurate at city and postal code level ( $\sim$  90%+)

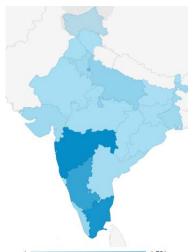
Country ?	Acquisition	Acquisition			
Country	Sessions ? ↓	% New Sessions ?	New Users ?	Bounce Rate ?	
	49,701 % of Total: 100.00% (49,701)	57.21% Avg for View: 57.06% (0.26%)	28,432 % of Total: 100.26% (28,359)	55.60% Avg for View: 55.60% (0.00%)	
1. Singapore	32,833 (66.06%)	49.84%	16,365 (57.58%)	56.39%	
2. India	7,147 (14.38%)	60.08%	4,294 (15.10%)	49.90%	
3. China	3,651 (7.35%)	90.93%	3,320 (11.68%)	49.82%	
4. Multed States	1,344 (2.70%)	77.31%	1,039 (3.65%)	58.93%	
5. 🐸 Malaysia	446 (0.90%)	73.09%	326 (1.15%)	67.49%	
6. III Hong Kong	370 (0.74%)	66.76%	247 (0.87%)	51.08%	
7. Indonesia	316 (0.64%)	64.87%	205 (0.72%)	57.91%	
8. III Taiwan	247 (0.50%)	79.35%	196 (0.69%)	67.21%	
9. (not set)	247 (0.50%)	61.54%	152 (0.53%)	57.49%	
0. Myanmar (Burma)	246 (0.49%)	52.03%	128 (0.45%)	40.65%	



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#### **User Location Drill-down**

• GA allows drill down to the state-level, e.g. clicking on India yields:



Region ?	Acquisition	Acquisition			
Region	Sessions ? ↓	% New Sessions	New Users ?	Bounce Rate ?	
	<b>7,147</b> % of Total: 14.38% (49,701)	60.08% Avg for View: 57.08% (5.30%)	4,294 % of Total: 15.14% (28,359)	49.90% Avg for View: 55.80% (-10.28%)	
1. Maharashtra	1,751 (24.50%)	59.91%	1,049 (24.43%)	60.37%	
2. Tamil Nadu	1,583 (22.15%)	55.02%	871 (20.28%)	44.54%	
3. Karnataka	1,266 (17.71%)	60.19%	762 (17.75%)	49.76%	
4. Delhi	809 (11.32%)	68.36%	553 (12.88%)	46.72%	
5. Telangana	513 (7.18%)	60.62%	311 (7.24%)	44.05%	
6. Uttar Pradesh	273 (3.82%)	53.85%	147 (3.42%)	41.03%	
7. Kerala	194 (2.71%)	49.48%	96 (2.24%)	37.11%	
8. Haryana	142 (1.99%)	57.04%	81 (1.89%)	48.59%	
9. Gujarat	133 (1.86%)	57.89%	77 (1.79%)	47.37%	
10. West Bengal	132 (1.85%)	62.12%	82 (1.91%)	51.52%	



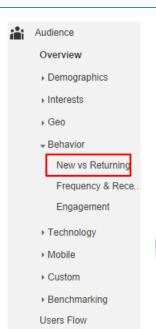


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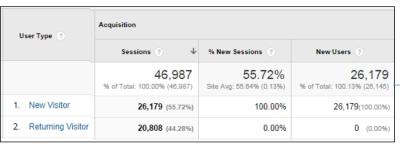
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# **New versus Returning Users**



• The best ratio is business goal specific. E.g. online newspaper versus (say) online funeral services!

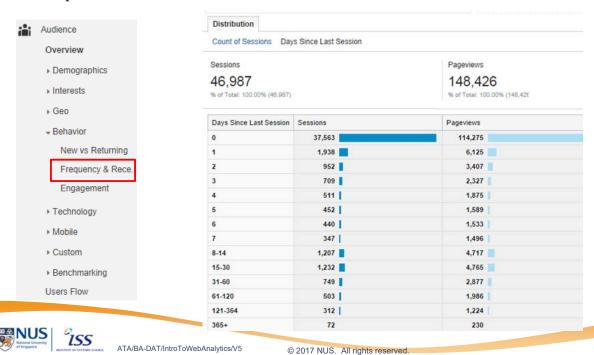


	Behavior		Conversions Goal 1: Registration •	
>	Bounce Rate ? Pages / Session ? Avg. Session Duration ?			Registration (Goal 1 Conversion Rate) ?
	53.98% Site Avg: 53.98% (0.00%)	3.16 Site Avg: 3.16 (0.00%)	00:03:14 Site Avg: 00:03:14 (0.00%)	0.00% Site Avg: 0.00% (0.00%)
	54.89%	2.76	00:02:18	0.00%
	52.83%	3.66	00:04:25	0.00%



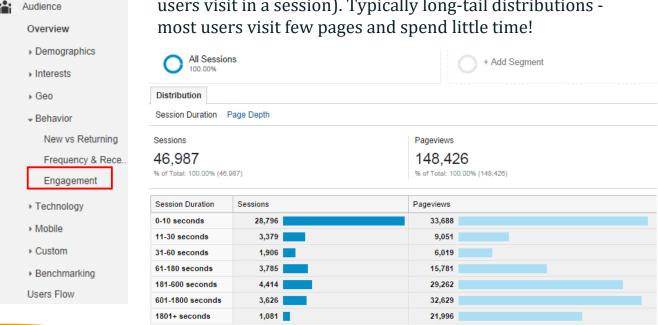
### **Recency & Frequency**

- Histograms of #visits per user and #days since last session
- Expectations should be in line with website business domain



# **Engagement**

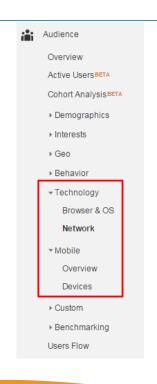
Average Visit Duration & Page Depth (number of pages users visit in a session). Typically long-tail distributions most users visit few pages and spend little time!





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# **Technology & Mobile**



- Technology Browser & OS
  - Use this to determine which browsers and O/S to optimise your website for
- Mobile
  - Counts users using a phone or tablet

	ervice Provider	Acquisition
	ervice i rovider	Sessions ? ↓
		49,701 % of Total: 100.00% (49,701)
1.	singnet pte Itd	5,698 (11.46%)
2.	imported inetnum object for nus-1	4,161 (8.37%)
3.	singapore telecom mobile pte ltd	2,573 (5.18%)
4.	m1 ltd	1,893 (3.81%)
5.	starhub cable vision ltd	1,835 (3.69%)
6.	starhub mobile	1,766 (3.55%)
7.	(not set)	1,487 (2.99%)
8.	starhub-ltd-ngnbn-services	1,287 (2.59%)
9.	imported inetnum object for ida singapore	1,173 (2.36%)
10.	m1 connect pte ltd	850 (1.71%)

Device Category ?	Acquisition
Device Category	Sessions 🔻 🔱
	49,701 % of Total: 100.00% (49,701)
1. desktop	34,580 (69.58%)
2. mobile	13,130 (26.42%)
3. tablet	1,991 (4.01%)



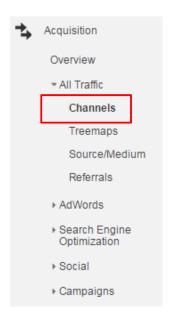


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# Where did your Audience come from?



- Search Engine
  - they did a search and found your website (paid or organic)
- Referral
  - they clicked on a link in another website
- Direct traffic
  - they typed in your URL directly or had it bookmarked
- Advertising
  - they clicked on your display ad or arrived via social media



### **Traffic Analysis Goals**

- Which traffic source yields the most traffic?
- Which traffic source yields the most profitable traffic?
  - Overlay with conversion rates, engagement rates, return rates, bounce rates ....
- Optimise the website to increase (profitable) traffic SEO

Default Channel Grouping	Acquisition			Behavior		
	Sessions ? ↓		New Users ?	Bounce Rate ?	Pages / Session ?	Avg. Session Duration ?
	45,957 % of Total: 100.00% (45,957)	<b>56.30%</b> Site Avg: 56.23% (0.12%)	25,872 % of Total: 100.12% (25,842)	<b>54.40%</b> Site Avg: 54.40% (0.00%)	3.12 Site Avg: 3.12 (0.00%)	00:03:10 Site Avg: 00:03:10 (0.00%)
Organic Search	20,331 (44.24%)	51.24%	10,418 (40.27%)	52.27%	3.51	00:03:42
2. Direct	<b>11,581</b> (25.20%)	50.99%	5,905 (22.82%)	64.20%	2.72	00:03:03
3. Referral	<b>11,247</b> (24.47%)	77.91%	8,762 (33.87%)	47.21%	2.63	00:01:51
4. Email	<b>1,463</b> (3.18%)	27.68%	405 (1.57%)	60.83%	3.88	00:04:55
5. Social	668 (1.45%)	54.19%	362 (1.40%)	74.10%	2.13	00:01:48
6. (Other)	666 (1.45%)	3.00%	20 (0.08%)	36.19%	5.51	00:08:25
7. Display	1 (0.00%)	0.00%	0 (0.00%)	0.00%	7.00	00:14:35

#### Channels





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### **Traffic Analysis Drill-Down**

- Click on "Organic search" to see the top keywords that led people to your website
  - The top keywords indicate the topics users are most interested in ensure these get covered adequately in your site
  - What keywords yielded less traffic than expected? This could indicate that the website doesn't have enough content in this area (not getting indexed by Google)

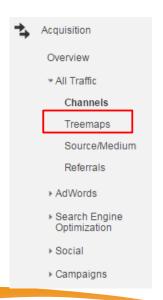
	Acquisition			Behavior			Conversions Go	al 1: Registration	-	
Keyword 🦿	Sessions ? ↓	% New Sessions	New Users 🦪	Bounce Rate	Pages / Session	Avg. Session Duration ?	Registration (Goal 1 Conversion Rate)	Registration (Goal 1 Completions)	Registration (Goal 1 Value)	
	23,462 % of Total: 47.58% (49,311)	50.19% Avg for View: 57.50% (-12.72%)	11,775 % of Total: 41.53% (28,355)	50.20% Avg for View: 58.21% (-10.69%)	3.53 Avg for View: 2.94 (20.20%)	00:03:58 Avg for View: 00:03:03 (29,76%)	0.00% Avg for View: 0.00% (0.00%)	0 % of Total: 0.00% (0)	\$0.00 % of Total: 0.00% (\$0.00)	
1. (not provided)	22,125 (94.30%)	50.32%	11,134 (94.56%)	50.28%	3.55	00:03:59	0.00%	0 (0.00%)	\$0.00 (0.00%)	
2. nus iss	133 (0.57%)	28.57%	38 (0.32%)	21.80%	4.76	00:04:53	0.00%	0 (0.00%)	\$0.00 (0.00%)	
3. iss nus	73 (0.31%)	27.40%	20 (0.17%)	36.99%	5.21	00:05:19	0.00%	0 (0.00%)	\$0.00 (0.00%)	
4. (not set)	37 (0.16%)	35.14%	13 (0.11%)	40.54%	2.84	00:03:23	0.00%	N4		
5. iss.nus.edu.sg	29 (0.12%)	6.90%	2 (0.02%)	20.69%	3.76	00:02:28	0.00%		e analysis	can be
6. institute of systems science	17 (0.07%)	47.06%	8 (0.07%)	23.53%	6.18	00:07:28	0.00%		ormed by nloading t	he row
7. iss nus singapore	17 (0.07%)	5.88%	1 (0.01%)	35.29%	2.65	00:02:27	0.00%		•	
8. www.iss.nus.edu.sg	15 (0.06%)	26.67%	4 (0.03%)	33.33%	4.47	00:04:49	0.00%	data into (say) Excel		
<ol> <li>project management course singapore</li> </ol>	14 (0.06%)	57.14%	8 (0.07%)	78.57%	2.00	00:01:18	0.00%	0 (0.00%)	\$0.00 (0.00%)	
cissp singapore	9 (0.04%)	66.67%	6 (0.05%)	55.56%	4.44	00:03:35	0.00%	0 (0.00%)	\$0.00 (0.00%)	

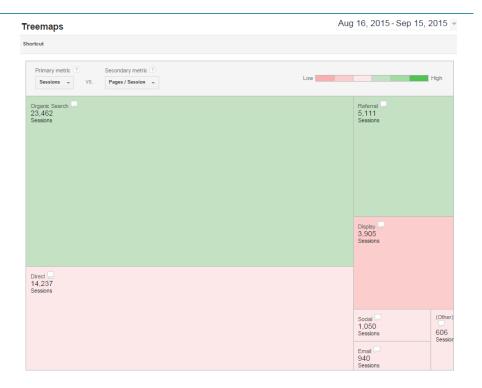


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# Traffic Analysis: TreeMap

You can view any of the summary numbers as a tree map









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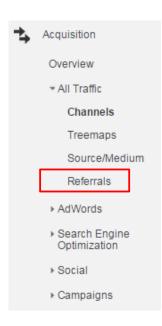
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# **Traffic Analysis: Source/Medium**

	Acquisition			Behavior			Conversions Goal 1:	Registration =	
Source / Medium 🕜	Sessions ? $\Psi$	% New Sessions	New Users ?	Bounce Rate	Pages / Session	Avg. Session Duration ?	Registration (Goal 1 Conversion Rate)	Registration (Goal 1 Completions)	Registration (Goal 1 Value)
	49,311 % of Total: 100.00% (49,311)	57.64% Avg for View: 57.50% (0.25%)	28,425 % of Total: 100.25% (28,355)	56.21% Avg for View: 56.21% (0.00%)	2.94 Avg for View: 2.94 (0.00%)	00:03:03 Avg for View: 00:03:03 (0.00%)	0.00% Avg for View: 0.00% (0.00%)	0 % of Total: 0.00% (0)	\$0.00 % of Total: 0.00% (\$0.00)
1. google / organic	22,525 (45.68%)	50.46%	11,367 (39.99%)	50.44%	3.52	00:03:58	0.00%	0 (0.00%)	\$0.00 (0.00%)
2. (direct) / (none)	14,237 (28.87%)	61.35%	8,735 (30.73%)	69.23%	2.21	00:02:14	0.00%	0 (0.00%)	\$0.00 (0.00%)
3. Gter / banner	3,620 (7.34%)	99.56%	3,604 (12.68%)	54.67%	1.76	00:00:09	0.00%	0 (0.00%)	\$0.00 (0.00%)
4. nus.edu.sg / referral	2,520 (5.11%)	51.51%	1,298 (4.57%)	35.40%	4.05	00:04:41	0.00%	0 (0.00%)	\$0.00 (0.00%)
5. thehindu.com/referral	619 (1.26%)	91.11%	564 (1.98%)	65.91%	1.90	00:01:25	0.00%	0 (0.00%)	\$0.00 (0.00%)
6. bing / organic	497 (1.01%)	40.24%	200 (0.70%)	40.44%	4.12	00:04:13	0.00%	0 (0.00%)	\$0.00 (0.00%)
7. m.facebook.com/referral	421 (0.85%)	73.16%	308 (1.08%)	70.31%	1.92	00:01:17	0.00%	0 (0.00%)	\$0.00 (0.00%)
8. AIS-practice-emailer / email	396 (0.80%)	44.70%	177 (0.62%)	71.97%	2.14	00:01:48	0.00%	0 (0.00%)	\$0.00 (0.00%)
9. facebook.com / referral	376 (0.76%)	31.38%	118 (0.42%)	51.33%	2.74	00:03:41	0.00%	0 (0.00%)	\$0.00 (0.00%)
10. yahoo / organic	360 (0.73%)	49.44%	178 (0.63%)	50.83%	3.77	00:04:04	0.00%	0 (0.00%)	\$0.00 (0.00%)



#### **Referral Websites**



- Which websites refer most traffic to you & which websites refer users with the highest conversion rates?
  - This can give insights into the interests of your most valuable users (where else do they visit?)
- Do the referral sites send users to different landing pages?
- Are the referral sites those that you think your users will visit?
  - E.g. your website sells cameras but most referrals are from heath-food websites!
  - If not then how to get referrals in relevant sites?



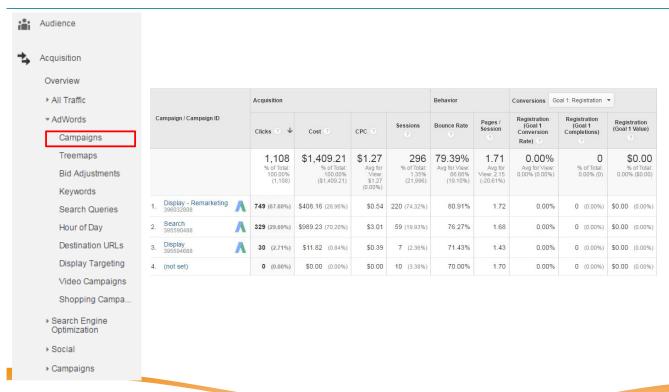


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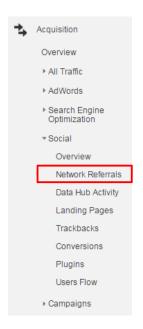
### **AdWord Marketing Campaign Analysis**





#### **Social Traffic**

Identify where to increase your social effort





National University of Singapore

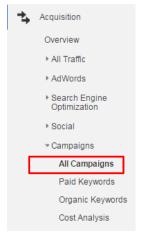


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# **Monitoring Traffic from Custom Campaigns**



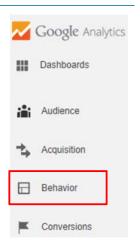
	ampaign ?	Acquisition			Behavior	
	ampargii	Sessions 7 4	% New Sessions 7	New Users 🔞	Bounce Rate ?	Pages / Session
		5,483 % of Total: 11.12% (49,311)	79.04% Avg for View: 57.50% (37.46%)	4,334 % of Total: 15,28% (28,355)	57.96% Avg for View: 58.21% (3.11%)	Avg for \
1.	Gter GDipSA banner	3,620 (66.02%)	99.56%	3,604 (83.16%)	54.67%	
2.	ISSLearningDay2015	345 (6.29%)	17.68%	61 (1.41%)	60.58%	
3.	aSpecialmedia GDipSA banner	265 (4.83%)	91.32%	242 (5.58%)	61.89%	
4.	BM-SepOct2015	216 (3.94%)	59.72%	129 (2.98%)	83.33%	
5.	SysCat9	97 (1.77%)	0.00%	0 (0.00%)	39.18%	
6.	AIS-emailer	86 (1.57%)	51.16%	44 (1.02%)	58.14%	
7.	AIS-emailer-SA	83 (1.51%)	50.60%	42 (0.97%)	84.34%	
8.	150813_PM_emailer	70 (1.28%)	25.71%	18 (0.42%)	68.57%	
9.	AIS-emailer-SFB	61 (1.11%)	36.07%	22 (0.51%)	77.05%	
0.	AIS-emailer-CA	59 (1.08%)	32.20%	19 (0.44%)	74.58%	

To monitor traffic from a custom campaign you must add campaign parameters to the referring URL (e.g. the URL link to your website in an email or the URL link in a banner ad)



#### Audience Behavior: How do visitors use the site?

- Where do users go on the website, how long do they stay?
  - Are the pages you think important the ones most visited?
- Which pages get most & least traffic?
  - Is low traffic because users can't find the page OR page is no value?
  - Is high traffic because page is useful OR page easy to find (many links)?
- What pages do users use to enter & exit the site?
  - If the ratio of entrances to unique page-views for a page is high then the page is a landing page => needs welcome info & navigation aids
- Which Pages have high Bounce & Exit Rates and why?
  - High Bounce or Exit rate does not always imply bad page design
    - Page could do its job well, e.g. product page (high bounce), checkout page (high exits)
    - Page might be indexed by search engine inappropriately or referenced incorrectly from anther website => users with no interest may arrive





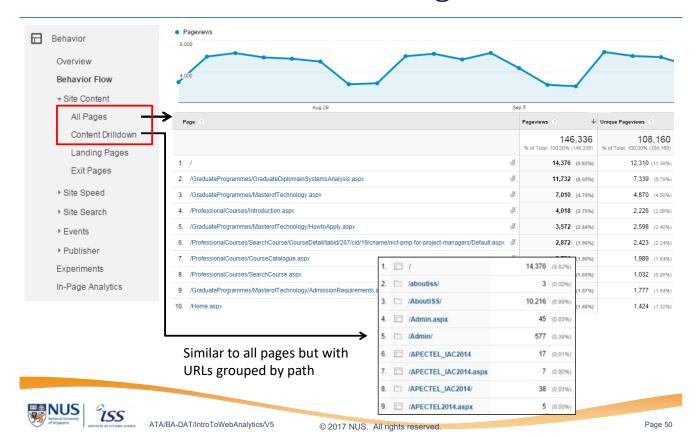


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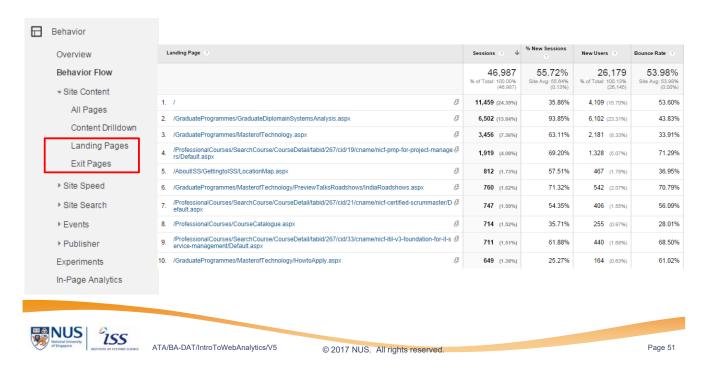
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#### **Audience Behavior: What Pages are Viewed?**



### **Landing and Exit Pages**

 High bounce rate is not always bad if the user gets what they are looking for first time!



# **Behavior Flow: Click Path Analysis**

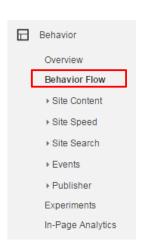
What are the common routes thro the website?



#### **Users Flow**



# **Click Path Analysis**



- What routes do users take through your website?
- Are there typical paths associated with different visitor segments?
- Is there an identifiable path from page type to page type?
  - May be easier to detect patterns looking only at page categories (will cover in workshop)
- Identifying click-patterns is also useful for
  - Ad Promotion
  - Fraud Detection
- BUT first we need to sessionise the page views



#### **Sessionisation**

- Determining the sequence of webpages that were visited by the same person during a single visit
  - "Visit" is a conceptual term referring to a continuous period of interaction with the
    website. E.g. I may be logged into Gmail all day but actually only interact with it once in
    the morning and once in the afternoon (e.g. after lunch) two sessions conceptually

#### Issues:

- (1) finding all pages viewed by a single user ~ typically use cookies, unless logged-in
- (2) finding those pages viewed in a single visit ~ typically use heuristics
  - E.g. The time spent on a page cannot exceed 30mins (time-out threshold)
  - E.g. The total session duration may not exceed a fixed threshold
  - E.g. All page-views (except the first) must be referred from another page in same session (referrer based heuristics, h-ref)
- Usually a "big data" task => Map-Reduce frequently used
- Personalised Sessionisation: E.g. Compute the average time a user spends on each page on the website and set the page time-out threshold according to this





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### **Sessionisation: Examples**

User 1

Time	IP	URL	Ref
0:01	1.2.3.4	A	14
0:09	1.2.3.4	В	Α
0:19	0:19 1.2.3.4		Α
0:25	1.2.3.4	E	С
1:15	1.2.3.4	Α	
1:26	1.2.3.4	F	С
1:30	1.2.3.4	В	Α
1:36	1.2.3.4	D	В

	0:01	1.2.3.4	A	-
Coming 4	0:09	1.2.3.4	В	Α
Session 1	0:19	1.2.3.4	С	Α
	0:25	1.2.3.4	E	С

1	1:15	1.2,3.4	A	-
Session 2	1:26	1.2.3.4	F	С
Session 2	1:30	1.2.3.4	В	Α
	1:36	1.2.3.4	D	В

Sessionisation using Time-Based Heuristic

Time	IP	URL	Ref
0:01	1.2.3.4	A	
0:09	1.2.3.4	В	Α
0:19	1.2.3.4	С	Α
0:25	1.2.3.4	E	C
1:15	1.2.3.4	A	
1:26	1.2.3.4	F	С
1:30	1.2.3.4	В	Α
1:36	1.2.3.4	D	В
	0:01 0:09 0:19 0:25 1:15 1:26 1:30	0:01 1.2.3.4 0:09 1.2.3.4 0:19 1.2.3.4 0:25 1.2.3.4 1:15 1.2.3.4 1:26 1.2.3.4 1:30 1.2.3.4	0:01 1.2.3.4 A 0:09 1.2.3.4 B 0:19 1.2.3.4 C 0:25 1.2.3.4 E 1:15 1.2.3.4 A 1:26 1.2.3.4 F 1:30 1.2.3.4 B

	0:01	1.2.3.4	Α	-
0	0:09	1.2.3.4	В	Α
Session 1	0:19	1.2.3.4	C	Α
	0:25	1.2.3.4	E	C
	1:26	1.2.3.4	F	С
	1:15	1.2.3.4	A	-
	1:30	1.2.3.4	В	A

1.2.3.4

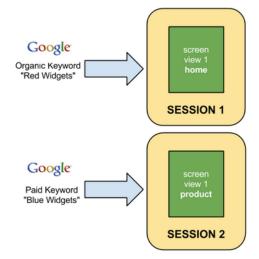
Sessionisation using h-ref heuristic



Use

### **Sessionisation in Google Analytics**

- There are two methods by which a session ends:
- Time-based expiry
  - After 30 minutes of inactivity
  - At midnight
- Campaign change:
  - A campaign is what drove you to the website ~ a search engine, referring website, or campaign tagged URL (but not direct traffic)
  - If a user arrives via one campaign, leaves, and then comes back via a different campaign then this counts as a new session



E.g. even if the time between two page-views on a website is small the session will change if the refer was outside of the site (e.g. you did a second search)





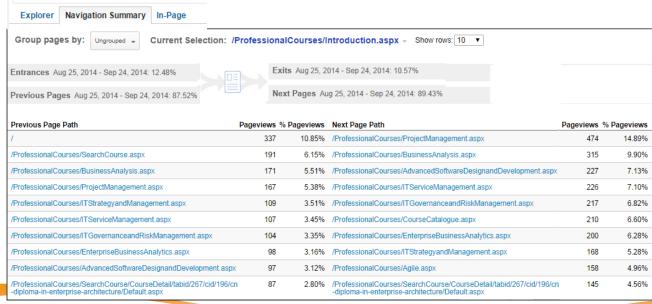
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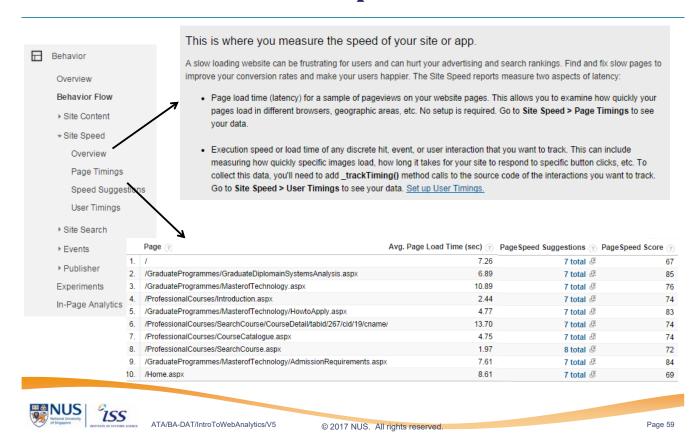
#### **Click-Path Analysis: Navigation Summary**

- Behavior->Site Content->All pages-> Navigation Summary (tab)
- Select a page and see what pages users visited before and after

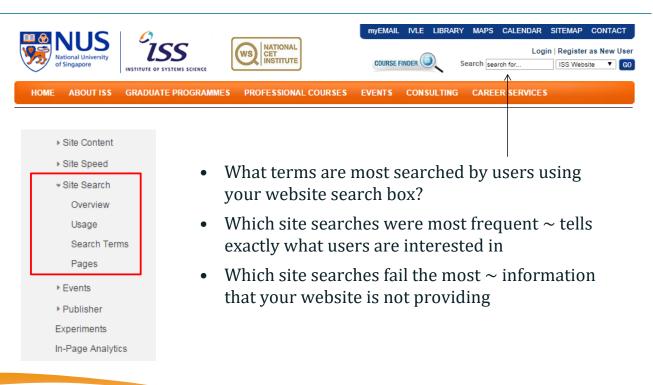




#### **Site Speed**

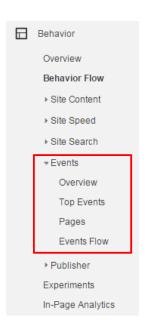


# **Site Search Analysis**





#### Within-Page Behavior: Events



- Shows how people use interactive elements in your site/app. For example, many websites contain video players, games, and other interactive experiences.
- Simply tracking page views doesn't allow you to capture these kind of interactions. When a user interacts with a video player, no page view is generated.
- Other examples of interactions that don't generate page views are Ajax-based activities, file downloads, and clicks on links that take the user to another site.
- Tracking detailed events may require more tracking code to be added to the website



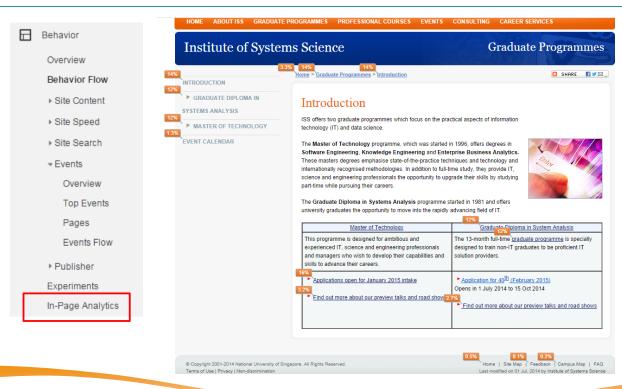


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# Within-Page Behavior: Clicks





# Click Analytics Tools: E.g. Clicktale.com

Session Playback

Visitor Recordings

Real Time Monitor

Data-Rich Heatmaps

Mouse Move

Mouse Click

Attention

Scroll Reach

Link Analytics

Conversion Tools

Conversion Funnels

Form Analytics

Page Console

Advanced Filtering

**Custom Alerts** 

Dashboard

Page Reports

Example mouse move heat map







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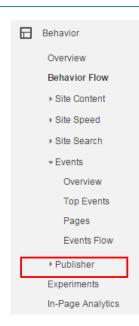
#### Clicktale.com

#### Example attention heat map





#### **Publisher**



#### Link AdSense or Ad Exchange to your Analytics property.

#### Get started

Linking your AdSense or Ad Exchange and Google Analytics properties gives you access to metrics such as impressions, clicks, and revenue which you can add to your favorite analytics reports to get a better understanding of how well your pages or content is monetizing. Once you've linked your properties, you can use insights from Analytics to refine and optimize your AdSense or Ad Exchange ad units, improving the overall performance of your business.

Linking properties requires a user who has Edit permission on the Analytics property and Administrator access on the Adsense or Ad Exchange account. Learn more abount linking AdSense or Ad Exchange





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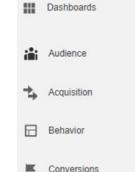
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### On-Site Web Analytics: Main Objectives

- How popular is your website how much traffic?
  - Basic site usage & traffic metrics. GOAL = Monitor website health
- What types of people visit your website?
  - Demographics & interests, GOAL = Reach the right people
- How did they get to (find) your website?
  - Search engine, referral, directly etc... GOAL = Increase traffic
- What do they do on your site?
  - How long do they stay? Most/least popular pages? Is it easy to use?...
  - GOAL = Ensure the website meets their needs
- Does your website achieve its business goal(s)?



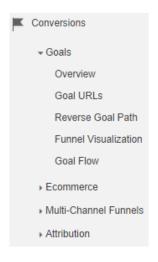
- Measure Conversions etc.
- GOAL = Ensure the website meets your needs



Google Analytics



# **Setting Website Goals**



- What is your website for? What is its business/other goal?
- What do you want users to do when they visit?
- Distinguish the user's goals from the website goals
- Typical website goals (aka conversions)
  - E.g. make an on-line purchase, signup for newsletter, complete a survey, download a pdf file, view a video, download a coupon, get driving directions etc.
- What can be measured?
  - Reaching a page
  - Interacting with a page (watching a movie, using a widget, downloading a file etc.)
  - Remaining on the website for X minutes or visiting Y pages
  - Goal Conversion Rate ~ Percentage of users visiting the site that convert





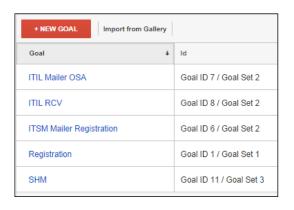
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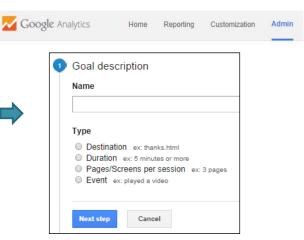
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### **Defining Goals in Google Analytics**

Create goals using the Admin tab

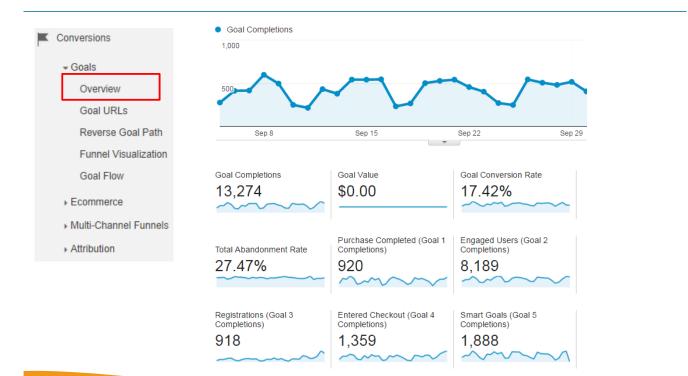




- Ecommerce Tracking Goals
  - Transaction data: product name, SKU, category, price, quantity, tax, shipping
  - Requires more JavaScript tracking code
  - Should be tracking this anyway, but adding to GA enables tie in with website stats



# **Goal Reports in Google Analytics**







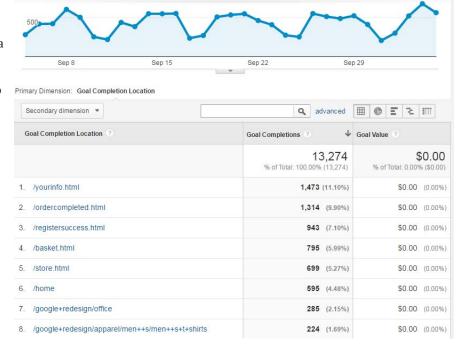
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### Goal URL's Report

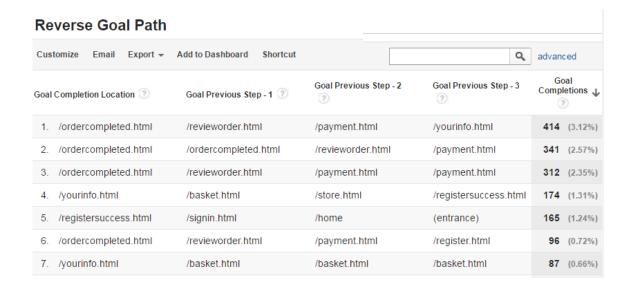
Useful if a goal can be achieved from many different pages, e.g. set a goal as "whitepaper download" but have multiple whitepapers to download each from different pages in the website





#### **Reverse Goal Path**

- Show the 3 pages prior to the goal page
- What pages did a user complete a goal on + the 3 pages prior to this







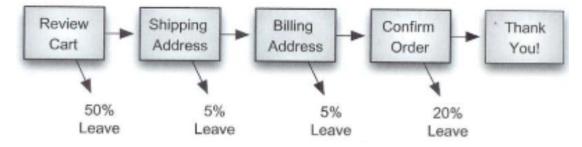
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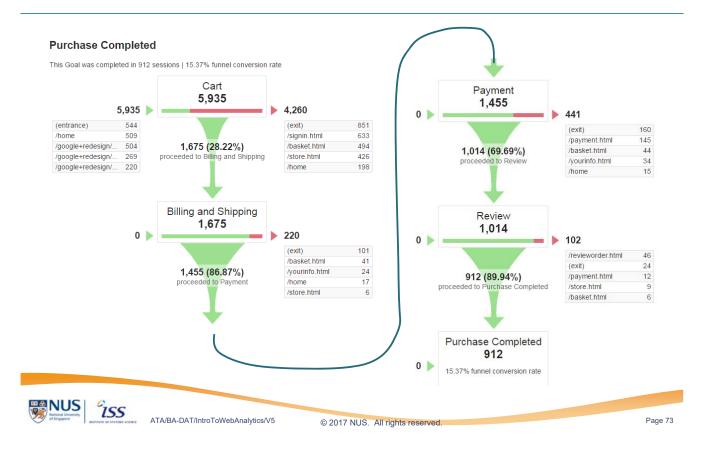
### **Funnel Visualisation Report**

- Useful when the goal involves a sequence of page visits
- See how many people enter & complete, also how many quit before the end or enter from another (side) route

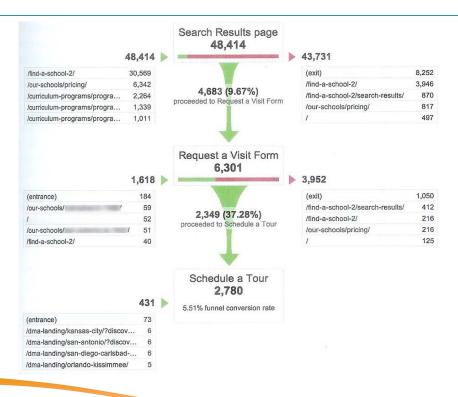




# **Funnel Visualisation Report**



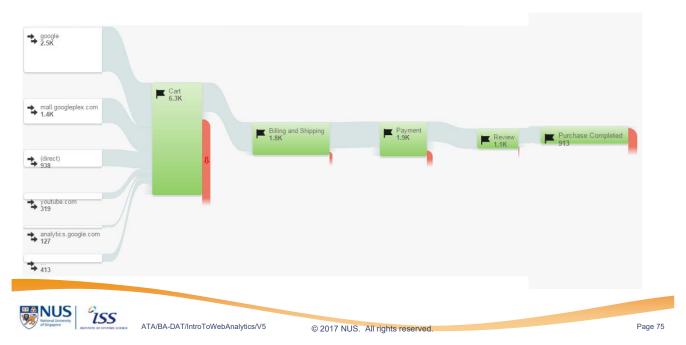
# **Funnel Visualisation - Another Example**





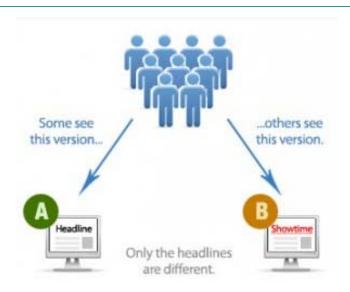
#### **Goal Flow**

• The Goal Flow report is an interactive graphic that visualizes the path users traveled through a funnel towards a Goal. This report can help you see how people are navigating and complete a Goal



# **Experiments: A/B Testing**

- You want to test a new design for a page – how to proceed?
- Create the new page (call it B), show it to some of the visitors to the website instead of the original page (call this A)
- After a while see which page (A or B) had more conversions (or other success measure)

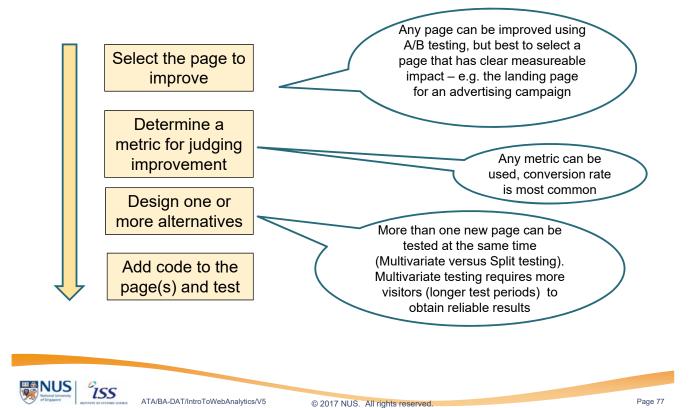


#### **Essentials**

- Each visitor is randomly assigned to a variation, either A or B.
- The visitor always sees either only A or only B (even for repeat visits)
- Record which variation this visitor saw.



#### **Designing an A/B Test**



# A/B Experimental Design Questions

- What split? (what percentage of users should see A versus B)?
  - Normally. A = 50%, B = 50%
- How Long to Run?
  - Depends on complexity of test (number of pages being tested) and website traffic.
  - Ideally until any significant difference is observed, but clearly if there is no difference then need a cut-off time limit. You need to estimate your website traffic in advance to set a test completion date or else run until sufficient visitors have been logged.
  - A good rule of thumb for simple split test is at least 5000 visitors to the website\*
  - For Multivariate testing a good rule of thumb is to add 2000 visitors per day for a one month test for every additional page being tested. Hence a 4-way test would require about 8000 daily visitors over a month to complete\*

See Practical Web Analytics for User Experience, Michael Beasley, Morgan Kaufman

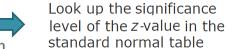


### **Testing Significance**

Most methods use the z-score, students t-test or welches t-test

$$z = \frac{\overline{x} - \Delta}{\frac{\sigma}{\sqrt{n}}}$$

 $\bar{x}$  is the sample mean.  $\Delta$  is a value to be tested,  $\sigma$  is the population standard deviation n is the size of the sample



• E.g.

$$ZScore = \frac{p_{variationB} - p_{variationA}}{\sqrt{SE_{variationA}^2 + SE_{variationB}^2}} \qquad SE =$$

$$SE = \sqrt{\frac{p(1-p)}{sampleSize}}$$

Where P ~conversion rate

E.g. see https://developer.amazon.com/sdk/ab-testing/reference/ab-math.html





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# **Testing Significance: An Example**

- Original page (A): 200,000 unique visitors with 10,000 converting
- Test page (B): 100,000 unique visitors tested with 4000 converting
- Lift of A over B  $\sim 25\%$

- If A had only 8,100 visitors converting => conversion rate of 4.05%
- Lift of A over test B = (4.05 \*100)/ 4.00 = 1.25%

Group A is a clear winner (99.9%\*)

Group A: 5% conversion
Group B: 4% conversion

	Visitors:	Goals:
Group A:	200000	10000
Group B:	100000	4000

Calculate

Sorry, you have no clear winner
We estimate that you'll need 1583527 more visitors\*

Group A: 4.05% conversion
Group B: 4% conversion

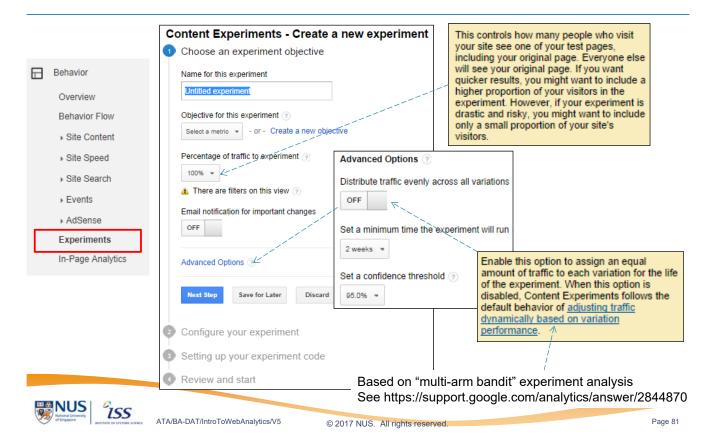
	Visitors:	Goals:
Group A:	200000	8100
Group B:	100000	4000

Calculate

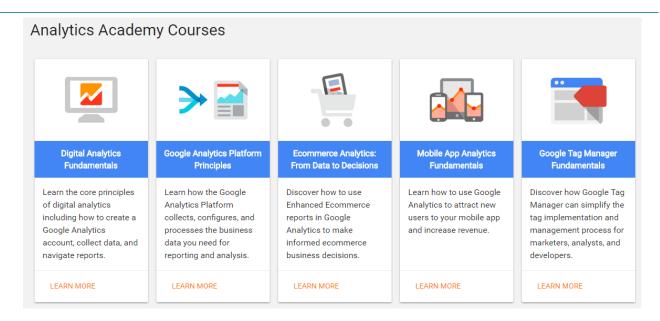
See http://www.usereffect.com/split-test-calculator



### A/B Testing in Google Analytics



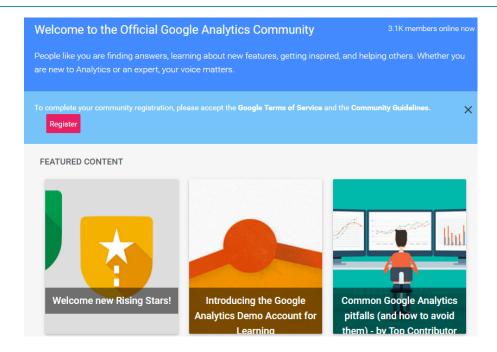
### **Google Analytics Academy**



https://analyticsacademy.withgoogle.com/



# **Google Analytics Community**



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